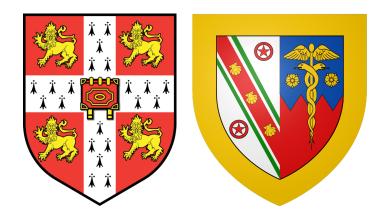
Niobium microalloyed rail steels



Arunim Ray Darwin College

Department of Materials Science and Metallurgy University of Cambridge

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Abstract

Rail steels rely primarily on possessing adequate wear and rolling contact fatigue resistance. These properties, together with the toughness, can in principle be optimized by implementing thermomechanical processing assisted by controlled niobium additions. The purpose of the current work is to develop a Nb-microalloying strategy in the context of high-carbon pearlitic and cementite-free bainitic steels. The conventional methods do not leave the critical regions of a rail section in a suitably processed state. An attempt has been made for the first time, to create a pancaked austenite grain structure, with an examination of the consequences on the final product. One of the major difficulties is to ensure that niobium does not segregate during manufacturing, since niobium is a strong carbide former and rail steels traditionally contain large carbon concentrations. Niobium solubility in austenite has been assessed critically and thermodynamic calculations for microsegregation have been taken into account. The aim is to ensure that any primary niobium carbide precipitated from solute-enriched liquid during non-equilibrium solidification, can be taken into solution in austenite during reheating, to mitigate potential effects of coarse precipitates on the final mechanical properties.

Rail steels containing 0.01-0.02 wt% Nb have been designed and characterised. In as-cast condition, primary niobium carbides as large as $\sim 10 \,\mu\text{m}$ can be observed, which dissolve slowly during reheating. An attempt has been made to develop a model to estimate the dissolution kinetics of the carbides. Dissolved niobium in reheated austenite precipitates during hot deformation as fine niobium carbides (<50 nm) which inhibit austenite recrystallisation by pinning the austenite grain boundaries. Nb-microalloying increases the 'no-recrystallisation temperature' of deformed austenite during multi-pass compression tests. The topology of grain deformation has been analysed in terms of stereological calculations and dilatometric experiments have shown that transformation kinetics tend to accelerate when the austenite is deformed below the no-recrystallisation temperature, however the effect is relatively small.

The microstructure and mechanical properties of the as-rolled Nb-microalloyed steels have been characterised along with their rolling-sliding wear performance and compared with their non-microalloyed counterparts. Increased austenite grain boundary area and increased dislocation activity due to pancaking, hinder bainite growth which leads to an increased retained austenite volume fraction. This in turn, leads to slightly improved ductility, improved toughness and improved wear resistance in Nb-microalloyed bainitic alloys. Microstructural refinement in Nbmicroalloyed pearlitic alloys does not have any significant effect on tensile and toughness properties, but wear resistance improves significantly. A Bayesian neural network model has been developed to estimate the wear of rails. Predicted trends have been found consistent with metallurgical experience and the perceived noise levels are consistent with reasonable repeatability of the wear testing method used. The model can be applied widely to estimate wear because of its capacity to indicate uncertainty, including both the perceived level of noise in the output, and an uncertainty associated with fitting the function in the local region of input space.

Declaration

This dissertation is submitted for the degree of Doctor of Philosophy at the University of Cambridge. The research reported was conducted under the supervision of Professor H. K. D. H. Bhadeshia in the Department of Materials Science and Metallurgy, University of Cambridge, between January 2014 and December, 2016.

The is my own work and contains nothing that is the outcome of work done in collaboration with others, except where specifically indicated in the text. Neither this, nor any substantially similar work has been or is being submitted for any degree or diploma or other qualification at any other university or institution. The dissertation does not exceed the prescribed limit of 60,000 words.

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Chapter 1

Introduction

There are several criteria which determine the suitability of a steel for rail track applications, the most important being wear and rolling contact fatigue resistance. Over the decades, the majority of research on rail steels has focused on improving the wear performance, resulting in a dramatic reduction in the rate of material loss. The cleanliness of the steels with respect to non-metallic inclusions has also been improved over the years, leading to a reasonable improvement in the rolling contact fatigue resistance. In addition to the wear and fatigue properties, the track material must also be capable of being manufactured into long rails with a high standard of straightness and flatness and must be weldable at the same time [1].

The structural integrity of rail steels can be compromised by localised plasticity during service. Resistance to brittle fracture as defined by the toughness of the steel is another prime property requirement for rail steels. Ordinary rail steels contain about high carbon (0.6-0.8 wt%) contents and are pearlitic. Pearlite consists of a mixture of soft ferrite and a hard, relatively brittle iron carbide called cementite. The common way to increase the wear resistance of a pearlitic steel grade is to reduce the interlamellar spacing in the pearlite colonies, which hardens and strengthens the steel. It is well-known that an individual pearlite colony is an inter-penetrating bicrystal of cementite and ferrite [2,3]. Therefore, the crystallographic grain size, an aspect which determines toughness [1], is not necessarily refined by reducing the interlamellar spacing. It follows that pearlitic steels are hard but not particularly tough and therefore can be prone to brittle failure during service.

The pancaking of austenite grains ¹ pinned with microalloy precipitates such as

¹After hot deformation of austenite at temperatures below the no-recrystallisation temperature, the austenite remains as deformed and unrecrystallised grains, which are not equiaxed and elongated in shape of 'pancakes' in three dimensions.

niobium carbide or carbonitride, during the hot rolling of steel, is a well-established thermo-mechanical processing route in the context of high strength low alloy structural steels [4,5]. But this aspect has not been explored in the context of rail sections which also suffer from the fact that the deformation experienced in different regions of the rail is not uniform because of the asymmetrical cross-section of the rails. A controlled addition of microalloying elements like niobium may lead to a substantial refinement of the microstructure even for the regions that experience low degrees of deformation, such as the head of the rail, if the austenite recrystallisation can be retarded. Refined prior austenite grains would in turn lead to refined pearlite colonies, which may improve the toughness. This is of particular importance in geographical locations where maintenance is likely to be sporadic.

Alternative steel technologies to pearlite have also been developed involving bainitic steels which are free from cementite, and have outstanding rolling contact fatigue performance [1]. Bainite is a non-lamellar aggregate of cementites and plateshaped ferrite. Each ferrite plate is about 10 μ m long and about 0.2 μ m thick. The fine scale of the microstructure is beneficial to strength but coarse cementite particles can degrade the toughness. The precipitation of cementite during the bainite transformation can be suppressed by alloying with about 1.5 wt% of silicon, which has a very low solubility in cementite and greatly retards its growth, resulting in a microstructure consists of fine plates of bainitic ferrite separated by carbon-enriched regions of austenite free from cementites [1].

However, there is a huge market for improved rail steels to cope with reduced maintenance, heavier traffic and structural integrity. It is in this light that the present work is formulated, to address the toughness of both pearlitic and cementitefree bainitic rails with the aim of achieving a new technology based on niobium microalloying. The proposed research will focus on:

- development of a niobium microalloying strategy in the context of standard rail production methods, including the fact that deformation through the rail section will not be homogeneous;
- development of a viable thermo-mechanical processing route for niobium microalloyed rail steels;
- creation of a pancaked austenite grain structure, with an examination of the consequences on the final product;
- creation of a refined pearlitic structure and possibly one containing fine NbC precipitates;
- cover the totally new area of microalloying the cementite-free high-silicon

bainitic rails;

• development of a generic strategy for the use of niobium in high carbon steels.

The work begins with a description of the literature available on rail steel technologies. The evolution of rail steels to modern high strength and high wear resistant pearlitic steels and alternative cementite-free bainitic rail steels are described. The austenite grain structure in rail steels and the effect of niobium as an microalloying element in high carbon steels are also reviewed. The solubility of niobium in ternary Fe-Nb-C austenite is critically assessed to obtain accurate solubility information needed to address niobium segregation in high carbon steels. The effect of niobium on pearlitic and bainitic microstructures and mechanical properties are discussed. Calculations for micro-segregation are taken into account for optimizing the niobium content during alloy design so that niobium can be retained in solution during reheating in order to maximise precipitation during rolling² An attempt has been made to model the dissolution kinetics of niobium carbide precipitates in as-cast steels to optimize the reheating temperature and time. Hot deformation of austenite and dilatometric studies have been carried out to analyze the recrystallisation and transformation kinetics of the microalloyed compositions. Finally, the mechanical properties and wear performance were evaluated to study the effect of niobium.

 $^{^2 \}rm Continuously cast steels are cut into slabs that are then reheated to 1200-1300 <math display="inline">^{\rm o}\rm C$ for rolling into the appropriate shape.

Chapter 2

Literature review

2.1 Evolution of rail steels

The first construction of guided transport can be dated back to the ancient Babylonian empire where grooves on roads were used for wagons with the aim of minimizing the resistance to rolling [6]. The concept was re-discovered in the 17th century for mining transportation and eventually iron was established as the main load bearing surface used in the modern railway age. Initially, cast iron was used which is brittle and failures occurred frequently [7]. Steel rails became a practical choice and economically feasible by the second half of the 19th century when Henry Bessemer discovered the process for producing steel on an industrial scale in 1856. Ever since, all railway tracks have been made of steel, mostly pearlitic steel.

2.1.1 Pearlitic rail steels

The characteristic rail steel composition from the Bessemer era has been changed to the modern high-carbon pearlitic alloy as shown in Table 2.1 [8]. With the advent of open hearth and basic oxygen furnace processes, the concentration of impurities such as sulphur and phosphorus were reduced through longer refining times and the use of lime-based slag which allows a greater partitioning of the impurities into the slag from the liquid steel. Longer refining times also allowed individual ferroalloy additions to achieve an accurate rail composition, for example, the Mn and Si contents for strengthening purposes.

Year / Type of steelmaking	С	Mn	Si	Р	S
1890 / Bessemer Converter	0.58	1.33	0.08	0.074	0.072
2013 / Electric Furnace	0.84	1.00	0.40	0.010	0.008

Table 2.1: Evolution of rail steel composition (wt%) [8]

The carbon content is substantially increased to develop fully pearlitic microstructures or even hyper-eutectoid rail steels. 'Grade-700' rails were the main product for the early 20th century rail roads which contained 0.5 wt% C and had a microstructure of about 30% proeutectoid ferrite and 70% pearlite within the rail-head [9]. Due to the rather slow cooling of the rail-head after rolling, the pearlite was relatively coarse. To increase the hardness, and consequently the wear-resistance, 'Grade-900' rails were developed richer in carbon (0.7-0.8 wt%) to achieve a fully pearlitic microstructure. Welding techniques were developed to replace fishplate connections and 'Grade-900' became the standard material for main lines. 'Grade-900' had a coarse pearlitic microstructure with sufficient ductility and toughness for general applications. Nevertheless, on narrow curves, mountainous regions and for heavy-haul ore and coal transportation, strengths greater than that exhibited by 'Grade-900' rails were needed [9].

Further strengthening of pearlitic rails to 1100-1200 MPa tensile strength was accomplished by refining the interlamellar spacing of the ferrite and cementite in pearlite colonies. Based on the continuous cooling transformation (CCT) diagram of 'Grade-900' steel, two strategies were adopted for refining pearlite. First, as shown in Figure 2.1a, the hardenability was increased through additions of chromium and other alloving elements, so that on air cooling, the rail-head transformed into fine pearlite with a narrow interlamellar spacing [10]. This type was the high-strength and high wear-resistant alloy 'Grade-1100-1200', which cools in still air after rolling. The second way was to accelerate the cooling rate of the rail-head so that the austenite to pearlite transformation of 'Grade-900' can be suppressed to lower temperatures in order to generate fine pearlite ($\sim 90 \,\mathrm{nm}$) with 1100-1200 MPa tensile strength using the same steel composition, as shown in Figure 2.1b [11]. This is the head-hardened rail ('Grade-1100HH'). With the advent of the head-hardening processes, rail producers are now able to increase the hardness and strength of pearlitic rails well beyond that of the standard air-cooled rail while maintaining adequate ductility.

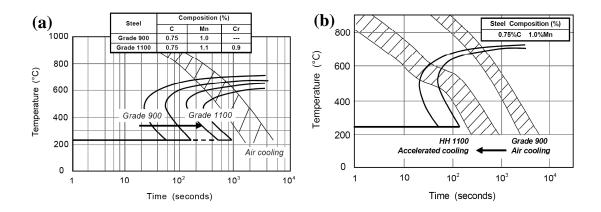


Figure 2.1: Continuous cooling transformation (CCT) diagrams showing the effect of different parameters on pearlite refinement (a) effect of alloying elements; (b) effect of cooling rate. Compositions are in wt%.[9]

However, other steels have been developed and used as well, albeit in small niche applications such as switches and crossings ³ where the stress states differ a great deal from those associated with straight track. Impact loads can become very high when wheels have to pass from one rail to another at switches and crossings. Austenitic steels with high-manganese contents such as the Hadfield steels, have properties better suited to handle repeated impacts. Martensitic steels are not used to a significant extent in railway tracks, but they have found niche applications as parts of crossings and switches [6]. Figure 2.2 and Table 2.2 list some typical microstructures and compositions of pearlitic, austenitic and martensitic rail steels.

 $^{^{3}}$ Rail switches and crossings guide trains from one track to another and enable lines to cross paths, thus creating multi-lined and multi-routed rail networks.

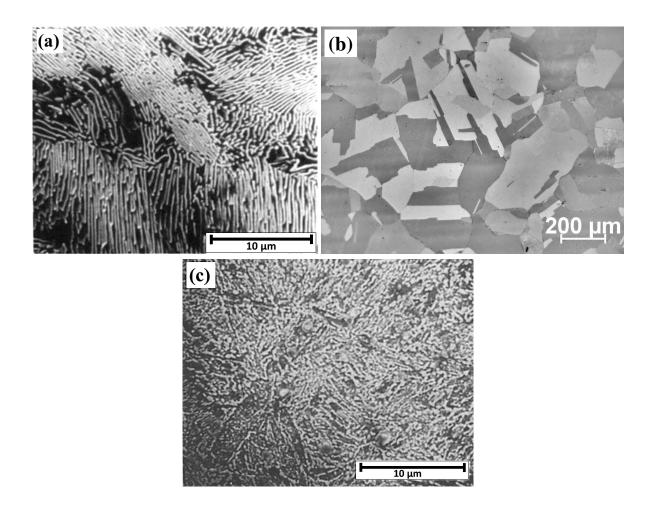


Figure 2.2: Typical rail steel microstructures: (a) pearlitic [12], (b) austenitic [6,13] and (c) martensitic [12]. Reproduced with permission from Elsevier.

2.1.2 Bainitic rail steels

The most successful alternatives to pearlife steels are carbide-free bainitic rails which have an excellent combination of wear-resistance and rolling-contact-fatigue properties [1]. The evolution of bainitic rails in terms of morphology, transformation characteristics and properties (e.g strength, ductility, wear and fatigue resistance, toughness, weldability) have been reviewed over time by several authors [1,14,15]. Early conventional bainitic steels contained carbides in a microstructure mixed of pearlite and bainite and showed inferior mechanical properties than pearlitic rails in terms of wear, rolling-contact-fatigue and toughness [16]. Some bainitic steels were developed with higher tensile and fatigue properties compared to pearlitic rails at same hardness, but subsequent service trials reported faster wear for bainitic rails and also welding related issues which were unspecified [1,17,18]. Further research on low-carbon bainitic grades showed similar trends with mixed microstructure being less wear-resistant than those that are fully pearlitic [19,20] though there were few encouraging results. Clayton et al. [21] reported comparable or superior wear-resistance (pin-ring wear test) of low-carbon bainitic steels compared to pearlitic steels of identical hardness (>300 VHN ⁴). Lower carbon concentrations contribute to better ductility, toughness and weldability [15]. Contradicting results were reported by Garnham [1] for carbide-free bainitic steels (0.04C-0.2Si-0.75Mn-2.0Ni-0.25Mo-2.8Cr / wt%, Table 2.2) which showed poor wear performance relative to pearlite during rolling-sliding wear, a scenario more representative of service conditions. More systematic wear studies by Devanathan and Clayton [22] suggested that low-carbon (0.07 wt%) bainitic steels with rapid work hardening and greater ductility, can outperform pearlitic rail steels at the same hardness levels. Whereas medium-carbon (0.10 wt%) bainitic steel had poor wear due to chemical segregation, leading to high-carbon martensite separated by bainite with cracking initiated at the interface between these bands.

Bhadeshia et al. [23] attributed some of the inferior mechanical properties of high-strength bainitic rail steels to coarse carbides associated with the bainite microstructure and developed an interesting carbide-free bainitic microstructure by suppressing cementite precipitation during bainite transformation by alloying with silicon (about 1.5 wt% Si) [1,23]. Silicon has low solubility in cementite and greatly retards its growth. When the Si-alloyed steel is transformed to upper-bainite, the carbon is rejected into the residual austenite and instead of precipitating as cementite, remains in the austenite and stabilises it down to ambient temperature. The resulting microstructure consists of fine plates of bainitic ferrite separated by carbon-enriched regions of austenite (Figure 2.3a). Several potential advantages of this kind of mixed microstructure of bainitic ferrite and austenite, were reported by Bhadeshia [1] including high hardness and toughness, improved stress-corrosion resistance, simple and cheap processing routes etc. The possibility of poor toughness was also reported due to the presence of relatively large 'blocky' austenite between bainite sheaves (Figure 2.3b). The less stable austenite blocks transformed into highcarbon martensite under the influence of a small applied stress and this untempered, hard martensite embrittled the steel. With careful thermodynamic calculations [1], the composition of alloying elements (like Mn, Si, Cr, Mo) were critically adjusted to manipulate the thermodynamic limit to permit more bainitic ferrite to form. The

 $^{^4\}mathrm{VHN}$ or, HVN represents Vickers hardness number.

large blocks of austenite were eliminated whilst still retaining the films of stable austenite.

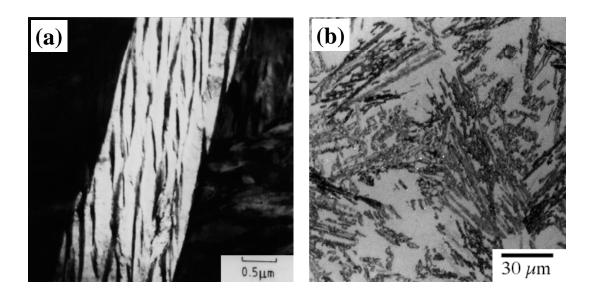


Figure 2.3: (a) Transmission electron micrograph of a sheaf of bainite, consisting of fine ferrite platelets separated by films of carbon-enriched retained austenite; (b) Blocks of retained austenite between sheaves of bainite [1,23].

Collaborative work between British steel (later Corus steel and now Tata steel) and University of Cambridge integrated all these theories into a mechanism based model and developed a novel composition specific for rail steels (Table 2.2) with a tough, wear-resistant carbide-free bainitic microstructure [24].

Table 2.2 summarises some typical rail steel compositions.

Grade [Reference]	C	Mn	Si	Cr	Mo	Ni	Nb	Λ	В	Al	Cu	Ξ	Ч	S
Pearlitic Grade-700 [25]	0.4 - 0.6	0.8 - 1.25	0.05-0.35	I	ı	ı	I	I	I	ı	I	I	< 0.05	< 0.05
Pearlitic Grade-900A [25]	0.6-0.8	0.8 - 1.3	0.1 - 0.5	I	I	ı	I	ı	I	ı	ı	ı	<0.04	<0.04
Pearlitic Grade-900B [25]	0.55 - 0.75	1.3-1.7	0.1 - 0.5	I	ı	ı	I	ı	I	ı	ı	ı	<0.04	< 0.04
Pearlitic Grade-1100 [25]	0.6 - 0.82	0.9-1.3	0.3 - 0.9	0.8 - 1.3	ı	ı	ı	ı	ı	·	ı	ı	<0.04	< 0.03
Pearlitic R350HT [6]	0.79	1.19	0.44	0.08	ı	ı	I	< 0.005	I	ı	0.018	ı		0.013
Bainitic rail [24]	0.05 - 0.5	0.5 - 2.5	1.0-3.0	0.25 - 2.25	0-1.0	0-3.0	I	0-0.5	0-0.005	1.0-3.0	ı	0-0.10	ı	< 0.025
Bainitic B360 [6]	0.32	1.57	1.27	0.55	I	ı	I		I	ı	< 0.010	ı	0.016	0.014
Bainitic grade $[1]$	0.04	0.75	0.2	2.8	0.25	2	ı		< 0.01	0.03	ı	0.03	ı	ı
Bainitic grade [26]	0.20 - 0.55	0.40 - 2.10	0.40 - 0.45	0-2.0	0-2.0	ı	0-0.15	0-0.10	I	ı	ı	ı	ı	ı
Austenitic Mn13 (Hadfield) [6]	1.14	12.25	0.36	0.18	ı	ı	ı	0.005	ı	ı	0.047	ı	0.008	< 0.001
Martensitic SAE6150 [6]	0.51	0.9	0.23	1.1	ı	,	I		I	ı	ı	ı	ı	,

Table 2.2: Standard rail steel compositions (wt%).

2.2 Austenite grain structure in rail steels

Austenite grain size, defined as a mean lineal intercept \bar{L}_{γ} , is important for the following reasons:

- (i) a small \bar{L}_{γ} leads in general to an even smaller length scale in the transformation product; the reasons for this are attributed to an associated increase in the number density of nucleation sites, limiting the size of displacive transformation products.
- (ii) Impurities can segregate to austenite grain surfaces or even prior-austenite grain boundaries if they are not disrupted by phase transformation. The amount of surface per unit volume varies with \bar{L}_{γ}^{-1} so the finer the grain size, the smaller the impurity concentration at the grain boundary for a given average value. Thus, boundary-related embrittlement phenomena diminish as \bar{L}_{γ} is reduced.
- (iii) The thickness of cementite films or size of cementite particles at austenite grain surfaces is reduced as \bar{L}_{γ} decreases. These two cementite-dimensions in many circumstances determine the initiation of cleavage fracture [27]. Films of proeutectoid cementite at the prior-austenite grain boundaries are particularly important to avoid or minimise in rail steels.

Rails are hot-rolled starting with reheated slabs and then are deformed into the required profile in less than about twenty rolling passes. Table 2.3 lists some rail-section rolling conditions during industrial manufacture and laboratory hot-rolling trials, as published in the open literature [14,24,26,28–31].

Ingot cross-section $(mm \times mm)$	Reheating temperature (°C)	Final section-size/ Final thickness	$\begin{array}{c} \text{Finish-rolling} \\ \text{temperature} \\ (^{\text{o}}\text{C}) \end{array}$	Reference
360×270	1250	UIC60*	900-950	[14]
400×610	1288	AREMA 136-RE*	882	[28]
210×270	1160	KL60*	880, 930-960	[29]
45×50	1250	15-20 mm	>940/950	[14]
125×125	_	30 mm	1000	[24]
127×127	1200	32 mm	1050	[30]
_	1288	$76 \mathrm{~mm}$	882, 940-954	[28]
75×75	1200	24 mm	-	[31]
-	1250	12 mm	980	[26]
	cross-section (mm × mm) 360×270 400×610 210×270 45×50 125×125 127×127 -	cross-section (mm × mm)temperature (°C) 360×270 1250 400×610 1288 210×270 1160 45×50 1250 125×125 _ 127×127 1200_1288 75×75 1200	cross-section (mm × mm)temperature (°C)section-size/ Final thickness 360×270 1250UIC60* 400×610 1288AREMA 136-RE* 210×270 1160KL60* 45×50 125015-20 mm 30 mm 125×125 _30 mm 127×127 120032 mm 75 $\times 75$ 75×75 120024 mm	$\begin{array}{cccc} \mbox{cross-section} & \mbox{temperature} & \mbox{section-size/} & \mbox{temperature} & \mbox{c'C} & \mbox{Final thickness} & \mbox{temperature} & \mbox{(°C)} & \mbox{360} \times 270 & 1250 & \mbox{UIC60}^* & 900-950 & \mbox{400} \times 610 & 1288 & \mbox{AREMA} & 882 & \mbox{136-RE}^* & \mbox{210} \times 270 & 1160 & \mbox{KL60}^* & \mbox{880}, 930-960 & \mbox{45} \times 50 & 1250 & 15-20 & \mbox{mm} & & \mbox{940}/950 & \mbox{125} \times 125 & \mbox{-} & \mbox{30} & \mbox{mm} & \mbox{1000} & \mbox{127} \times 127 & 1200 & \mbox{32} & \mbox{mm} & \mbox{1050} & \mbox{32} & \mbox{mm} & \mbox{125} \times 75 & \mbox{1200} & \mbox{24} & \mbox{mm} & \mbox{-} & \mbox{-} & \mbox{-} & \mbox{126} & \mbox{mm} $

Table 2.3: Rolling of rail-sections

The initial austenite grain size in a slab held at $1200 \,^{\circ}$ C for four hours is greater than 460 µm [33], and decreases to about 50 µm during the first two rolling passes, after which it remains at that value during subsequent reductions. The lack of microalloying elements leads to the coarse structure at the reheating temperature, and all of the subsequent deformation leaves the steel in a recrystallised state between passes. Conventional rails have an austenite grain size which varies dramatically as a function of position within the rail (Figure 2.4), and with the processing parameters. Furthermore, it is particularly noticeable that the base of the web has a much more uniform and relatively fine austenite grain size, presumably because this is the portion which has had the most work done during shape forming. The temperature and strain-distribution in the rail-head are critical parameters and their effect on the final austenite grains are shown in Figure 2.5 [34].

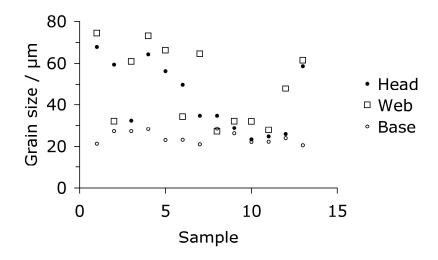


Figure 2.4: Variation in prior-austenite grain diameter within rails. [7]

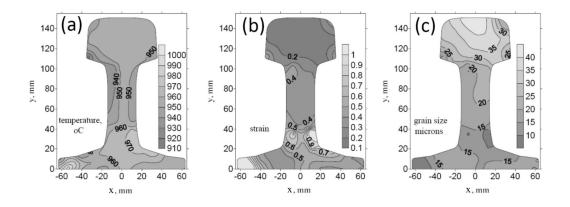


Figure 2.5: Distribution of (a) temperature, (b) effective strain and (c) austenite grain size at the cross-section of a rail after exit from the last pass in a hot-rolling mill [34].

It seems obvious that a controlled addition of microalloying elements could lead to substantial grain refinement for the lower degrees of deformation experienced by the rail-head, if the austenite recrystallisation process can be retarded. Such retardation is common in the controlled rolling of large quantities of lower strength materials so the technology is well-established, albeit for the low-carbon alloys. There is an interesting aspect which has never before been explored, i.e., the creation of a pancaked austenite grain structure, especially in the rail-head. Pancaking would lead to a dramatic increase in the amount of grain surface per unit volume because of the highly anisotropic grain shape [35] and hence a more pronounced reduction in \bar{L}_{γ} than if equiaxed grains are made finer. Similarly, there is the possibility of further refinement due to shear band formation in unrecrystallised austenite. It is noteworthy that niobium present in solution, for example at the slab reheating temperature, would in itself retard recrystallisation during subsequent deformation if the latter stimulates precipitation [36].

2.3 Niobium in high-carbon steels

Niobium is used as an microalloying element for precipitation strengthening and grain refinement in low carbon high strength steels such as those used in manufacturing automotive, pipe steels etc. Whether controlling austenite grain coarsening during reheating or inhibiting austenite recrystallisation during hot deformation by pinning the grain boundaries by fine niobium carbide precipitates, the theory and thermo-mechanical processing technology is well established for low carbon steels (0.01-0.2 wt% C) [4,5]. There are hardly any niobium microalloyed high carbon steel products commercially available. The major issue is severe niobium segregation in high carbon steels because of low solubility of niobium in high carbon austenite. So the key is to optimise the niobium content so that the niobium can be taken into solution during reheating so that fine niobium carbides can be precipitated during deformation. Alternatively if the niobium carbide cannot be dissolved during reheating, the carbide size must be fine enough and the number density of carbide particles large enough to pin austenite grain boundaries. The literature on the microalloying of high-carbon steels is limited [37,38], but the indications are that niobium additions would be beneficial in the context of rail steels. The benefits are related to both in limiting the austenite grain size, and in modifying the subsequent development of pearlite. There are a number of difficulties not addressed in the available literature.

(i) The data reported are usually for alloys investigated in relatively small scale

laboratory experiments.

- (ii) Full scale trials of the manufacture and testing of rails containing niobium do not seem to have been conducted, or alternatively, such trials have not been reported in accessible literature.
- (iii) Issues due to segregation of niobium added to large melts and the formation of coarse deposits of NbC (which remain as a permanent feature in the steel), are seldom discussed.

To use niobium as an effective microalloying element in high carbon steels, the solubility of niobium carbide is an important parameter to determine the amount of effective microalloying in steel. To maximize precipitate pinning of grain boundaries, it is necessary to dissolve the carbides or nitrides completely at the reheating temperature and precipitate them in the form of fine dispersions and stable particles during rolling. Though the decrease in niobium solubility in austenite with increasing carbon content is a well-established fact but the possibility of an increased niobium solubility at very high carbon contents has been reported by Ohtani et al. [39] and Balasubramanian et al. [40]. To address this anomaly, the description of niobium carbide solubility in ternary Fe-Nb-C austenite is reviewed and compared against thermodynamic databases. The effect of niobium on pearlitic and bainitic microstructures and mechanical properties is discussed thereafter.

2.4 Description of niobium carbide solubility in Fe-Nb-C system

There have been many experimental determinations as well as thermodynamic predictions of the solubility of niobium carbide precipitates in ternary Fe-Nb-C austenite [41–50]. The results have been reviewed over time and sometimes reassessed to provide a more suitable thermodynamic description of NbC solubility in austenite [39,40,49–52]. The early experimental measurements and thermodynamic calculations of carbide solubility were based on the assumption that carbides (or nitrides) of transition elements such as Ti, Nb, V are stoichiometric in composition and that the austenite is devoid of any ternary solute interactions. The methodology considers the austenite-NbC equilibrium as follows:

$$[Nb] + [C] \rightleftharpoons NbC \tag{2.1}$$

$$RT \ln \left[a_{\rm Nb} \ a_{\rm C} \right] = \Delta^{\rm o} G_{\rm NbC} \tag{2.2}$$

where [Nb] and [C] are elements dissolved in austenite, $a_{\rm Nb}$ and $a_{\rm C}$ are the activities of the elements, $\Delta^{\rm o}G_{\rm NbC}$ is the standard free energy of formation of the stoichiometric carbide from 1 wt% austenite solution. Assuming dilute solutions in austenite, the solubility product can be defined as:

$$RT \ln [\%Nb] [\%C] = \Delta^{\circ}G_{NbC}$$
(2.3)

$$\log [\%Nb] [\%C] = A + B/T$$
 (2.4)

where [%Nb] and [%C] are the weight percents of niobium and carbon dissolved in austenite respectively, A and B are approximate constants related to the enthalpy and entropy of carbide formation respectively. A summary of various investigations up to 1980s on NbC solubility is given in terms of A and B values in Table 2.4. Some investigations showed an improved prediction with the experimental solubility data for carbides by assuming the carbide composition to be NbC_{0.87} instead of perfect stoichiometry.

Temperature	Solubility		
Range -	$\log [\% Nb].[\%$	[C] = A + B/T	_ Reference
Italigo	A	$B(\mathbf{K})$	
1173 - 1473 K	2.90	-7500	De Kazinczy, 1963 [41]
1273 - 1573 K	3.18	-7700	Mori, 1964 [42]
1323 - 1573 K	3.42	-7900	Narita, 1966 [43]
1173 - 1573 K	3.04	-7290	Meyer, 1967 [44]
1273 - 1573 K	3.70	-9100	Smith, 1966 [45]
1223 - 1323 K	4.37	-9290	Johansen, 1967 [46]
1173 - 1473 K	3.11	-7520	Nordberg, 1968 * [47]
1323 - 1423 K	3.31	-7970	Koyama, 1971 [48]
1273 - 1523 K	3.40	-7920	Lakshmanan, 1977 * [49
1173 - 1473 K	2.81	-7020	Sharma, 1984 * [50]
* The precipitat	es were assume	d to be $NbC_{0.87}$.	

Table 2.4: Solubility of niobium carbide in austenite [40].

Balasubramanian [40], reported two drawbacks in calculating NbC solubility by the above methodology.

- (i) Transition elements like Ti, Nb, V are strong carbide and nitride formers. So interactions between solutes need to be accounted for.
- (ii) NbC is non-stoichiometric and hence its composition can vary when precipitated in steels. This rules out a simplified analysis.

An increase in Nb solubility in austenite has been reported at high-carbon concentrations by Balasubramanian [40]. A solubility-minimum was observed (around 0.4-0.5 wt% C) at 1273-1473 K. This was attributed to the strong solute interactions in austenite and non-stoichiometry of the carbides. It was argued that earlier investigations [41–50] were performed at low-carbon concentrations (below 0.2 wt%) without addressing the solute interactions and carbide non-stoichiometry and hence are not capable of predicting the solubility at higher carbon levels where the effects of solute interactions become significant. The classical solubility product expression (equation 2.4) was modified by incorporating an additional term for the concentration dependence on carbon [40].

log [%Nb] [%C] =
$$A + B/T + (C/T - D).$$
[%C] (2.5)

Thus, raising the carbon content increases the solubility product of NbC and more niobium can be retained in solution.

Parallel but independent work by Ohtani et al. [39] also suggested an increase in NbC solubility at high-carbon concentrations by taking account of strong interactions between niobium and carbon atoms in austenite. Table 2.5 and Figure 2.6 compare the two separate thermodynamically calculated solubility data in [40] and [39], both reporting an increase in Nb solubility at high-carbon concentrations. Both groups showed fair agreement at lower temperatures (≤ 1373 K) but the difference widens with increasing temperatures. Different values for the free energy of dissolution of niobium in austenite are the cause of this anomaly in NbC solubility data.

Solubility Limit	-(8030/T) + 3.89 + [(1150/T) - 0.05].[%C]	Balasubramanian [40]
$\log [\%Nb][\%C]$	-(4880/T) + 1.18 + [(1590/T) - 0.10].[%C]	Ohtani et al. [39]
Free energy of dissolution of niobium in	$-27950 + 13.00T \text{ J} \text{ mol}^{-1}$	Balasubramanian [40]
austenite $RT \ln \gamma_{\rm Nb}^0$	$-88235 + 64.85T \text{ J} \text{ mol}^{-1}$	Ohtani et al. [39]
Interaction parameter	-(65840/T) + 2.5	Balasubramanian [40]
$\epsilon_{ m Nb}^{ m C}$	-(87620/T) + 5.0	Ohtani et al. [39]

Table 2.5: Solubility limit and ternary interaction in Fe-Nb-C system [40]. Composition and temperature are in wt% and K respectively. γ_{Nb}^{0} is the activity co-efficient of dissolved niobium in austenite.

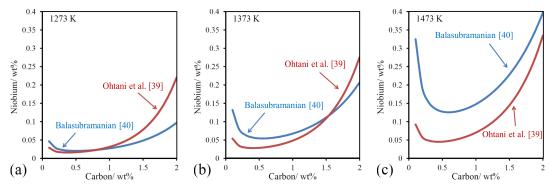


Figure 2.6: Comparison between thermodynamically calculated solubility data by Balasubramanian [40] and Ohtani et al. [39]: (a) 1273 K, (b) 1373 K, (c) 1473 K.

Complete original experimental data for NbC solubility from Ohtani's work have not been possible to trace. Only one instance of experimental data from Ohtani's work (experimental data points up to 1.0 wt% C) can be found from [53]. The corresponding complete original references ([54,55] cited in [53]) could not be obtained. Figure 2.7 compares their experimental data with those of Balasubramanian [40] (experimental data up to 2.0 wt% C) and an earlier experimental investigation by Lakshmanan [49] which was limited to only 0.2 wt% C. There is no apparent solubilityminimum in the experimental data from Ohtani et al. [39]. This contradicts the solubility-minimum at about 0.4-0.5 wt% C in the thermodynamically fitted curve on the same solubility data of Ohtani et al. from Figure 2.6c. Also, experimental data from Ohtani et al. agree well with those of Lakshmanan [49] for carbon concentrations up to 0.2 wt%. But there remains a discrepancy with the experimental data from Balasubramanian [40] where a clear solubility-minimum can be observed (Figure 2.7).

The NbC solubility in Fe-Nb-C austenite was measured by Balasubramanian [40] from the deflection in equilibrated carbon content variation with Nb additions at constant carbon activity during dynamic gas-equilibration experiments [40]. The reported error is calculated by assuming negligible error in the determination of wt% C and equating the absolute error in the solubility product to the relative error in determination of wt% Nb. As shown in Figure 2.8a, at high carbon levels (>1.0 wt% C), the change of slope in the iso-activity curves is significant and hence the error in the determination of C and Nb compositions are small. However, at lower carbon levels (<1.0 wt% C)(Figure 2.8b-c), the error should be relatively higher due to a less pronounced change in slope and error in measured wt% C should not be neglected. So in Figure 2.7, the experimental NbC solubility data at high carbon levels (<1.0 wt% C) due to Balasubramanian [40] may be accurate, but the solubility at lower carbon contents (<1.0 wt% C) should contain a larger amount of error than reported.

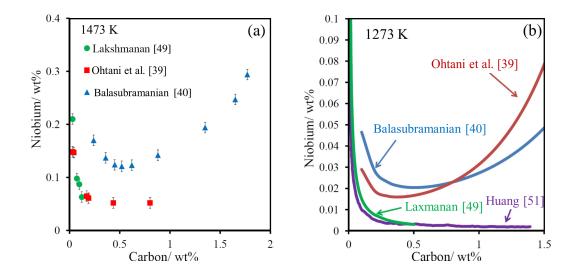


Figure 2.7: NbC solubility in austenite as a function of the carbon concentration: (a) experimentally measured at 1473 K, (b) thermodynamically calculated at 1273 K.

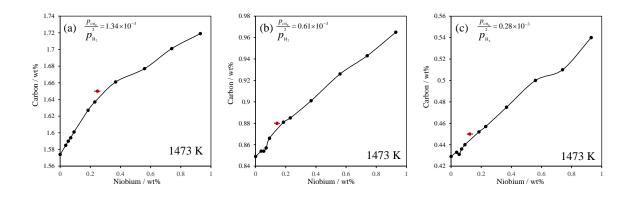


Figure 2.8: The carbon content of equilibrated Fe-Nb-C alloys at 1473 K for different carbon potentials: (a) high carbon potential [gas ratio $(p_{\text{CH}_4}/p_{\text{H}_2}^2)=1.34\times10^{-3}$], (b) medium carbon potential $(p_{\text{CH}_4}/p_{\text{H}_2}^2=0.61\times10^{-3})$, (c) low carbon potential $(p_{\text{CH}_4}/p_{\text{H}_2}^2=0.28\times10^{-3})$. Red circles indicate the measure solubility data at the corresponding carbon potential [40].

Huang [51], optimized the thermodynamic description for Fe-Nb-C ternary system by using Nb-C and Fe-Nb data and the Fe-C description by Gustafson [56]. This work was reviewed by Lee [52], along with the other earlier experimental investigations on NbC solubility including the anomaly between Ohtani et al. [39] and Balasubramanian [40]. The calculated solubility using Huang's description [51] is too low, especially at low temperature (1273 K), when compared with data from [39] and [40] as shown in Figure 2.7b. In contrast, no increase in solubility can be observed at large carbon contents in [51]. These differences were attributed to a more positive value of the interaction energy parameter $L_{\rm Fe,Nb}$ (-4784 J mol⁻¹) in Huang's calculations [51] than in [39] and [40]. The value of the ternary interaction parameter was calculated in [51] as $\epsilon_{\rm Nb}^{\rm C} = -38276/T + 3.1$ which is more positive and does not correspond to the strong mutual solute interaction as compared with those of [39] and [40] (Table 2.5). It was also argued by Huang [51] that the calculated activity of carbon from Balasubramanian's [40] experimental data on NbC solubility in austenite, could show a large error since the carbon activities of the Fe-C binary obtained by [40] show poor agreement with the well-established data by Gustafson [56]. Balasubramanian et al. [57] also acknowledged this fact that some uncertainty still exists in the description of Fe-Nb-C system.

But the data from Huang's calculation [51] were consistent with earlier investigations [41–50] in the same range of temperature (1273 to 1473 K). Lee [52] developed a self-consistent thermodynamic description for the Fe-Nb-Ti-C-N quinary system and on the way reassessed Huang's work [51] on Fe-Nb-C ternary systems in terms of its sub-binary systems i.e. Fe-Nb, Nb-C and Fe-C. In particular the Fe-Nb description was revised by making $L_{\text{Fe,Nb}}$ temperature dependent instead keeping constant. A slight change in Nb-C description was also required but the revision was made in a way that does not change the temperature dependence of the enthalpy of formation of NbC carbides. Thus Fe-Nb phase becomes more stable in austenite at low temperatures which in turn improves the agreement between calculated and experimentally measured slopes of solubility product for NbC.

Commercial software like Thermo-Calc, MTDATA, MatCalc, JMatPro etc. have been developed, which, together with appropriate data, can be used to calculate phase-equilibria and thermodynamic properties in multicomponent, multiphase systems. For steel and Fe-based alloys, TCFE is the most common database which has been continuously developed and improved over the years by Thermo-Calc Software AB [58]. It has also been translated and tested for use with MTDATA [58]. Mat-Calc has been developed with 'mc_fe'; 'mc_steel' and 'mc_sample_fe' thermodynamic databases for steel and Fe-based alloys [59]. Detailed review of the database references reveals that the Fe-Nb-C description for TCFE and 'mc_sample_fe' databases have been developed based on the assessment by Lee [52] while for 'mc_fe_v2.009' and 'mc_steel', thermodynamic calculations by Huang [51] have been taken into account in addition to that of Lee [52]. Figure 2.9 compares the NbC solubility calculated by different commercial software and databases. There clearly is considerable uncertainty in calculating the appropriate niobium solubility for a given carbon concentration.

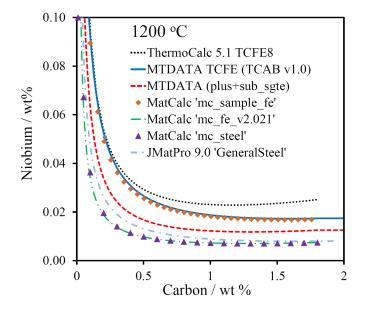


Figure 2.9: Comparison between thermodynamically calculated solubility data by different commercial software with different databases.

2.4.1 Effect of alloying elements on Nb solubility in austenite

Koyama et al. [48] studied the influence of Mn, Si, Cr and Ni on the solubility of NbC in Fe-Nb-C austenite by the method of equilibration with methane-hydrogen mixture gas. Mn and Cr increased NbC solubility in austenite remarkably whereas Ni increased the solubility at 1050-1100 °C. But the effect was weak at higher temperatures (~ 1150 °C). In contrast, Si drastically decreased the solubility of NbC in austenite. This will have an important effect for Nb-microalloyed cementite-free bainitic compositions where the Si content is quite high (1.5-2.0 wt% Si) to suppress cementite precipitation. Such effects are attributed to the effect of each element on the activity of Nb as well as that of carbon. The effect on the NbC solubility product was described by the following equations based on experimental data. Composition and temperatures are in wt% and K respectively.

$$\begin{split} \log [\% \text{Nb}] [\% \text{C}] &= -7970/T + 3.31 + (1371/T - 0.900) [\% \text{Mn}] - (75/T - 0.0504) [\% \text{Mn}]^2 \\ &(2.6) \\ \log [\% \text{Nb}] [\% \text{C}] &= -7970/T + 3.31 - (735/T - 0.348) [\% \text{Si}] \\ \log [\% \text{Nb}] [\% \text{C}] &= -7970/T + 3.31 + (1113/T - 0.691) [\% \text{Cr}] - (38/T - 0.0228) [\% \text{Cr}]^2 \\ &(2.8) \\ \log [\% \text{Nb}] [\% \text{C}] &= -7970/T + 3.31 + (148/T - 0.0904) [\% \text{Ni}] - (8.5/T - 0.0068) [\% \text{Ni}]^2 \end{split}$$

(2.9)

2.5 Primary niobium carbides

The majority of articles on Nb-microalloyed high-carbon steels do not address the role of primary niobium carbides, i.e., those which may precipitate from the last liquid to solidify. The solubility of NbC is also low in liquid steel with high carbon compositions and due to micro-segregation during solidification, there is a probability of primary NbC formation from liquid. Kestenbach et al. [60] studied quantity, distribution and effectiveness of eutectic carbides in 0.75C-0.9Mn-0.16Si-(0.04-0.07)Nb (wt%) steels. The particles were heterogeneously distributed and seemed to be ineffective in promoting microstructural refinement. Primary precipitates were reported even for low carbon (0.15-0.2 wt%) compositions. Bernetič et al. [61] observed coarse niobium carbo-nitride particles (Figure 2.10a) in 0.15C-1.1Mn-0.49Si-0.022Nb-0.0071N (wt%) as constituents of the degenerated Fe-Nb(C,N) that forms because of the centerline segregation of niobium. The location of the eu-

tectic in the centre of the slab and the composition of the steel suggest that its formation is an improper solidification process related to a high casting temperature, a high slab solidification rate or a deficiency in the secondary slab cooling. The stability of the precipitates at slab-soaking temperatures even higher than stoichiometric Nb($C_{0.9}N_{0.1}$) solution temperature, was attributed to high nitrogen contents in the eutectic precipitates. Vodopivec et al. [62] observed eutectic NbC formation in mild steel containing niobium [0.19C-1.46Mn-0.42Si-0.045Nb-0.053V-0.047Al-0.014N (wt%)] under special solidification conditions and the precipitates caused internal hot cracks in steel slabs. The isothermal dissolution kinetics of the precipitates in austenite was reported to be very slow (Figure 2.10b) which was attributed to slow diffusion transport at the precipitate/austenite interface rather than slow diffusion rate of Nb in austenite. But even the diffusion controlled dissolution kinetics of such precipitates is also quite slow owing to the coarse carbide sizes (average NbC size $2\pm 1 \,\mu$ m for Figure 2.10a).

Some more examples of primary niobium carbide formation from liquid steel are given in [63–68]. During industrial continuous casting of steel, with the advent of technologies like electro-magnetic stirring, dynamic soft reduction etc. and due to faster cooling rates during solidification, it may be possible to inhibit the formation of primary precipitates. Also by controlling the niobium addition, the size of the coarse carbides may be refined so that they are not harmful to the mechanical properties.

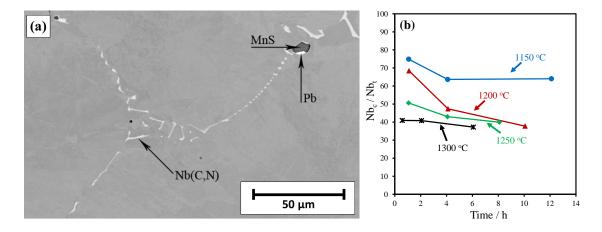


Figure 2.10: (a) Primary eutectic Nb(C,N) precipitates in as-cast Nb-microalloyed steel. Reproduced with permission [61]. (b) Kinetics of dissolution of niobium carbonitride in austenite at different temperatures. Nb_c is niobium in carbonitrides and Nb_t is total niobium content in steel [62].

2.6 Effect of niobium on prior austenite grain structure

Niobium generally has two main effects on prior austenite grain size (PAGS):

- (i) during soaking at austenisation temperatures, fine niobium precipitates (nitrides, carbides or carbo-nitrides) delay austenite grain growth retaining fine austenite grain size;
- (ii) during hot rolling, strain-induced niobium precipitates pin austenite boundaries and delay or inhibit austenite recrystallisation, thus producing a pancaked austenite structure.

2.6.1 Effect of niobium during austenisation

The majority of work on Nb-microalloyed high carbon steels is focussed on the first effect i.e. austenite grain growth during soaking [60,68–71]. Coladas et al. [69] have shown for Nb-microalloyed (0.03-0.09 wt% Nb) medium to high carbon (0.4-0.81 wt% C) steels, that there is a critical austenisation temperature (T_c) [Figure 2.11a], below which the change in grain size remains small. At $T > T_c$, the size increases rapidly with temperature. In contrast, for non-microalloyed steels, the austenite grain size increases monotonically with temperature. For medium carbon steels with 0.4-0.5 wt% C, T_c decreases with increasing niobium [Figure 2.11b] but for higher carbon contents (0.7-0.8 wt% C), it is not significantly affected by increasing Nb. This is because the austenite grains are only affected by the fine niobium precipitates which precipitate during the hot deformation and air cooling stages preceding the final austenitising treatment. Adding more Nb than that which can be dissolved during reheating prior to hot deformation, will produce coarse precipitates (>480 nm) [69] which do not affect the austenite grain growth kinetics. Liu et al. [68] showed 0.035 wt% Nb in a U74 rail (0.67-0.80 wt% C) is most effective in refining austenite grains during 860 °C-40 min austenisation. Niobium in solution can have a beneficial effect even when $T > T_c$ as can be seen in Figure 2.11a. Kestenbach et al. [72] reported that 0.01 wt% Nb can be dissolved in austenite during reheating at 1200 °C-30 min for a 0.76C-0.04Nb (wt%) steel and reduced the austenite grain size from 360 to $220 \,\mu\text{m}$.

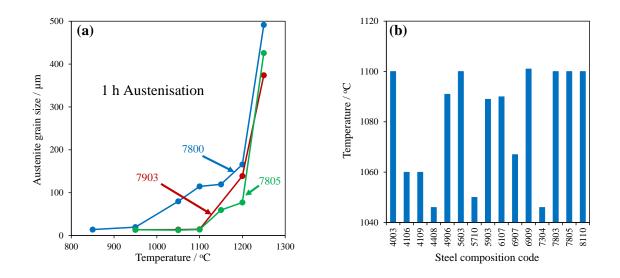


Figure 2.11: (a) Comparison of austenite grain size for ordinary and microalloyed steels. (b) T_c for a variety of steel [69]. The first two digits of the alloys identified numerically represent wt% C ×100 and the last two digits give the wt% Nb ×100.

For optimal niobium addition in high carbon steels, CBMM, the world's largest producer of niobium, has developed a strategy, defined as "Micro-Niobium Alloy Approach[®]" [73–77] which is being successfully applied in several Nb-bearing medium and high carbon steel products including eutectoid rails and reinforcing bars for pre-stressed concrete, high alloy tool steels, spring steels, automotive fasteners, seismic and fire resistant rebars etc [75,77]. Both the metallurgical properties and processability such as wire drawability or formability during manufacturing, are reported to be improved, thereby reducing the operational cost per tonne by 10 to 15%. The key elements of the approach can be summarised as:

- (i) addition of 0.005-0.020 wt% Nb across 0.20-0.95 wt% C steels to retard austenite grain coarsening by Nb-pinning during soaking in reheating furnaces prior to hot deformation;
- (ii) reduced total activity-based operational cost per tonne in energy and quality;
- (iii) offsets operational reheat furnace combustion variations and thermal excursions;

2.6.2 Effect of niobium during austenite hot deformation

Kestenbach et al. [72] reported that just 0.01 wt% Nb, dissolved in 0.76 wt% C austenite reheated at $1200 \degree \text{C}$, can precipitate and delay recrystallisation during hot

deformation by pinning the austenite grain boundaries. As shown in Figure 2.12, austenite recrystallisation is virtually complete at 950 °C for the non-microalloyed steel (Nb-0) whereas the niobium-bearing steel (Nb-1) can be deformed without any sign of recrystallisation at temperatures up to 900 °C. Coladas et al. [72,78] also reported a strong delaying effect of 0.022 wt% Nb dissolved in reheated austenite on the static recrystallisation of a 0.4 wt% C steel after hot rolling.

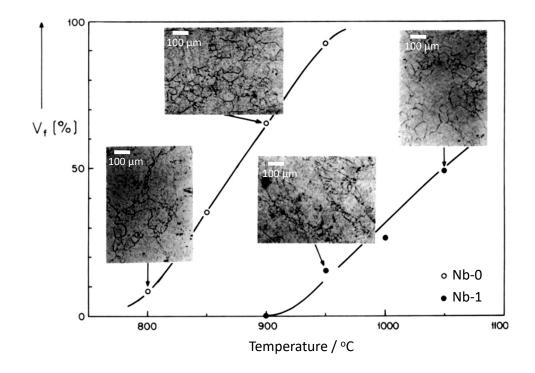


Figure 2.12: Effect of Nb on the recrystallised volume percent of austenite, V_f , as a function of the deformation temperature. Micrographs show the partially recrystallised austenite grain structures quenched immediately after hot deformation. Reproduced with permission from Springer [72].

Due to the competing effect of recrystallisation and austenite grain boundary pinning at the onset of deformation induced NbC precipitation, partial recrystallisation occur during hot deformation [37,79]. Hot torsion testing of C-Mn-Cr-Nb rail steel at BHP Melbourne Research Laboratories, Australia (Ref 23 in [37]) indicated that austenite recrystallisation becomes sluggish during deformations at 1000 °C starting from 0.015-0.035 wt% Nb, dissolved in 0.4-0.8 wt% C steels reheated at 1260-1300 °C. And during deformation below 950 °C, strain-induced NbCN severely retard recrystallisation. In-between recrystallisation may not occur uniformly along the length of the rail or through the section of the rail and these variations can lead to shape problems. It was suggested to confine the rolling to T > 1000 °C to minimize these problems. More recently, Cui et al. [79] also showed partial recrystallisation of hot deformed austenite at finish deformation temperatures of 950-1000 °C for 0.6C-0.018Nb (wt%) steel.

Niobium addition is said to increase the no-recrystallisation temperature (T_{nR}) . Wada et al. [80] carried out a detailed analysis for the effect of 0.02 wt% Nb microalloying and controlled finish rolling at low temperature (710-960 °C) austenite region for eutectoid rail steel compositions. Increased T_{nR} at 870-890 °C for Nbmicroalloyed steels (Nb, Cr+Nb, Si+Nb in ref [80]) were reported compared to 760-800 °C T_{nR} for the non-microalloyed steels (BA, Cr, Si steels in ref [80]). Cotrina et al. [81] carried out multi-pass hot torsion tests on 0.78C-0.03Nb (wt%) steels and showed recrystallised austenite grains of size 60-80 µm with finish rolling temperature (FRT) of 1060 °C while austenite remains un-recrystallised for FRT 870 °C. Figure 2.13a attempts to summarise the T_{nR} temperatures reported in literature with increasing niobium content. Strain at each pass is very critical for recrystallisation but the effect of strain is not considered while constructing Figure 2.13a.

The Nippon Steel Corporation in 1979, developed the NS-II rail composition [0.76C-0.82Mn-0.82Si-0.49Cr-0.005Nb (wt%)] so as to start the pearlite transformation at about 600 °C in the rail-head during cooling in rail-production or after flashbutt welding [38,82]. The purpose was to address the problem of a high degree of inhomogeneity in hardness distribution at HAZ of weld-joints. Nb was added to refine the austenite grain size and increase the hardenability. Figure 2.13b compares austenite grain size distribution through the rail sections of NS-II and ordinary carbon steel rails. NS-II rail exhibits a finer grain size than that of ordinary carbon steel rails in as-rolled condition, and the grain size becomes much finer by head-hardening. The austenite grain size was measured in terms of ASTM grain size number by an ultrasonic device and converted to mean linear intercept.

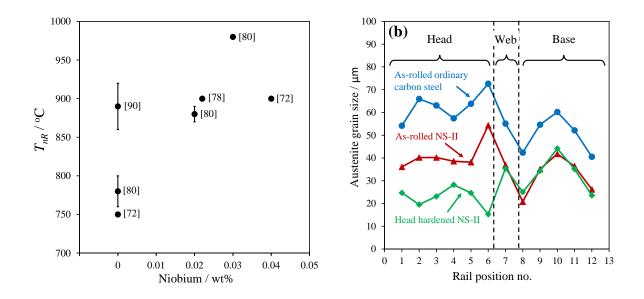


Figure 2.13: (a) Reported T_{nR} for different Nb content in high carbon (0.6-0.8 wt%) steels. (b) Austenite grain size distribution in ordinary carbon steel and NS-II rail sections [38].

2.7 Effect of niobium on pearlitic microstructure and properties

2.7.1 Interlamellar spacing and strength

During continuous cooling, pearlite can begin forming at a higher temperature in fine or unrecrystallised austenite due to greater density of nucleation sites. A higher transformation temperature is associated with a coarse interlamellar spacing in the pearlite. Therefore, for refined or unrecrystallised austenite, strength may decrease due to the coarsening of the lamellar spacing [72]. This trend is confirmed as illustrated in Figure 2.14 by Wada et al. [80] for non-microalloyed 0.78C-1Mn (wt%) steel. But for the Nb-microalloyed 0.81C-1Mn-0.018Nb (wt%), though the transformation temperature increases with decreasing finish rolling temperature, the yield strength tends to increase. Strain induced precipitation of niobium carbo-nitride (NbCN) was attributed to the strength increase despite coarser lamellar spacing due to higher transformation temperature [80]. Liu et al. [68] observed fine niobium rich precipitates in both ferrite and cementite lamellae of pearlite (Figure 2.15) and suggested 0.024 wt% Nb in 0.67-0.80 wt% C rails for effective control of lamellar spacing form austenisation.

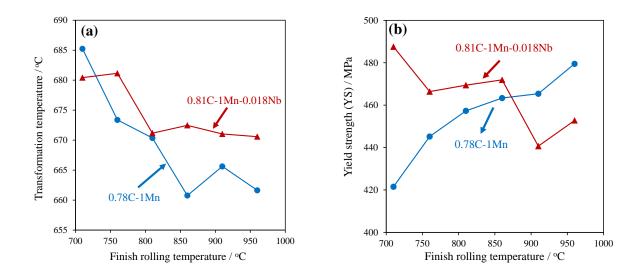


Figure 2.14: Variation of (a) austenite to pearlite transformation temperature, (b) yield strength (YS) with different finish rolling temperatures and compositions (wt%) [80].

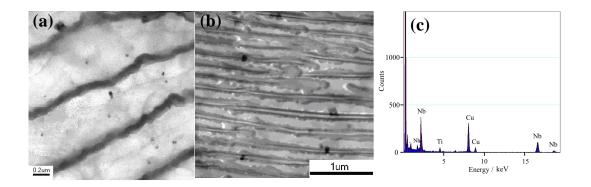


Figure 2.15: Transmission electron micrographs of niobium-rich precipitates in pearlite: (a) in ferrite, (b) in cementite, (c) corresponding EDS spectra. Reproduced with permission of Trans Tech Publications [68].

Yang et al. [83] also reported increasing interlamellar spacing (ILS) with increasing niobium content [Steel 6700: 148 nm, Steel 6704: 178 nm, Steel 6910: 193 nm]⁵ during normalizing from 850 °C. For similar heat-treated austenite grain sizes, Gomes et al. [71] reported about 10% increase in mean true ILS for 0.76C-0.045Nb (wt%) steel compared to its non-microalloyed counterpart. In some cases, ILS was reported to be independent of austenite grain size. Cotrina et al. [81] observed decreasing ILS with increasing cooling rate but found no specific correlation with the austenite

 $^{^5} The first two digits of the alloys identified numerically, represent wt% C <math display="inline">\times 100$ and the last two digits give wt% Nb $\times 100.$

grain size or state (recrystallised or not). But the number of tests were too few to conclude no correlation as such. Williams et al. [37] reported reduced pearlite colony size but similar lamellar spacing in 0.72C-1.07Mn-0.86Cr-0.05Nb (wt%) in comparison to the non-microalloyed steel. In contrast to the discussion thus far, soluble niobium in austenite that is not thermomechanically processed, increases its hardenability. Therefore, it would lead to a lower transformation temperature, finer pearlite and stronger steel [72]. Jansto [77] evaluated 0.02 wt% Nb in eutectoid compositions to be optimum to produce finest inter-lamellar spacing.

Williams et al. [37] also studied the effect of finish rolling temperature (FRT) on the state of Nb in austenite and corresponding effect on austenite recrystallisation and strength properties. At a given level of soluble Nb, the FRT essentially controls the extent to which strain-induced precipitation in austenite and subsequent precipitation strengthening in the ferrite take place. High FRT promotes retention of Nb in solution in austenite thereby raising the capacity for precipitation strengthening of ferrite. On the other hand, a low FRT enhances strain-induced precipitation of NbCN in austenite, which causes a reduced strengthening effect, but refines the pearlite colony size. As shown in Figure 2.16a, both yield and tensile strength decrease steadily with decreasing FRT below about 1000 °C for 0.55 wt% C steels with Nb content ranging from 0.02 to 0.06 wt% Nb. This would be consistent with an increase in strain induced precipitation of NbCN in austenite with decreasing FRT at the expense of precipitation strengthening in the ferrite. The effect of FRT on the strength of 0.70 wt% C steels with 0.02-0.06 wt% Nb, is less pronounced probably on account of the lower level of Nb in solution and the likelihood that little remaining Nb would be available for precipitation hardening in the ferrite. As shown in Figure 2.16b, irrespective of carbon content, strength benefits occur upto 0.03 wt% Nb addition in 0.4-0.8 wt% C steels [37,38].

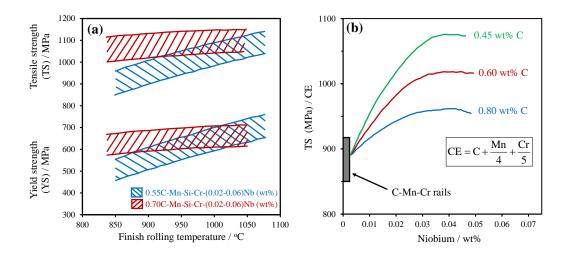


Figure 2.16: (a) Effect of finish rolling temperature and carbon content on strength of C-Mn-Cr-Nb rails. (b) Effect of Nb content on tensile strength (TS) normalized by carbon equivalent (CE) to take account of variation in composition [37,38]. All compositions are in wt%.

Williams et al. [37] and later de Boer et al. [38] gave a comprehensive compilation of strength improvements and other benefits achieved by adding Nb in high carbon steels like rails. One of the early and most important contribution to Nb-microalloyed rail steels was the development of Niobras-200 in Brazil [70]. 0.03 wt% Nb was microlloyed to 0.75C-1.25Mn-0.8Si (wt%) which resulted in fine microstructural features and improved mechanical properties (610-625 MPa yield strength, 1080-1090 MPa tensile strength with 11-12% elongation) along with good toughness, wear resistance and weldability. The other examples are summarised in Table 2.6. Table 2.6: Some examples of Nb addition in commercial rails [37,38]. Compositions are in wt%. YS and TS is yield strength and tensile strength respectively. FRT is finish rolling temperature.

Organization/Author	Findings
Domnarvets Jernverk, Swe- den (1970)	Increased TS of UIC rails by 98 MPa by Nb-microalloying which improved the wear resistance.
Belgium (1972)	Crane rails: $(0.1-0.3)$ C- $(1.7-1.9)$ Mn- $(0.4-0.6)$ Si- $(0.4-0.6)$ Cr- $(1.1-1.3)$ Cu- $(0.8-1.0)$ Ni- $(0.04-0.06)$ Nb- $(0.04-0.1)$ Al: YS=590-785 MPa, TS=1080 MPa, elongation=12%.
ISCOR, South Africa (1977)	$0.69\mathrm{C}\text{-}1.03\mathrm{Mn}\text{-}0.5\mathrm{Si}\text{-}0.7\mathrm{Cr}\text{-}0.05\mathrm{Nb}\text{:}$ Improved toughness with as high as 735MPa YS and 1215 MPa TS and 14% elongation
Australian Iron and Steel Pty. Ltd. (AIS) (1977)	0.43C-1.52Mn-0.17Si-0.29Cr-(0.025-045)Nb: YS and TS improves by 39% and 7% respectively with significantly better elongation and reduction-of-area values. Nb microalloyed rail sections (47, 53, 68, 192 kg/m) showed atleast 2-6 fold increase in rail life compared to conventional rail steels in service.
Climax Molybdenum Co., USA (1978)	0.67C-(0.61-0.88)Mn-(0.51-0.82)Cr-(0.24-0.30)Mo-0.02Nb: Ductility improved due to Nb addition at low Mo contents but no improvement in 0.3 wt% Mo steels. In the latter case, the mechanical properties were largely influenced by the proportion of bainite in the microstructure, this being increased by faster cooling rates and higher Nb contents leading to predominantly bainitic structures and relatively low strengths.
Molycorp and The Colorado Fuel and Iron Company, USA (1983)	0.74C- 0.80 Mn- 0.14 Si- $(0.015$ - 0.047)Nb: Increased YS (11.4%) and TS (4.0%) and better toughness. However, in-track tests showed no significantly improved performance over the basic rails.
Hulka et al. 1984 [84]	Grade 900 rail steel (0.70 wt% C) microalloyed with 0.06 wt% Nb showed slight increase in TS at higher FRT (1070 °C) but negligible strength change at lower FRT (1000 °C). The toughness improved significantly. Weldability remain unaffected.
Singh et al. 1995 [85]	TS improved by 40 MPa for Mn-Cr-Nb rail steel through pearlite colony interlamellar spacing refinement without any deleterious effect on weldability. 32

2.7.2 Crystallographic unit size and toughness

Definition of a pearlite nodule or colony varies in literature and procedural information on their size measurement is lacking [86]. The metallograph of pearlite microstructure is also very rough and tumble and it is difficult to determine the nodule or colony size using metallography images [87]. From toughness and crackpropagation point of view, the 'crystallographic unit' grain for pearlite is visualised as an interpenetrating bi-crystal of cementite and ferrite [2,88], bounded by high angle misorientation boundaries. Cementite orientation can change inside a single unit [3] which is composed of ferrite regions with nearly the same crystallographic misorientation [86–89]. Different critical misorientation angle criteria have been adopted in bibliography [90], ranging from 10° misorientation criterion in plain eutectoid steels by Park and Bernstein [91], to 15° in Nb-microalloyed steels [81] and 12° in the case of V eutectoid steels [92].

As discussed in section 2.6, Nb addition can produce a fine prior austenite grain size during soaking or pancaked austenite grains during hot deformation - both leading to refined 'crystallographic unit' size. Figure 2.17 compares the orientation maps of transformed microstructures for two different finish deformation temperature (FDT) ⁶ in a 0.78C-0.03Nb (wt%) steel [81]. The 'crystallographic unit' size was refined for lower FDT (=870 °C) where the transformation occurred from unrecrystallised austenite whereas for higher FDT (=1060 °C), the austenite was recrystallised.

⁶Finish rolling temperature (FRT) refers to hot deformation by rolling whereas finish deformation temperature (FDT) refers to other hot deformation experiments like hot torsion, hot compression tests etc.

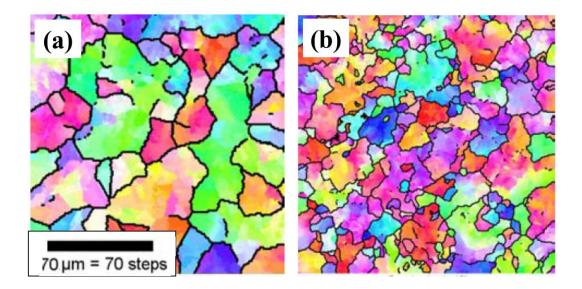


Figure 2.17: Orientation maps corresponding to (a) FDT=1060 °C, (b) FDT=870 °C, showing refined 'crystallographic unit' size at lower FDT. Copyright 2003 by The Minerals, Metals & Materials Society. Reproduced with permission [81].

Cotrina et al. [81] has observed that the cleavage fracture facet size correlates better with the 'crystallographic unit' size (>15° misorientation) than austenite grain size as shown in Figure 2.18a. The state of austenite grains ('ReX' i.e. recrystallised or 'UnReX' i.e. un-recrystallised) affects the crystallographic unit size and hence the cleavage facet size. Un-recrystallised ('UnReX') austenite grains produce finer 'crystallographic unit' grains and inturn finer facet sizes which indicate toughness improvement as shown in Figure 2.18b and c.

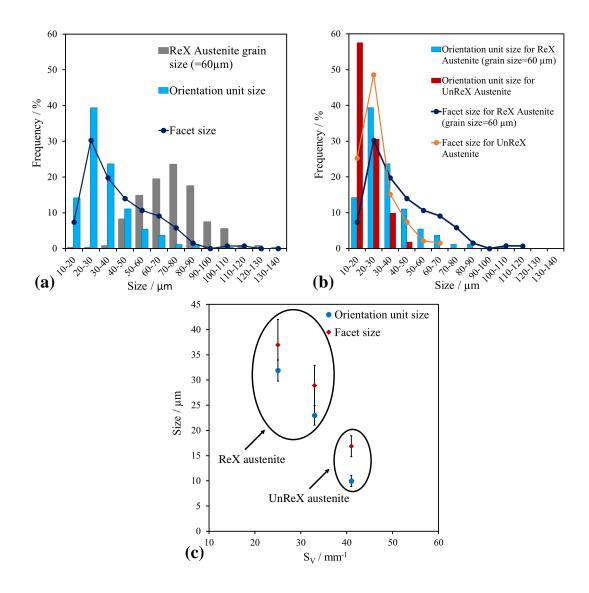


Figure 2.18: (a) Recrystallised (ReX) austenite grain size, crystallographic unit size and cleavage facet size distribution for finish deformation temperature (FDT)=1060 °C. (b) Comparison of crystallographic unit and facet size distribution for different FDT and austenite state. (c) Variation of crystallographic unit and facet size with specific grain boundary area (S_V) [81].

Wada et al. [80] reported negligible impact toughness improvement (8 J to 10 J) for 0.021 wt% Nb addition in 0.79C-1.05Mn-1.0Si steel at 860 °C FRT [Figure 2.19a]. Impact toughness properties at higher and lower FRTs are comparable for the base and microalloyed grades. But the fracture toughness improvement by upto $8 \text{ MPa m}^{1/2}$ was possible due to Nb addition as shown in Figure 2.19b⁷. These improvements may be attributed to refined microstructure from un-recrystallised

 $^{7 \}text{ units}$ are converted to $\mathrm{MPa}\,\mathrm{m}^{1/2}$ from kgf mm^{-3/2} from the original reference by Wada et al. [80]

austenite grains due to Nb addition as discussed in section 2.6.

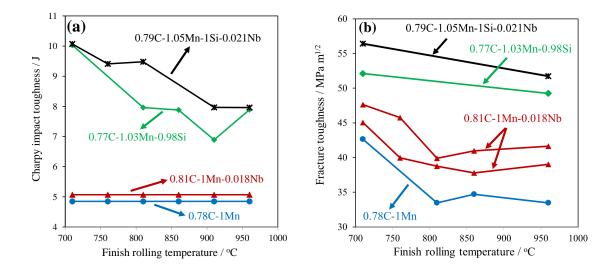


Figure 2.19: Variation of toughness with finish rolling temperature for different compositions (wt%) (a) Charpy impact toughness, (b) fracture toughness. Test temperature is $20 \,^{\circ}$ C [80].

Liu et al. [68] reported increased fracture toughness with increasing Nb content for U74 (0.67-0.80 wt% C) heavy rail steels and the maximum toughness reported is $50 \text{ MPa m}^{1/2}$ (20 °C) at 0.053 wt% Nb [Figure 2.20]. The improvement is attributed to austenite grain size refinement by fine niobium precipitates. But when the niobium content exceeds 0.073 wt%, both the amount and size of precipitates are increased in the pearlite and the coarse inclusion like precipitates [Figure 2.20b-c] act as cleavage fracture nucleation triggers, thus the fracture toughness is decreased rapidly.

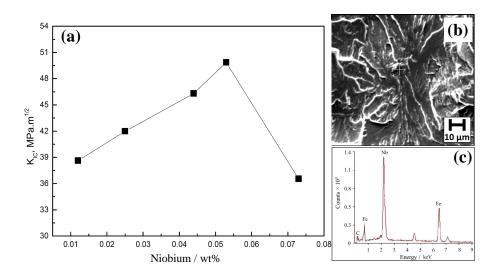


Figure 2.20: (a) Variation of fracture toughness with niobium content (wt%), (b) coarse precipitate at fracture initiation point for U74-0.073Nb (wt%) steel, (c) corresponding EDS spectra showing Nb-rich precipitates. Reproduced with permission of Trans Tech Publications [68].

2.7.3 Wear resistance

Figure 2.21 compares the wear performance of Niobras-200 [0.73C-1.38Mn-0.76Si (wt%); hardness: 314 BHN] with other non-microalloyed rail compositions [70]. Weight loss of Niobras-200 was reduced by a factor of two as compared to the softer ASTM-A-1 [0.78C-0.9Mn-0.14Si (wt%); hardness: 269 BHN] steel with similar fully pearlitic microstructure. The good wear behavior of Niobras-200 compared to other composition and microstructures, was attributed to its higher hardness due to refined pearlite morphology. Figure 2.21b shows the hardness variation across a transverse section of the specimens after wear testing. Plastic flow in similar amounts was found for Niobras-200 compared to the Cr-Mn-Si steel [0.69C-0.98Mn-0.54Si-1.1Cr (wt%); hardness: 314 BHN] and the tempered martensitic rail steel [0.64C-1.1Mn-0.22Si (wt%); hardness: 327 BHN].

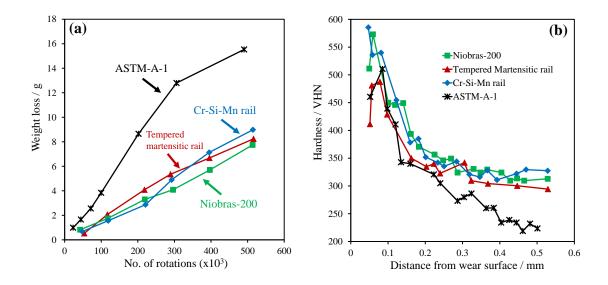


Figure 2.21: Wear performance of different rail steels. (a) Weight loss (g) v/s no. of rotations ($\times 10^3$), (b) Hardness variation across tranverse section of the wear specimens [70].

The NS-II rails [0.76C-0.82Mn-0.82Si-0.49Cr-0.005Nb (wt%)] developed by Nippon Steel Corporation (NSC), including flash butt welded joints, were tested in actual track on the FAST track (Facility for Accelerated Service Testing) [38,93]. It exhibited the lowest gauge face wear rates, smallest deformation at the weld-joints and the best performance against corrugation without grinding even after 35M gross ton of traffic [38,94]. The good performance was attributed to a good combination of tensile strength (1127-1324 MPa) and ductility (14-19%) due to austenite grain refinement by dilute niobium addition (0.005 wt%) as discussed in section (2.6.2). Due to such improved properties, the NS-II rail was widely used not only as the wear resistant rail with good weldability, but also a rail for use in cold climate countries such as Canada and Russia [38].

2.8 Effect of niobium on bainitic microstructures and properties

The direct effect of niobium on bainitic microstructures is seldom explored in the literature [26,38,95–97] but the effect of prior austenite grain size (PAGS) and recrystallisation on bainite transformation is well reviewed [15]. Reduction in PAGS should lead to an accelerated nucleation rate because of increased grain boundary nucleation sites during isothermal transformation of bainite. If the sheaf volume remains smaller than the maximum possible sheaf volume, the reaction is limited

by slow growth rate and the overall transformation rate is accelerated with reduction in PAGS. Conversely, for rapid growth from a limited number of nucleation sites, a reduction in PAGS reduces the total volume transformed per nucleus and hence retards the overall reaction rate. The two circumstances are illustrated in Figure 2.22.

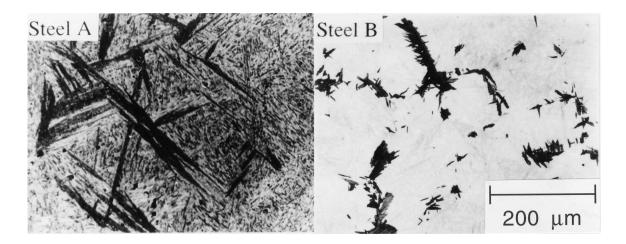


Figure 2.22: (a) Bainite in a steel A [0.12C-2.96Mn-2.03Si (wt%)] with sparse nucleation and rapid sheaf-growth, austenite grains constrain the transformation amount that each nucleus can cause. Reducing the austenite grain size causes a net reduction in the overall transformation rate. (b) Bainite in a steel B [0.96C-0.21Si-0.38Mn-1.26Cr (wt%)] with small growth rate, reducing austenite grain size imply promote the nucleation rate [15,98]. Reproduced with permission from Taylor and Francis.

The typical cementite-free bainite compositions for rails eg. 0.2C-2Mn-2Si (wt%) can be expected to follow Figure 2.22a i.e. with Nb-microalloying, a reduced PAGS would retard overall bainite transformation. Increased Nb as solute in austenite can also retard bainite nucleation for slow cooling rates i.e. when the driving force for transformation is low [95]. While significant, the effect is rather small. But it was indicated that a small amount of niobium carbide precipitation, if allowed, can significantly enhance bainite transformation by acting as new nucleation sites [95].

Nb-microalloying retards austenite recrystallisation and unrecrystallised austenite is susceptible to mechanical stabilisation during martensitic or bainitic transformation i.e. during growth, the motion of the glissile transformation interface is hindered by the accumulation of dislocation debris in the austenite [99,100]. A comprehensive review of the theoretical basis and experimental evidences of the effect of mechanical stabilisation on the bainitic transformation are given in 'Bainite in Steels' by Bhadeshia [15]. Heterogeneous nucleation becomes more frequent as defects are introduced in the austenite but the growth by a displacive mechanism is stifled as the interface encounters forests of dislocations. The transformation start may accelarate but the overall transformation kinetics becomes slower. The maximum attainable fraction of bainite decreases but the platelets are refined. In Nb-microalloyed steels, the strain-induced niobium-rich precipitates along with the dislocation forest, can also hinder the movement of the austenite to bainite transformation interface [96]. The recovery of dislocation structure in austenite may also be modified due to strain-induced precipitation and the precipitates may in turn influence bainite nucleation [15].

Figure 2.23a-b shows optical micrographs of bainite transformed isothermally from undeformed and deformed austenite in a non-microalloyed composition [0.45C-2.08Si-2.69Mn (wt%)] but demonstrates the large effect of mechanical stabilisation in the refining the microstructure and in reducing the amount of bainite [15]. The bainitic ferrite inherits the parent dislocation structure and there are corresponding changes in its crystallographic orientation and growth direction as well. This is illustrated in the optical micrograph shown in Figure 2.23c, where the bainite sheaves appear on a macroscopic scale to be curved. They are in fact following the deformation-induced misorientations within the austenite grains [97].

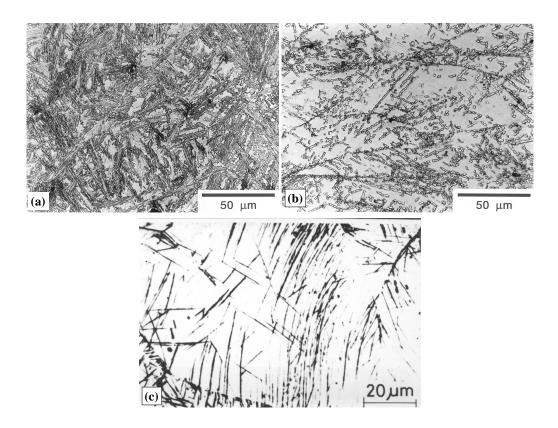


Figure 2.23: Mechanical stabilization of bainite (a) transformation from undeformed austenite, (b) transformation from deformed austenite. Reproduced with permission from Taylor and Francis. (c) 'Curved' bainite growth in deformed austenite [15, 97,99,100]. Printed in Hot Workability of Steels and Light AlloysComposites and reproduced with permission from the Canadian Institute of Mining, Metallurgy and Petroleum.

De Boer et al. [38] reviewed the experimental results on Nb-microalloyed bainitic rails [(0.2-0.55)C-(0.4-0.45)Si-(0.4-2.1)Mn-(0-2.0)Cr-(0-0.15)Nb-(0-0.1)V (wt%)] developed by NKK, Japan [26]. Niobium addition is considered to improve not only strength by precipitation hardening, but also toughness by microstructural refinement. Tensile strengths varied from 810 to 1430 MPa depending upon the composition. U-notch charpy impact toughness of a 1420 MPa bainitic steel (~40 J at 20 °C) was reported twice of that of a 1300 MPa pearlitic steel (~20 J at 20 °C). The wear resistance was comparable under 1.4 GPa contact pressure. Other properties like shelling and flaking resistance, rolling contact fatigue performance, plane strain fracture toughness ($K_{1c} \sim 98 \text{ MPa m}^{1/2}$) of the Nb-microalloyed bainitic rails were reported superior to head-hardened premium pearlitic rails and expected to exhibit excellent performance in heavy haul railroads.

2.9 Summary

The important findings from this review are:

- Pearlitic steels with fine interlamellar spacing are hard but not necessarily tough as the pearlite colony size controls toughness. Cementite-free bainitic rails are hard as-well-as tough owing to fine bainitic ferrite plates and cementite-free retained austenite films.
- The solubility of niobium decreases with increasing carbon concentrations even at higher carbon levels (>0.8 wt% C) in austenite in contradiction to some analysis reporting increased niobium solubility at high carbon levels. Silicon decreases niobium solubility in austenite which affect high silicon cementitefree bainitic compositions.
- Due to low niobium solubility in high carbon austenite and high silicon low carbon austenite at reheating temperatures, there may be undissolved coarse carbides which coarsen rapidly. Nb composition must be adjusted so that the coarse carbides can be taken into solution during reheating. Even if carbides remain undissolved, they should not be harmful if NbC precipitates are small in size.
- A controlled addition of niobium leads to substantial grain refinement for the lower degrees of deformation experienced by the head of the rail. Strength levels are improved by precipitation strengthening and/or microstructure refinement which in turn improves the wear-resistance.
- Though some fundamental research have been carried out to study the effect of niobium on bainitic rail compositions, industrial scale studies on low silicon Nb-microalloyed bainitic rails are very rare. For high silicon cementite-free bainitic rails, it is more unlikely that any commercial Nb-microalloyed rails have been produced and studied till date.

Chapter 3

Statement of objectives

The present work is formulated, to address the microstructure and mechanical properties of both pearlitic and cementite-free bainitic rails with the aim of achieving a new technology based on niobium microalloying. The proposed research will focus on:

- development of a niobium microalloying strategy in the context of standard rail production methods, including the fact that deformation through the rail section will not be homogeneous;
- development of a viable thermo-mechanical processing route for niobium microalloyed rail steels;
- creation of a pancaked austenite grain structure, with an examination of the consequences on the final product;
- creation of a refined pearlitic structure and possibly one containing fine NbC precipitates;
- cover the totally new area of microalloying the cementite-free high-silicon bainitic rails;
- development of a generic strategy for the use of niobium in high carbon steels.

Chapter 4

Thermodynamic calculations and microsegregation

4.1 Introduction

To add niobium as a microalloying element in high carbon (0.6-0.8 wt% C) pearlitic steels and low carbon (0.2-0.4 wt%) cementite-free bainitic steels, thermodynamic and microsegregation calculations are carried out to investigate optimum niobium addition. In particular, the goal is to ensure that any niobium carbide precipitated from solute-enriched liquid due to segregation, can be taken into solution in austenite that is reheated to temperatures upto $1300 \,^{\circ}\text{C}$ prior to hot rolling. Sometimes, a more energy efficient process limits the reheating temperature to $1200 \,^{\circ}\text{C}$, which imposes greater restrictions on the permitted niobium concentration.

4.2 Thermodynamic calculations

The commercial software MatCalc with 'mc_sample_fe.tdb' database, which is similar to MTDATA TCFE database (Figure 2.9), is utilised where Fe-Nb-C description for the database is based on the assessment by Lee [52]. The base compositions used for this study are enlisted in Table 4.1 with Nb concentrations varying from 0.005-0.03 wt%. Figure 4.1 shows typical equilibrium phase fraction diagrams and Table 4.2 lists the transformation temperatures. Depending upon the reheating temperatures, the maximum soluble niobium in austenite for the pearlitic and bainitic compositions are summarized in Table 4.3.

Steel	С	Mn	Si	Cr	Мо	Nb
Pearlitic	0.78	1.0	0.4			0.005-0.03
Bainitic	0.22	2.0	1.9			0.000 0.00

Table 4.1: Base compositions for calculation (wt%)

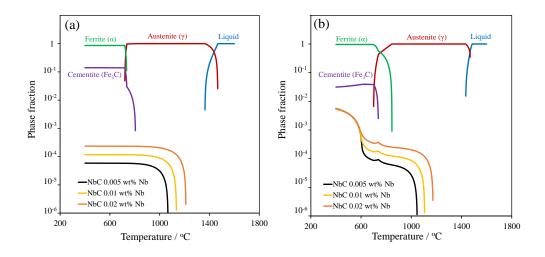


Figure 4.1: Equilibrium phase fraction calculation for (a) pearlitic steel, (b) bainitic steel.

Table 4.2: Equilibrium transformation temperatures (°C): T_L : Liquidus, T_S : Solidus, T_{NbC} : Equilibrium NbC precipitation/ dissolution temperature and V_{NbC} is equilibrium NbC mass fraction at A_{e_3}

Steel	Nb/ wt $\%$	T_L / °C	$T_S/$ °C	$A_{e_3}/$ °C	$A_{e_1}/$ °C	$T_{\rm NbC}/$ °C	$V_{\rm NbC}$
Pearlitic	0.005					1068	0.0000568
	0.01	1467	1363	806	719	1136	0.000115
	0.02			800	113	1213	0.000233
	0.04					1296	0.000467
	0.005	1484	1432	846	699	1047	0.0000602
Bainitic	0.02					1174	0.000251
Baintuc	0.03	1404				1216	0.000377
	0.06					1294	0.000756

Steel / Reheat tempera- ture	1200°C	1250 °C	1300°C
Pearlitic	0.19	0.029	0.04
Bainitic	0.025	0.036	0.06

Table 4.3: Maximum niobium (wt%) soluble in austenite for pearlite and bainitic compositions at different reheat temperatures.

4.3 Calculations for microsegregation

The basic methodology for estimating microsegregation is to calculate the composition of the last solidifying residual liquid during cooling from the liquid state. This is assumed to correspond to the solute enriched region due to microsegregation. Now, considering the composition of residual liquid, the dissolution temperature, written $T_{\rm NbC}^{seg}$ with the superscript denoting the solute enriched region, of the niobium carbides in the solute enriched regions has been calculated. Ideally, the optimum Nb concentration should be decided based on the condition that $T_{\rm NbC}^{seg}$ must be less than the reheating temperature (1200-1300 °C) if all the Nb is to be taken into solution. The different solidification models which have been considered for the calculations are described below.

4.3.1 Equilibrium or lever-rule model

The lever-rule model involves equilibrium solidification. It assumes complete diffusion to equilibrium of all alloying elements in both the liquid and the solid phases. The model is represented as [101]:

$$C_{L,i} = \frac{C_{0,i}}{1 - (1 - k_i)f_s} \tag{3.1}$$

where $C_{L,i}$ is the concentration of a given solute 'i' in the liquid, $C_{0,i}$ is the initial concentration in the liquid, k_i is the equilibrium partition coefficient for that element, and f_S is the solid fraction.

In MatCalc, the 'mc_sample_fe.tdb' database and 'Fe, C, Mn, Si, Cr, Mo, Nb,

Va' system with 'Liquid, FCC_A1, BCC_A2, Cementite' phases are considered for calculations. The compositions in Table 4.1 are given as input. The equilibrium is calculated at 1600 °C and set as start values. Then the 'stepped equilibrium calculation' is done by varying the temperature from 1600 °C to 1000 °C in steps of 1 °C. The composition of the last solidifying liquid reflects the segregated region composition.

4.3.2 Scheil model

The Scheil equation or the 'non-equilibrium lever rule' assumes that there is no diffusion in the solid phase, but complete mixing in the liquid and local equilibrium at solid-liquid interface. This is represented as [101]:

$$C_{L,i} = \frac{C_{0,i}}{(1-f_s)^{1-k_i}} \tag{3.2}$$

In MatCalc, the 'Scheil calculation' dialog box is utilised with 'liquid' as the dependent phase. The temperature is varied from 1600 °C to 1000 °C in steps of 1 °C. The composition of the residual liquid will depend on the terminating liquid fraction. In order to be able to remove the equilibrium content of solid phases from the system after each temperature step, MatCalc creates copies of all phases except the dependent ('liquid') phase. The new phases have the name of the original phase plus the suffix '_S' which denotes that the corresponding phase is a 'solid' phase [102].

4.3.3 Scheil model with carbon back-diffusion

In the classical Scheil approach, the assumption is made that the diffusion of elements in the liquid is infinitely fast while that in the solid is negligibly slow. These assumptions may be reasonable for the conditions during solidification, if only substitutional elements are considered. For interstitial elements, however, the second assumption is hardly valid since they are fast diffusers. After being rejected into the liquid phase within each solidification step of Scheil calculations, elements, such as C and N, are capable of diffusing rapidly also in the solid phase and establish partial equilibrium between the liquid and solid phases. This process is known as back-diffusion [101,102]. Brody and Flemings [103] derived the following equation to deal with this:

$$C_{L,i} = C_{0,i} \left[1 - (1 - 2\alpha k_i) f_s \right]^{\frac{(k_i - 1)}{(1 - 2\alpha k_i)}}$$
(3.3)

where the back-diffusion coefficient α is defined as:

$$\alpha = \frac{D_i t_f}{(0.5\lambda)^2} \tag{3.4}$$

where D_i is the diffusion coefficient of solute '*i*' in the transformed solid phase in $\text{cm}^2 \text{s}^{-1}$, t_f is the solidification time in seconds and λ is the secondary dendritic arm-spacing in cm.

In MatCalc, the allowance is made by checking 'yes' for carbon back diffusion in the 'Scheil calculation' dialog box [102]. The rest of the procedure is similar to that of section 4.3.2. After each temperature step, MatCalc sets up a para-equilibrium calculation, where all elements without back-diffusion have fixed composition variables and only the elements with back-diffusion are unconstrained. By that means, carbon is always brought back into equilibrium with regard to the solid and liquid phases after a regular Scheil simulation step is carried out.

As mentioned in section 4.3.2, the composition of the residual liquid will depend on the terminating liquid fraction. MatCalc recommends a 3% residual liquid criterion in case of faster cooling rates during solidification and 1% residual liquid for slow cooling conditions such as during the casting of heavy components [102]. Back-diffusion of slowly diffusing substitutional species becomes more prominent if the residual liquid fraction becomes rather small. Also, back-diffusion generally limits the maximum amount of liquid enrichment. For practical simulations, this effect can be accounted for by assuming final solidification at slightly larger residual liquid fraction, i.e. at values between 3% and 5% [104]. Other literature [105–107] reported 5-10% as residual liquid fractions to calculate the segregated composition.

4.3.4 Calculation results for segregated composition

Figure 4.2 compares the calculations by different solidification models in MatCalc for 0.03 wt% Nb concentrations. Figure 4.2a compares the fraction solidified with temperature while Figures 4.2b and 4.2c compare the variation of composition of C and Nb in liquid with temperature during solidification. The downward bend of Nb concentration in Figure 4.2c for Scheil model calculations with or without carbon back-diffusion is due to the occurrence of primary precipitation of NbC in 'liquid+austenite' region during solidification.

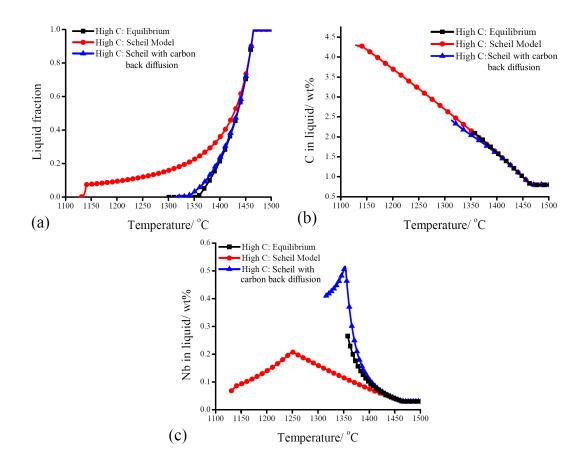


Figure 4.2: MatCalc calculations for pearlitic (high C) steel with 0.03 wt%Nb. (a) Liquid fraction versus temperature, (b) C in liquid versus temperature, (c) Nb in liquid versus temperature.

From Figure 4.2a, the opposite limiting characteristics of the two solidification models i.e. 'equilibrium or lever-rule' and 'Scheil' models can be clearly observed. The former calculates the lowest level of segregation and the latter represents the highest level of segregation possible in the system. In order to predict microsegregation during steel solidification, finite non-zero diffusion must be considered, at least in the solid phase and allowing for carbon back-diffusion enables a more practical calculation by creating a balance between the above mentioned two models. As soon as final solidification has completed, the fast diffusers rapidly establish partial equilibrium again, which practically means that the fast elements diffuse away from the previous residual liquid regions because their solubility is now comparable to the surrounding regions. In a first and rough approximation, this effect can be accounted for by assuming that the fast diffusers like carbon distribute homogeneously in the segregated microstructure and the segregated carbon composition is replaced by the nominal carbon composition [104].

Tables 4.4 and 4.5 list the carbon homogenized segregated composition at differ-

ent residual liquid fraction and corresponding NbC dissolution temperature $(T_{\rm NbC}^{seg})$ at segregated regions.

Table 4.4: Pearlitic steel segregated region composition (wt%) after carbon homogenization. T_P and L_P denotes, respectively, the temperature (°C) and residual liquid (mass%) at which the primary precipitation of NbC from liquid, starts. W_P denotes the mass fraction of primary carbides.

Bulk Nb/ wt%	Residual liquid	С	Mn	Si	Cr	Nb	$T_{\rm NbC}^{seg}$	W_P	$T_P(L_P)$
	10%	0.78	1.91	0.71	0.92	0.03985	1300	-	
0.005	5%	0.78	2.27	0.77	1.11	0.07234	1349	-	1337~(0.5%)
	1%	0.78	3.35	0.81	1.78	0.31455	1390	-	
	10%	0.78	1.90	0.70	0.92	0.07863	1354	-	
0.01	5%	0.78	2.28	0.77	1.12	0.14698	1370	-	1344~(1.2%)
	1%	0.78	3.30	0.79	1.75	0.46699	1403	8.55×10^{-6}	
	10%	0.78	1.90	0.70	0.92	0.15886	1375	-	
0.02	5%	0.78	2.26	0.76	1.11	0.28786	1392	-	1351~(2.5%)
	1%	0.78	3.31	0.78	1.76	0.46912	1403	8×10^{-5}	

Table 4.5: Bainitic steel segregated region composition (wt%) after carbon homogenization. T_P and L_P denotes, respectively, the temperature (°C) and residual liquid (mass%) at which the primary precipitation of NbC from liquid, starts. W_P denotes the mass fraction of primary carbides.

$\frac{\rm Bulk~Nb}{\rm wt\%}$	Residual liquid	С	Mn	Si	Cr	Mo	Nb	$T_{\rm NbC}^{seg}$	W_P	$T_P(L_P)$
	10%	0.22	2.57	2.97	0.61	1.40	0.03487	1275	-	
0.005	5%	0.22	2.55	3.25	0.74	2.06	0.06352	1359	-	1370 (0.4%)
	1%	0.22	2.49	3.68	0.83	4.43	0.23924	1385	-	
	10%	0.22	2.57	2.97	0.61	1.39	0.06894	1354	-	
0.01	5%	0.22	2.54	3.24	0.74	2.03	0.12397	1386	-	1377~(0.9%)
	1%	0.22	2.47	3.64	0.84	4.42	0.47088	1403	-	
	10%	0.22	2.57	2.97	0.61	1.41	0.14019	1399	-	
0.02	5%	0.22	2.53	3.22	0.75	2.02	0.24697	1400	-	1385~(1.8%)
_	1%	0.22	2.45	3.60	0.84	4.41	0.53635	1405	4.34×10^{-5}	

Even if 10% residual liquid is taken to be the point where segregation is assessed i.e. the least level of segregation is considered, to maintain the $T_{\rm NbC}^{seg}$ below 1300 °C, the Nb concentration must be less than 0.005 wt% for both the pearlitic and bainitic steel. The NbC volume fraction may not then be significant to affect the austenite grain size. Greater concentrations may lead to NbC in the segregated regions that do not dissolve during reheating at 1200-1300 °C, causing potential problems in rolling contact fatigue. However, this can be mitigated if the size of the undissolved carbides remains small.

4.4 Summary

Niobium addition is limited by the maximum niobium that can be soluble in austenite at reheating temperatures. This can be calculated by commercial thermodynamic software and database. Any niobium concentration beyond that, will form carbides that can not be dissolved in austenite at corresponding reheating temperatures. Even when the niobium addition is less than the maximum soluble niobium in austenite, microsegregation leads to solute enrichment in liquid and eventually formation of primary niobium carbides that precipitate from liquid. To dissolve these primary carbides in the segregated austenite, the dissolution temperature required is way higher than the standard 1200-1300 °C reheating temperatures and the carbides will remain undissolved. To mitigate potential problems in rolling contact fatigue, it is essential to either avoid the formation of the primary carbides or to control their size fine enough by controlling casting parameters so that the undissolved carbides cannot be harmful to the mechanical properties.

Chapter 5

Experimental details

5.1 Alloys

Based on the alloy design considerations in Chapter 4, the following steel melts were manufactured on our behalf at OCAS, Belgium, using a vacuum induction furnace. The final compositions (Table 5.1) in the cast were analyzed by spark source optical emission spectroscopy and by combustion analysis for C, S, N and O. The alloys are identified using the characters 'P' or 'B' to represent pearlitic or bainitic steels respectively, followed by two digits representing wt% C ×100 and final two digits representing wt% Nb ×100.

Alloy	С	Mn	Si	Cr	Mo	Nb	Р	S
P7802	0.78	1.0	0.42	0.55	-	0.02	0.0026	0.0013
P7901	0.79	0.98	0.41	0.57	-	0.011	0.0022	0.0005
P7600	0.76	1.0	0.42	0.53	-	-	0.0023	0.0007
B4002	0.40	2.0	1.5	1.0	0.36	0.023	0.0037	0.0026
B4101	0.41	1.96	1.52	1.01	0.31	0.011	0.0021	0.0007
B2102	0.21	2.0	1.9	0.54	0.52	0.019	0.0023	0.0007
B2200	0.22	2.0	1.9	0.54	0.47	-	0.0026	0.001

Table 5.1: Composition of experimental alloys (wt%)

Each cast weighed 100 kg, but after removal of the 'head' of the ingot (which contained porosity), approximately 55-60 kg of material remained available. After casting and cutting off the 'head', 4 blocks of $125 \times 125 \times 95$ mm³ were cut from each cast and hot rolled to 30 mm (reduction ratio 0.68). Table 5.2 lists the rolling schedule. A slice of $125 \times 125 \times 10 \text{ mm}^3$ was cut from each ingot to analyse the cast material. Cooling rates for 30 mm thick plates are close to those at the centre of a rail-head [24].

Alloy	Reheating temperature and time	Hot Rolling	Initial	Pass 1	Pass 2	Pass 3	Pass 4	Pass 5	
P7802 1300 °C B4002 - 2 h		Reduction/ % Temperature/ °C	- 1300	$15 \\ 1280$	$20 \\ 1250$	$\frac{22}{1200}$	$22 \\ 1150$	23 980	
	Thickness/ mm	95	81	64	50	39	30		
P7901	$1200^{\mathrm{o}}\mathrm{C}$	Reduction/ $\%$	-	10	23	23	22	20	Air
B4101	- 2 h	Temperature/ $^{\rm o}{\rm C}$	1200	1180	1150	1100	1050	950	Cooling
		Thickness/ mm	95	85	66	51	39	31	
P7901 P7600	1900.00	Reduction/ $\%$	-	11	24	24	22	22	
B2102	1200 °C - 2 h	Temperature/ $^{\rm o}{\rm C}$	1200	1180	1150	1100	1020	870	
B2200		Thickness/ mm	95	85	64	49	38	30	

Table 5.2: Hot rolling schedule

5.2 Dissolution kinetics of precipitates in austenite

A steel not designed for rails (Table 5.3), coded as 'SB02', was studied initially to evaluate the dissolution kinetics of coarse niobium carbide precipitates in a high carbon (0.83 wt% C) and high niobium (0.019 wt% Nb) composition. The material was received in the form of a 150 mm diameter steel shaft made by Tata steel Europe for Rolls-Royce plc, and was cooled slowly through the temperature range of 700 °C-550 °C to ensure that the initial microstructure is pearlitic in order to avoid possible cracking associated with martensitic transformation.

Table 5.3: Composition (wt%) of 'SB02' steel

С	Mn	Si	Cr	Mo	Al	Cu	Co	Sn	V	Ti	Nb
0.83	2.39	1.76	1.456	0.224	0.046	0.12	1.55	0.027	0.112	0.013	0.019

To study the dissolution kinetics of the precipitates, samples were cut from asreceived material and sealed in quartz tubes. The tubes were heated at 1300 °C in a muffle furnace for different time intervals i.e. 0.5, 1, 2, 4, 8, 16 and 32 h followed by water quenching. In a similar fashion, selected as-cast alloys from Table 5.1 were also sectioned and sealed in quartz tubes and heated at 1200-1300 °C depending upon their respective reheating temperatures, for different time intervals followed by water quenching. The heat-treated and quenched samples were metallographically polished, etched and observed using scanning electron microscopy to study the precipitates.

5.3 Microstructural characterisation

5.3.1 Sample preparation for metallography

Cross-sectional samples from the as-cast and as-rolled materials, were hot-mounted in conductive bakelite and prepared for metallographic study by grinding using silicon carbide emery papers (800-grade to 4000-grade), followed by polishing with 1 μ m paste on a polishing cloth. Samples were etched with 2% nital (2% nitric acid, 98% methanol) to reveal the microstructure. Optical microscopy and scanning electron microscopy (SEM) together with energy dispersive spectroscopy (EDS) have been used to analyse the microstructures and to identify the precipitates and measure their size distributions.

Unmounted sections were prepared in a similar fashion and final polished with $0.25 \,\mu\text{m}$ colloidal silica on a polishing cloth, before ultrasonically cleaning with acetone and then using for X-ray analysis and electron back-scatter diffraction study.

Thin foil samples for transmission electron microscopy were prepared from 3 mm diameter discs, punched out from 200 mm thick foils. The discs were ground down to $\sim 50 \,\mu$ m thickness using 1200-2500 grade silicon carbide emery papers and then, thinned by electropolishing using a twin jet electropolisher set to 26-27 V at 7-10 °C. The electrolyte consisted of 5% perchloric acid, 15% glycerol and 80% methanol by volume.

5.3.2 Optical microscopy

All of the optical microscopy work, with magnification in the range 50-500X, was performed in both Olympus BH optical microscope and Leica Microsystems DM2500M upright light microscope. Both the microscopes are attached with DFC295 cameras for recording the micrographs. Leica Application Suite software and ImageJ were used for minor digital enhancements (e.g. cropping, addition of scale bars, brightness and contrast adjustments) and quantitative analysis (e.g. precipitate and grain size measurements).

5.3.3 Scanning electron microscopy

Scanning electron microscopy (SEM) was carried out using a Camscan MX 2600 field-emission gun (FEG) microscope, fitted with an Oxford Instruments detector for energy dispersive X-ray spectroscopy (EDS), to characterise the niobium containing precipitates in back-scatter electron mode as well as to study the fracture surface morphology of the mechanically tested (tensile and impact test) samples in secondary electron mode. The pearlitic and baintic microstructures were studied using a Phenom ProX desktop SEM with a back-scatter detector and an integrated EDS system for chemical analysis.

5.3.4 Electron back-scatter diffraction

Electron back-scatter diffraction (EBSD) was carried out using a FEI Nova NanoSEM, fitted with a Bruker EBSD camera. A voltage of 20 kV and a working distance of 15 mm were used. The post-processing analysis was carried out using AZtecHKL Channel 5 software.

5.3.5 Transmission electron microscopy

A FEI Tecnai Osiris 80-200, fitted with EDS detectors, was used for scanning transmission electron microscopy (STEM) in bright field (BF), high-angle annular dark field (HAADF) imaging mode and selected area diffraction (SAD) mode with an accelerating voltage of 200 kV.

5.3.6 X-ray diffraction

A Bruker D8 DAVINCI X-ray diffractometer was used with the Bragg-Brentano geometry under continuous scanning mode over a range of $2\theta = 25^{\circ} - 120^{\circ}$ with unfiltered CuK_{α} radiation. The machine was operated at 40 kV and 30 mA with a scan step of 0.05° and dwell time of 14 s per step. Either of HighScore Plus or MAUD X-ray diffraction analysis software was utilised to identify peak positions and phases and for peak fitting. Quantitative phase analysis was performed using Rietveld refinement and the retained austenite volume fraction in the cementite-free bainitic samples was calculated from the integrated austenite and ferrite peaks,

5.4 Thermomechanical experiments

To study the effect of hot deformation on Nb-microalloyed austenite, uniaxial compression tests were carried out using $\phi 8 \text{ mm} \times 12 \text{ mm}$ cylindrical samples in a Thermecmastor Z thermomechanical simulator. Some experiments were carried out using $\phi 5 \text{ mm} \times 10 \text{ mm}$ cylindrical samples in a DIL805D dilatometer (Make: TA instruments) (Figure 5.1a) to control the deformation strain, strain rate, cooling rate, sample dimensions and load, more accurately. The cylindrical samples were prepared from the as-rolled materials and reheated at 1200 °C for 2 h and helium-cooled at high cooling rate ($\sim 50 \text{ °C s}^{-1}$) thereafter to take as much as niobium into solution before hot deformation. Typical thermomechanical processing schedules are shown schematically in Figure 5.1b. Depending on double-pass or multi-pass testing (Chapter 8), the typical parameters are: heating rate = 10 °C s⁻¹, strain per pass = 0.15-0.5, strain rate = 5 s⁻¹, cooling rate between deformations = 1-5 °C s⁻¹ and inter-pass time = 50 s etc.

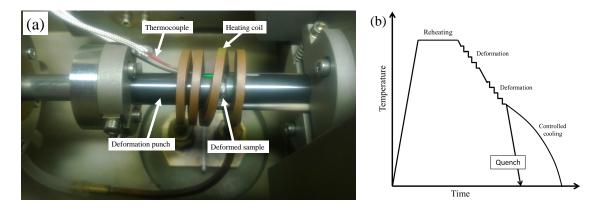


Figure 5.1: (a) Inside DIL805D deformation dilatometer and (b) Schematic representation of thermo-mechanical schedules.

To study the austenite grain structure after deformation, the quenched samples were tempered at 500 °C for 24 h before preparing for metallographic study by standard grinding and polishing techniques. Austenite grain boundaries were revealed by etching with Marshall's reagent (Stock solution A: $100 \text{ ml H}_2\text{O} + 8 \text{ g}$ oxalic acid + 5 ml H₂SO₄ mixed with equal parts of stock solution B: 15% H₂O₂). 2% nital were used to reveal the transformed pearlitic and bainitic microstructures.

5.5 Mechanical testing

5.5.1 Hardness measurement

Bulk hardness was measured using Vickers hardness tester applying 30 kg dead load. The average of the two diagonal lengths of the projected square indentation made by the pyramidal indenter was measured optically and the hardness was measured under constant load using equation 5.1:

$$HV \sim \frac{0.1891F}{d^2} \tag{5.1}$$

where, F is the applied load in newtons and d is the measured diagonal length of the indentation in mm. A gap equal to at least 2.5d between two nearest indentations were maintained in order to avoid the increase in hardness due to the work-hardening of the deformed structure due to indentation. At least ten indentations were taken for each structure, readings of which were averaged out during reporting. The standard deviation (S.D.) of the measurement was taken to calculate the statistical standard error $(S.D./\sqrt{N})$, where, N is the number of indentations made.

5.5.2 Tensile and Charpy impact testing

The tensile properties and Charpy impact toughness values for selected alloys are evaluated according to EN 13674-1 [108] and ASTM E-23 [109] respectively. The standard sample designs are shown in Figures 5.2 and 5.3. The longitudinal (L) and transverse (T) orientation of the tensile and Charpy V-notch samples are shown schematically in Figure 5.4.

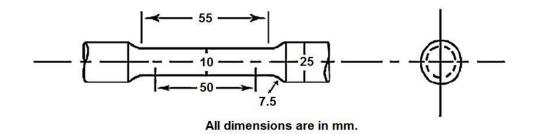


Figure 5.2: Standard cylindrical tensile specimen according to EN 13674-1 [108].

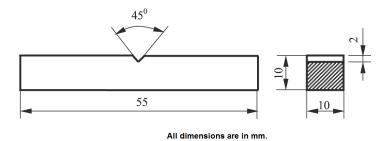


Figure 5.3: Standard Charpy impact specimen according to ASTM E-23 [109].

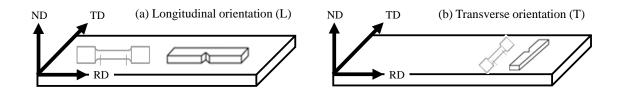


Figure 5.4: (a) Longitudinal orientation (L) and (b) transverse orientation (T). RD, ND, TD denote the rolling direction, normal and transverse to rolling direction, respectively.

5.5.3 Rolling-sliding wear testing

A twin-disk rolling contact machine was used to evaluate the wear performance of the investigated compositions. The rail and the wheel specimens (Figure 5.5) were mounted on the top and lower shaft respectively, which were driven by a motor and a combination of gears, as shown in Figure 5.6. The twin-disk configuration produces a situation similar to acceleration in a wheel-rail system, in that the motion of the contact point and shear traction were in opposite directions for the rail specimen and in the same direction for the wheel specimen [12]. For a given specimen, the relative direction of motion of the counterface defined the direction of the traction force. The variable number of teeth at gear F (Figure 5.6) allows the test to be carried out at different slip ratios.

For a bottom shaft speed (v_W) measured at 135 rotations per minute (rpm), the slip ratio and slip distance calculations are summarised in Table 5.4. The top shaft speed (v_R) is calculated as:

$$v_R = v_W \times \frac{n_D}{n_F} \tag{5.2}$$

where n_F is the variable number of teeth at gear 'F' and n_D is number of teeth at gear 'D'(=80). The slip ratio is calculated as:

$$\text{Slip ratio} = \frac{\pi}{1000} (v_W D_W - v_R D_R) \tag{5.3}$$

where D_W and D_R are the wheel and rail disk diameters respectively.

The composition and heat treatment for standard wheel specimens are listed in Table 5.5. The wear tests were carried out at 25% slip ratio without any lubrication. The Vickers hardness (HV 30) of each disc was measured at three positions and the average of these measurements was used as the disc hardness. The contact stress was 560 MPa for hardness up to 320 HV 30 and 750 MPa for hardness above 320 HV 30. The discs were weighed accurately before and after the test. Each test was run initially for 213 cycles to have a common reference point for initial weight measurement and then run to 2130 cycles i.e. total 2130-213=1917 cycles of wear. The output is weight loss in mg m⁻¹ of slip.

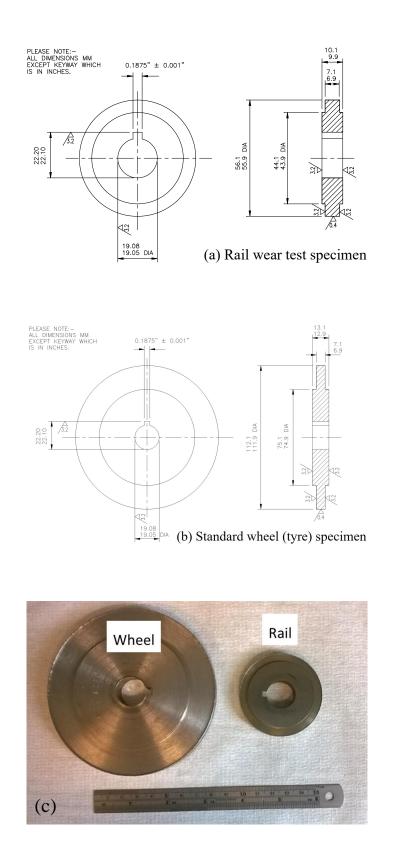


Figure 5.5: Engineering drawing for (a) rail wear test specimen, (b) standard wheel (tyre) specimen. (c) Actual rail and wheel test specimen.

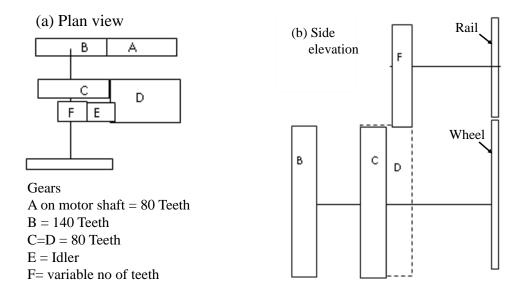


Figure 5.6: Schematic configuration of gears in twin-disk wear test machine: (a) plan view, (b) side elevation.

Table 5.4: Top shaft speed and slip ratio for different teeth number at gear 'F' at 135 rpm bottom shaft speed.

Slip ratio / $\%$	Top shaft speed / rpm
5	257.1
10	245.5
15	234.8
20	225
25	216
	5 10 15 20

Table 5.5: Standard wheel (tyre) disk composition and heat treatment.

С	Mn	Si	Cr	Ni	Mo	Cu	Sn	Р	S	Heat treatment
0.51	0.74	0.27	0.14	0.16	0.04	0.20	0.02	0.014	0.029	820 °C-1 h holding and air-cooled in 150 mm diame- ter

Chapter 6

Precipitation and dissolution kinetics

6.1 Precipitates in as-cast material

Figure 6.1 shows low magnification scanning electron micrographs of the representative pearlitic and bainitic alloys in the as-cast condition. The dark and light patches due to chemical segregation are clearly visible in Figure 6.1b for Mn and Si rich bainitic alloys but not as apparent in the case of the pearlitic alloy. This is because the entire cast transforms into pearlite, whereas in the case of the bainitic steels, the solute enriched regions are likely to contain some martensite and hence etch lighter. The arrows mark the niobium carbides in the segregated regions and the high magnification SEM micrographs of such carbides are shown in Figure 6.2. The corresponding energy-dispersive spectra (Figure 6.1c) show only Nb peaks associated with the precipitates. The eutectic or dendritic type of morphology of the precipitates indicates that these niobium carbides form directly from the residual liquid during solidification. These are henceforth termed as 'primary precipitates'. As shown in Tables 3.3 and 3.4, theoretical calculations require Scheil solidification to terminate within 1-3% residual liquid fraction to start forming primary niobium carbides from residual liquid.

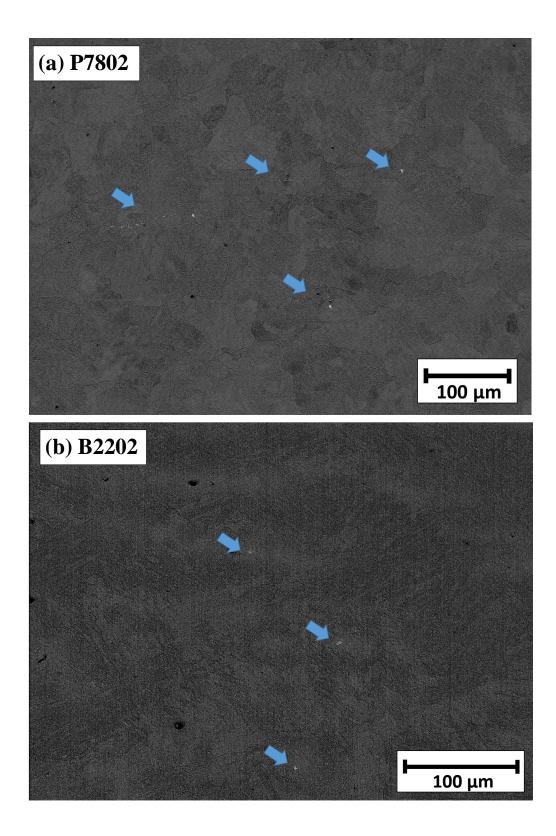


Figure 6.1: As-cast microstructure (a) P7802, (b) B2202. The arrows mark niobium carbides.

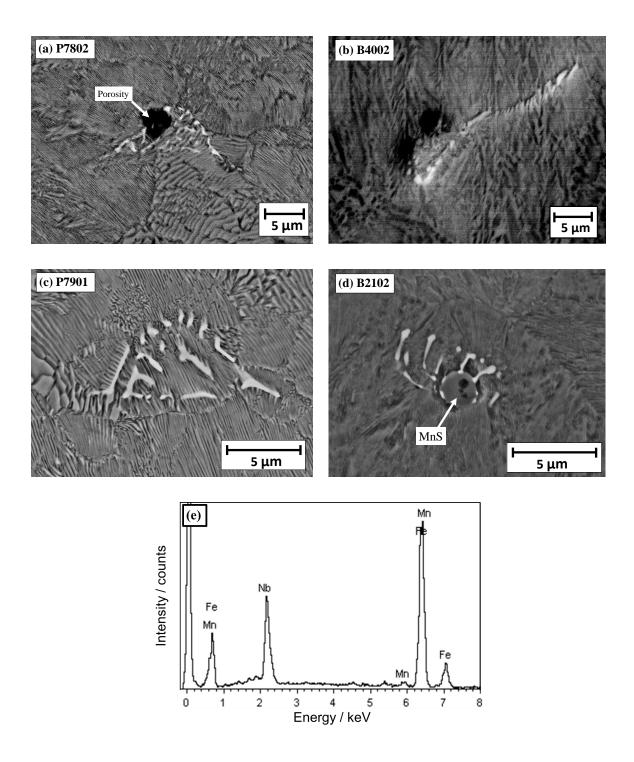


Figure 6.2: Primary niobium carbides in as-cast (a) P7802, (b) B4002, (c) P7901, (d) B2102. (e) A representative EDS spectrum showing Nb rich precipitates. Porosity can be observed in (a) and (b) and primary niobium carbides tend to precipitate on a MnS inclusion in (d).

The primary precipitate size distribution was measured based on the largest dimension and compared in Figure 6.3. For each sample, approximately 200 precipitates containing niobium, were measured in order to determine statistically meaningful size distributions. The arrows indicate the largest precipitate size measured. The error bars represent the standard error (SE) of a population count (N), calculated as $SE = \sqrt{N}$.

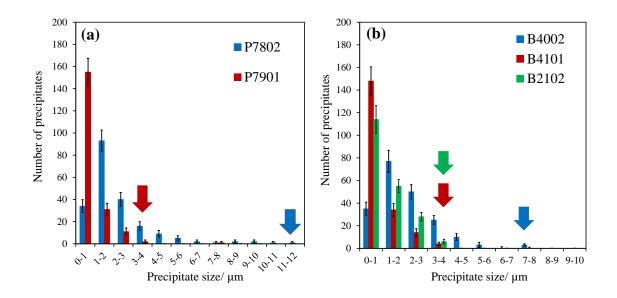


Figure 6.3: Primary niobium carbide size distribution in as-cast alloys: (a) pearlitic, (b) bainitic.

The average primary precipitate size varied between $0.5-2 \,\mu\text{m}$ but the largest observed precipitate size decreased with reduction in the niobium content for alloys with identical carbon content. Though precipitates as long as $10-11 \,\mu\text{m}$ are observed, the thickness of these plate-like morphologies were not more than 3-4 μm , the dimension which affects the dissolution kinetics of the precipitates more than the length.

6.2 Precipitates in as-rolled material

In spite of reheating for 2 h at temperatures greater than the equilibrium dissolution temperatures for niobium carbides, undissolved primary precipitates are observed in the as-rolled material (Figure 6.4). Unlike the dendritic as-cast precipitates, niobium carbides in the as-rolled materials are more spherical in shape. This is due to slow dissolution kinetics of the coarse as-cast precipitates during reheating and eventual fragmentation during hot deformation. The number density and volume fraction of the undissolved precipitates after rolling are small and sufficient precipitates could not be detected and measured for a statistically meaningful size distribution.

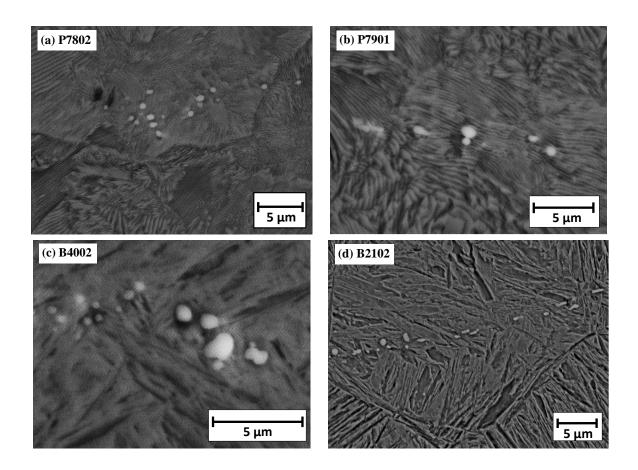


Figure 6.4: Precipitates in as-rolled material (a) P7802, (c) B4002 after $1300 \,^{\circ}\text{C-2}\,\text{h}$ reheating and (b) P7901, (d) B2102 after $1200 \,^{\circ}\text{C-2}\,\text{h}$ reheating.

As shown schematically in Figure 6.5a [110], the as-cast dendrite-like niobium carbides undergo multiple necking along the length of the particle due to diffusion controlled dissolution. Dissolution rate is high in the thinnest sections due to Gibbs-Thompson capillarity effect [111], eventually leading to leading to fragmentation during reheating itself. Figure 6.5b shows precipitates in a sample reheated to 1200 °C for 30 min and quenched, showing that the fragmentation is not due to hot deformation alone. But due to slow dissolution kinetics of the coarse precipitates and also due to other factors as discussed in Chapter 7, the time for complete dissolution is very long compared to standard reheating times of 2 h.

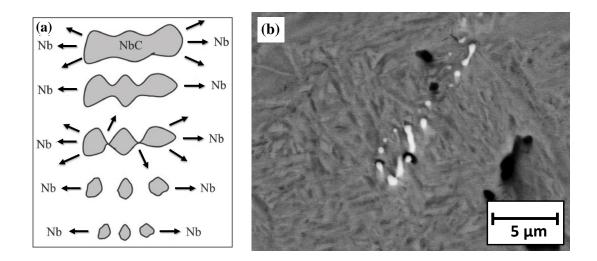


Figure 6.5: (a) Schematic showing dissolution of a primary NbC and (b) dissolution of primary NbC in as-cast B2102 during 1200 °C for 30 min and quenched thereafter.

TEM investigation has shown Nb-containing precipitates having size less than 50 nm in as-rolled pearlitic alloys e.g. P7901 as shown in Figure 6.6a along with corresponding EDS spectrum (Figure 6.6b). The orientation relationship between the NbC and ferrite α can be calculated from indexing the selected area electron diffraction (SAED) pattern (Figure 6.6c):[113]_{α} || [001]_{NbC}. The fine size of these precipitates and the absence of Baker-Nutting orientation relationship [112–115] between the precipitates and ferrite, indicate that they precipitate from the dissolved niobium in austenite during hot-rolling. The dark field image corresponding to 200_{NbC} is shown in Figure 6.6d. For the as-rolled bainitic alloys e.g. B2102, such fine precipitates are difficult to identify due to high dislocation density in bainitic ferrite (Figure 6.7a). Still some Nb-containing fine precipitates can be identified as shown in Figure 6.7e) but the volume fraction of such strain-induced precipitates seem to be less than that of the pearlitic alloy.

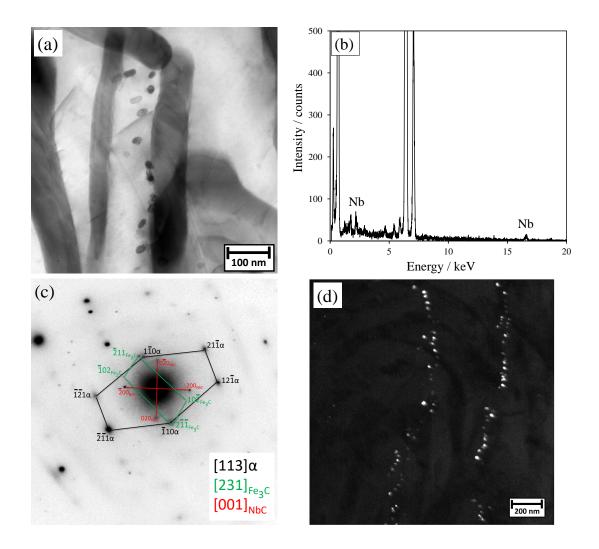


Figure 6.6: (a) Strain-induced niobium carbides in as-rolled P7901, (b) representative EDS spectrum, (c) selected area electron diffraction pattern (zone axes in the inset), (d) dark field image from $200_{\rm NbC}$ diffraction spot.

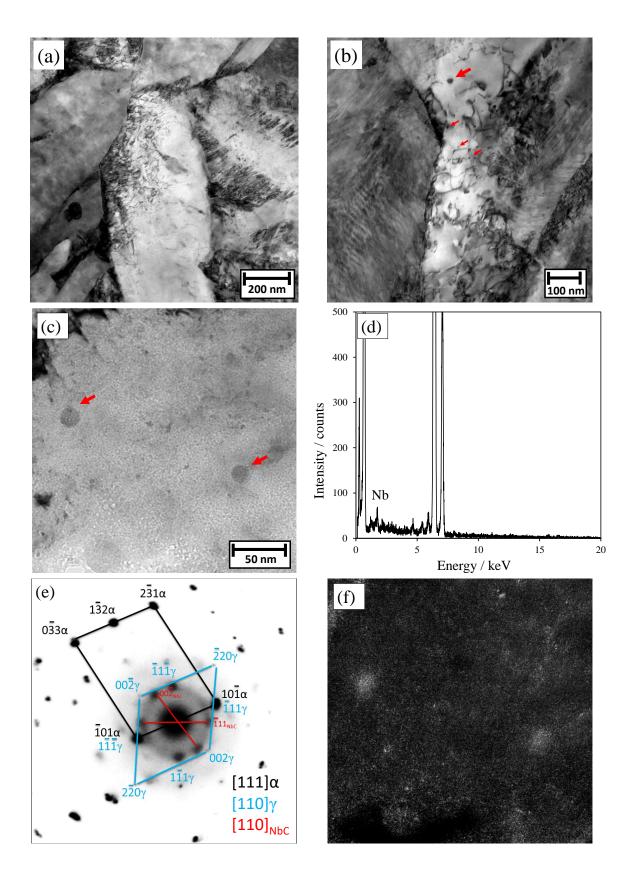


Figure 6.7: TEM study of as-rolled B2102: (a) dislocation cells in bainitic ferrite, (b) and (c) strain-induced precipitates indicated by arrows, (d) representative EDS spectrum, (e) selected area electron diffraction pattern (zone axes in the inset), (d) dark field image of the precipitates.

6.3 Dissolution kinetics in a Nb-V-Ti microalloyed high C steel

As introduced in the Chapter 4 on experimental details, a steel composition (Table 6.1), coded as 'SB02', was initially studied to evaluate the dissolution kinetics of coarse niobium carbide precipitates in a high carbon (0.83 wt%) and high niobium (0.019 wt%) composition. To study the dissolution kinetics of the precipitates, samples were cut from as-received material and sealed in quartz tubes. The tubes were heated at 1300 °C in a muffle furnace for different time intervals i.e. 0.5, 1, 2, 4, 8, 16 and 32 h followed by water quenching. The heat-treated and quenched samples were metallographically polished, etched and observed using scanning electron microscopy to study the precipitates. Here also, for each time period, approximately 200 precipitates containing niobium, were measured to determine statistically meaningful size distributions.

Table 6.1: Composition (wt%) of 'SB02' steel

С	Mn	Si	Cr	Mo	Al	Cu	Co	Sn	V	Ti	Nb
0.83	2.39	1.76	1.456	0.224	0.046	0.12	1.55	0.027	0.112	0.013	0.019

Figure 6.8 shows (Ti,Nb,V)C complex precipitates in the segregated regions of asreceived 'SB02' material. During solidification, Ti being the least soluble of microalloying elements in austenite, precipitated first with niobium carbides and vanadium carbides forming subsequently on the Ti-based precipitates with decreasing temperatures. The majority of the paricles were not spherical, some being cuboidal and some elliptical in shape. The size distributions were calculated based on the largest dimensions measured for the cuboidal and elliptical precipitates. Figure 6.9 represents the size distribution of the niobium containing precipitates for different holding times at 1300 °C. For clarity, data for 8 h have been compared with 0.5 h and 16 h in Figures 6.10a and b respectively. With increasing holding time the mode of the distribution shifted towards lower precipitate sizes. The maximum precipitate size measured decreased. While precipitates greater than 20 μ m were observed after heating for half hour, the 16 h holding treatment resulted in a maximum precipitate size of 8.3 μ m.

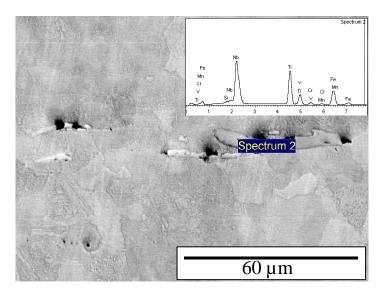


Figure 6.8: Segregated precipitates in as-received 'SB02' material and corresponding EDS spectrum.

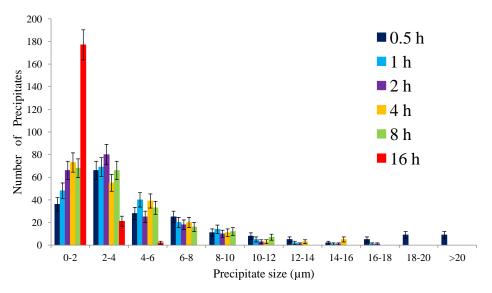


Figure 6.9: Precipitate size distribution in alloy 'SB02'. For each heat treated sample, about 200 precipitates, containing niobium, were measured to determine statistically meaningful size distribution.

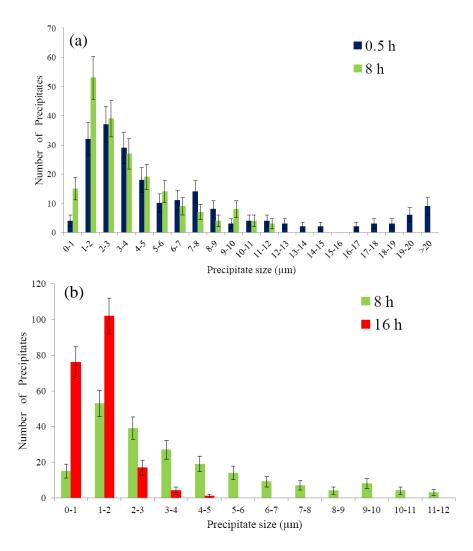


Figure 6.10: Comparison of precipitate size distributions in 'SB02' (a) 0.5 h and 8 h, (b) 8 h and 16 h.

As indicate by the blue arrows in Figure 6.11, the undissolved precipitates in the heat treated samples are present as segregated patches similar to the particles in the as-received condition (The black features are quenching cracks formed due to water quenching high carbon steels like SB02). For the samples heated for 32 h, precipitates are also observed in regions containing chemical segregation but EDS analysis revealed those as Ti-precipitates with negligible traces of niobium (Figure 6.12c). Even the EDS spectra for the precipitates from 16 h holding are quite different from the EDS spectra obtained from the samples heated for 0.5-8 h (Figure 6.12a and b). The primary intensity peaks of Nb are relatively higher than for Ti for the latter set of samples. However, for the 16 h samples, the niobium intensity is low compared to that of Ti peaks, indicating dissolution of NbC from the complex (Ti,Nb,V)C precipitates. Titanium in particular is known to stabilise NbC and hence retard its

dissolution [116]. For the samples heated for more than 32 h, apparently no niobium containing precipitates could be observed; it is likely that the niobium is completely dissolved in austenite.

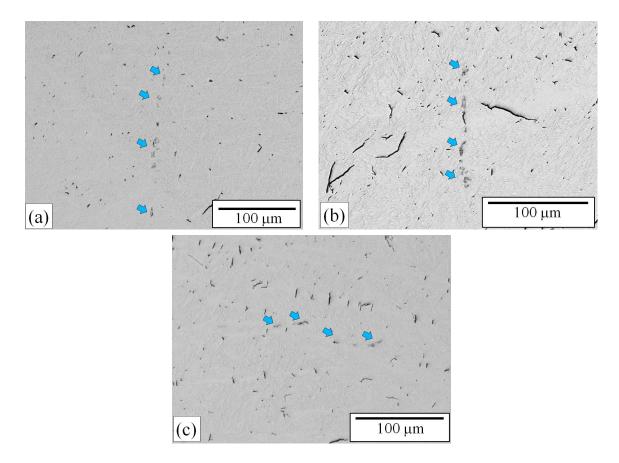


Figure 6.11: Undissolved precipitates in heat treated 'SB02' samples : (a) 8 h, (b) 16 h, (c) 32 h.

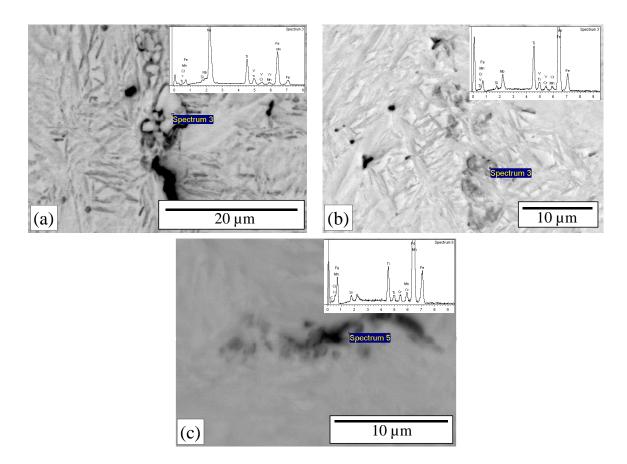


Figure 6.12: EDS for undissolved precipitates in heat treated 'SB02' samples (a) 8 h, (b) 16 h, (c) 32 h.

6.4 Summary

Due to the low solubility of niobium and microsegregration during solidification, coarse primary niobium carbides (as large as $\sim 10 \,\mu\text{m}$) precipitate from liquid in the as-cast high carbon pearlitic steels and silicon-rich low-carbon bainitic steels. The largest observed precipitate size decrease with decreasing niobium concentration. To dissolve these primary precipitates in austenite, the reheating temperatures must be atleast greater than the equilibrium NbC solution temperatures. But due to the coarse nature of the primary NbC precipitates, the dissolution rate is slow and the standard reheating time of 2 h is not sufficient to dissolve all the precipitates. The dendritic morphology of the precipitates breaks down into spheroids during reheating and hot rolling and the average diameter of the as-rolled precipitates in the investigated alloys is $3\pm 1 \,\mu\text{m}$ which is similar to the thickness of the as-cast dendritic precipitates. The dissolved niobium in austenite precipitate during hot rolling and fine in size (<50 nm) which are suitable to affect austenite recrystallisation. Ideally,

it is essential to avoid the formation of the primary carbides to mitigate potential problems in brittle fracture and rolling contact fatigue, because once formed, it is very difficult to dissolve these carbides into austenite. During industrial continuous casting of steel, with the advent of technologies like electro-magnetic stirring, dynamic soft reduction etc, the severity of segregation can be expected to be low which may result in undissolved carbides to be more finer and easily dissolvable.

Chapter 7

Modelling dissolution kinetics of precipitates

7.1 Introduction

Dissolution of second phase precipitates has been analysed extensively by Thomas and Whelan [117,118] and Aaron [119,120] and reviewed in [121] for different precipitate morphologies (sphere or plate) considering different approximations (exact solution, invariant-size, invariant-field and linearized-gradient approximations) to solve the diffusion field around a dissolving precipitate and also accounting for the interface reaction controlled dissolution [120,122]. For virtually all cases of practical interest, it was demonstrated that the invariant-size approximation is the most accurate one [121]. The approximation requires a stationary matrix-precipitate interface which restricts the diffusion field to have no memory of the past motion of the interface i.e. the diffusion field around the precipitate is assumed to be the same as that which would exist if the precipitate-matrix interface had been fixed at origin from the start and ignores the effect on the diffusion field of interface motion.

In this chapter, the theoretical aspects of modelling the kinetics of precipitate dissolution are reviewed in the context of dissolution of spherical niobium carbides in austenite at reheating temperatures. The kinetics of solute diffusion in a multicomponent system have been taken into account including capillarity effects due to the spherical shape of the precipitates.

7.2 Kinetics of solute diffusion during precipitation or dissolution

The equation for diffusion-controlled dissolution or growth of a spherical precipitate, is given by:

$$\frac{\partial c}{\partial t} = D\left(\frac{\partial^2 c}{\partial r^2}\right) + \frac{2D}{r}\left(\frac{\partial c}{\partial r}\right) \tag{7.1}$$

where c = c(r, t) is the solute concentration profile ahead of the precipitate as a function of time t and radius r. D is the diffusion coefficient of the solute in the matrix [123,124]. The distribution of solute in the matrix for a precipitate of radius $r \ge r^*$ is given by [123]:

$$c(r,t) = c^m + (c^{\gamma\omega} - c^m)\frac{r^*}{r} \operatorname{erfc}\left(\frac{r - r^*}{2\sqrt{Dt}}\right)$$
(7.2)

where c^m is the matrix composition away from the precipitate-matrix interface, $c^{\gamma\omega}$ is the equilibrium matrix composition at the interface. The complementary error function is defined as [123]:

$$\operatorname{erfc}(x) = \frac{2}{\sqrt{\pi}} \int_{x}^{\infty} \exp(-t^{2}) dt$$
(7.3)

Thomas and Whelan [117,118] have suggested that dissolution is merely the reverse of growth and the interface velocity of a dissolving spherical precipitate can be calculated from the flux balance at the interface. Due to mass conservation of the solute in the matrix, the flux of solute at the interface is equal to the rate of loss (or, gain in case of precipitate growth) of solute in the precipitate. Flux balance at the interface can be written as:

$$-4\pi r^2 (c^{\omega\gamma} - c^{\gamma\omega}) dr = -4\pi r^2 D \cdot \frac{\partial c}{\partial r} \bigg|_{r=r^*} dt$$
(7.4)

where $c^{\omega\gamma}$ is the carbide composition. c^m and $c^{\gamma\omega}$ are the austenite matrix compositions away from the interface and in equilibrium with the carbides, respectively as defined earlier and shown schematically in Figure 7.1 [123]. The interface velocity can be calculated as [118]:

$$\frac{dr}{dt} = -\frac{\Omega D}{r} - \Omega \sqrt{\frac{D}{\pi t}}$$
(7.5)

The negative sign is for dissolution and Ω is a supersaturation factor, defined as:

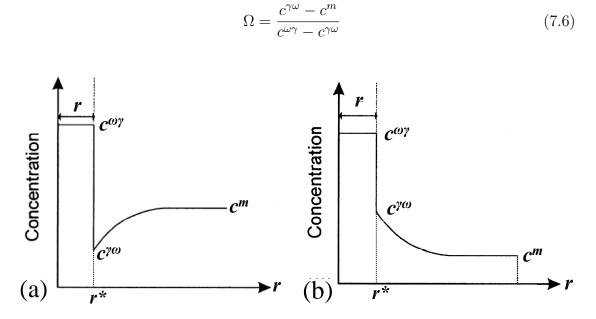


Figure 7.1: Schematic diagram of the solute concentration in the vicinity of (a) a growing precipitate and (b) a dissolving precipitate [123].

When $c^m > c^{\gamma \omega}$, Ω is negative. So dr/dt is positive and precipitation occurs i.e. r increases (Figure 7.1a).

When $c^m < c^{\gamma \omega}$, Ω is positive. So dr/dt is negative and dissolution occurs i.e. r decreases (Figure 7.1b).

For time $t \equiv (t_1, t_2)$, radius $r \equiv (r_1, r_2)$ and $(t_2 - t_1) = \Delta t > 0$, equation 7.5 can be numerically solved as:

$$r_2 - r_1 = \Delta r = \left(-\frac{\Omega D}{r} - \Omega \sqrt{\frac{D}{\pi t}}\right) \Delta t$$
 (7.7)

Depending on the sign of Ω ; either $r_2 > r_1$ (i.e. precipitation) or $r_2 < r_1$ (i.e. dissolution).

The term in $t^{-1/2}$ in equations 7.5 and 7.7 arises from the transient part of the diffusion field in equation 7.2. At longer times, the transient part becomes negligible and the dissolution process becomes steady state.

$$\frac{dr}{dt} = -\frac{\Omega D}{r} \tag{7.8}$$

Aaron's approach [119] to dissolution kinetics of particles was essentially based on

the transient part of the diffusion field equation 7.2. Aaron [119] characterized precipitate dissolution by:

$$\frac{dr}{dt} = -\Omega \sqrt{\frac{D}{t}} \tag{7.9}$$

$$r_2 - r_1 = \Delta r = -\Omega \sqrt{\frac{D}{t}} \ \Delta t \tag{7.10}$$

The term in $t^{1/2}$ in equation 7.5 is essentially the same as Aaron's result in equation 7.9 as the discrepancy factor $(1/\sqrt{\pi})$ in the multiplying factor is very negligible for $\Omega \ll 1$ which is the case in practice. But, Aaron's solution is strictly for a onedimensional diffusion field based on the assumption that the dissolution kinetics of a spherical precipitate in the limit of the early stages of dissolution is the same as that of a planar precipitate, so cannot be applicable for longer times during precipitate dissolution.

According to some other approaches like Fujita [124], Robson [125], Sourmail et al. [126], the interface velocity is given as:

$$\frac{dr}{dt} = \frac{\alpha_3}{2} \sqrt{\frac{D}{t}} \simeq \sqrt{2\Omega} \sqrt{\frac{D}{t}}$$
(7.11)

where $\alpha_3 \simeq \sqrt{2\Omega}$ is considered to be a three dimensional parabolic rate constant for spherical geometries and defined as:

For precipitation;
$$\alpha_3 \simeq \sqrt{2} \frac{(c^m - c^{\gamma\omega})^{\frac{1}{2}}}{(c^{\omega\gamma} - c^m)^{\frac{1}{2}}}$$
 (7.12a)

For dissolution;
$$\alpha_3 \simeq -\sqrt{2} \frac{(c^{\gamma\omega} - c^m)^{\frac{1}{2}}}{(c^{\omega\gamma} - c^m)^{\frac{1}{2}}}$$
 (7.12b)

For time $t \equiv (t_1, t_2)$, radius $r \equiv (r_1, r_2)$ and $(t_2 - t_1) = \Delta t > 0$, equation 7.11 can also be numerically solved as:

$$r_2 - r_1 = \Delta r = \frac{\alpha_3}{2} \sqrt{\frac{D}{t}} \,\Delta t \tag{7.13}$$

Depending on the sign of α_3 ; either $r_2 > r_1$ (i.e. precipitation) or $r_2 < r_1$ (i.e. dissolution).

7.2.1 Theory of multi-component diffusion

During isothermal diffusion-controlled carbide precipitation or dissolution in binary alloys, the local equilibrium compositions are given by an unique tie-line which passes through average solute concentration (\bar{c}) in the alloy (Figure 7.2a). The concentration profile just ahead of the precipitating/dissolving carbides is already shown in Figure 7.1. The conservation condition for local equilibrium to be maintained is given by:

$$(c^{\omega\gamma} - c^{\gamma\omega})\frac{dr}{dt} = -D\left(\frac{\partial c}{\partial r}\right)\Big|_{r^*}$$
(7.14)

where $\frac{dr}{dt}$ is the interface velocity and $\left(\frac{\partial c}{\partial r}\right)\Big|_{r^*}$ is the solute concentration gradient at the interface at position r^* [111].

For ternary systems like Fe-Nb-C alloy, the tie-line will not in general pass through \bar{c} because it is necessary to simultaneously satisfy two conservation equations at the interface, one each for niobium and carbon which diffuse at very different rates:

$$\left(c_{\rm C}^{\omega\gamma} - c_{\rm C}^{\gamma\omega}\right)\frac{dr}{dt} = -D_{\rm C}\left(\frac{\partial c}{\partial r}\right)\Big|_{r^*}$$
(7.15a)

$$\left(c_{\rm Nb}^{\omega\gamma} - c_{\rm Nb}^{\gamma\omega}\right)\frac{dr}{dt} = -D_{\rm Nb}\left(\frac{\partial c}{\partial r}\right)\Big|_{r^*}$$
(7.15b)

However, according to the phase rule there is an additional degree of freedom in a ternary alloy which allows many tie-lines at any given temperature (Figure 7.2b). It is then possible to select an unique tie-line which is able to satisfy both the solute conservation equations in spite of the fact that $D_{\rm C} \gg D_{\rm Nb}$, while at the same time maintaining local equilibrium. For a practically relevant solution, partitioning local equilibrium (PLE) condition prevails. The tie-line is selected in a way that the gradient of carbon is reduced to such an extent that the flux of carbon is reduced to a level consistent with that of niobium and $c_{\rm C}^{\gamma\omega} \approx c_{\rm C}^m$. The corresponding $c_{\rm Nb}^{\gamma\omega}$ value can be calculated from the solubility data. Detailed description of tie-line selection and the construction of Figure 7.2b is given in [111,124].

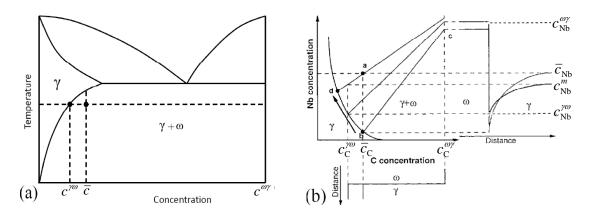


Figure 7.2: Schematic diagram for tie-line selection during precipitate growth for (a) binary system and (b) Fe-Nb-C ternary system [111,124].

It must be noted that at the beginning of precipitation, $\bar{c} = c^m$. As precipitation progress and the volume fraction V increases, solute is depleted from the matrix during 'soft impingement' and c^m decreases. The mean field approximation [111, 124,125] is used to calculate the instantaneous matrix composition as:

$$c_{\rm C}^m = \bar{c}_{\rm C} - \frac{V(c_{\rm C}^{\omega\gamma} - \bar{c}_{\rm C})}{(1 - V)}$$
 (7.16a)

$$c_{\rm Nb}^m = \bar{c}_{\rm Nb} - \frac{V(c_{\rm Nb}^{\omega\gamma} - \bar{c}_{\rm Nb})}{(1 - V)}$$
(7.16b)

But at the beginning of dissolution, $c^m < \bar{c}$ as there is a certain volume of precipitates already present. As dissolution proceeds, V decreases and c^m increases. At the end of complete dissolution, $c^m = \bar{c}$.

Thomas and Whelan's [117] and Aaron's [121] treatments were essentially based on dissolution into infinite matrix which resulted in a constant supersaturation Ω throughout the dissolution process and the interface velocity equations 7.5 and 7.9 was integrated to calculate the final precipitate size. But if 'soft-impingement' is taken into account, then Ω is no longer constant and the velocity equations are to be solved numerically as in equations 7.7, 7.10 and 7.13.

7.2.2 Capillarity effect

To account for the Gibbs-Thompson effect due to curved interface of spherical precipitates, the equilibrium austenite composition changes as:

$$(c_{\rm Nb}^{\gamma\omega})_r = c_{\rm Nb}^{\gamma\omega} \left[1 + \frac{\sigma}{k_B T} \frac{2V_M^{\omega}}{r} \frac{1 - c_{\rm Nb}^{\gamma\omega}}{c_{\rm Nb}^{\omega\gamma} - c_{\rm Nb}^{\gamma\omega}} \right]$$
(7.17)

where σ = interfacial energy of the carbides in J m⁻², k_B = Boltzmann constant in J K⁻¹, V_M^{ω} = volume per unit NbC molecule in m³ per molecule, r= radius in m [111] when the concentrations are in terms of mole fraction. So to incorporate the capillarity effect, Ω in equation 7.6 should be defined as:

$$\Omega = \frac{c_{\rm Nb}^m - (c_{\rm Nb}^{\gamma\omega})_r}{c_{\rm Nb}^{\omega\gamma} - (c_{\rm Nb}^{\gamma\omega})_r}$$
(7.18)

For microalloyed carbides like NbC, it can be reasonably assumed that changes in the carbide composition $c_{\rm Nb}^{\omega\gamma}$ due to capillarity can be neglected because the composition range of a carbide is limited. Also, $(c_{\rm Nb}^{\gamma\omega})_r \ll c_{\rm Nb}^{\omega\gamma}$. So, the denominator in equation 7.18 is effectively constant and the supersaturation Ω will depend on the competition between matrix niobium content away from the interface, $c_{\rm Nb}^m$ and the equilibrium niobium content at the interface adjusted for capillarity, $(c_{\rm Nb}^{\gamma\omega})_r$.

7.3 The model

A theoretical model for dissolution of niobium carbides in austenite during isothermal heat-treatment above the equilibrium dissolution temperature, is developed based upon the equations outlined in the previous section for a set of identical precipitates with similar initial radius. The flowchart of the computer program developed is shown in Figure 7.3. The input variables are explained as follows:

• Average alloy composition: $\bar{c} (\text{wt\%}) = (\bar{c}_{\text{C}}, \bar{c}_{\text{Nb}})$ where $\bar{c}_{\text{C}} = \text{wt\%}$ carbon; $\bar{c}_{\text{Nb}} = \text{wt\%}$ niobium. The calculations require the compositions to be used in terms of mole-fraction for unit compatibility. The conversion between weight-percentages and mole-fractions can be calculated as follows:

$$\bar{x}_{\rm C} = \text{mole fraction carbon} = \frac{\frac{\bar{c}_{\rm C}}{A_{\rm C}}}{\frac{\bar{c}_{\rm C}}{A_{\rm C}} + \frac{\bar{c}_{\rm Nb}}{A_{\rm Nb}} + \frac{100 - \bar{c}_{\rm C} - \bar{c}_{\rm Nb}}{A_{\rm Fe}}}$$
(7.19a)

$$\bar{x}_{\rm Nb} = \text{mole fraction niobium} = \frac{\frac{\bar{c}_{\rm Nb}}{\bar{A}_{\rm Nb}}}{\frac{\bar{c}_{\rm C}}{\bar{A}_{\rm C}} + \frac{\bar{c}_{\rm Nb}}{\bar{A}_{\rm Nb}} + \frac{100 - \bar{c}_{\rm C} - \bar{c}_{\rm Nb}}{\bar{A}_{\rm Fe}}}$$
(7.19b)

where $\bar{x} = (\bar{x}_{\rm C}, \bar{x}_{\rm Nb})$ is the average alloy composition in mole-fractions, $A_{\rm Fe} = 55.845$, $A_{\rm C} = 12.01$, $A_{\rm Nb} = 92.91$ are the atomic weights of Fe, C, Nb respectively.

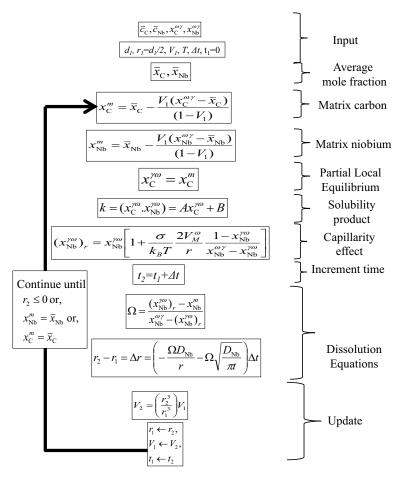


Figure 7.3: Flowchart of the computer program for the dissolution kinetics of identical sized precipitates.

- Carbide composition: $x^{\omega\gamma} = (x_{\rm C}^{\omega\gamma}, x_{\rm Nb}^{\omega\gamma})$ where $x_{\rm C}^{\omega\gamma}$ and $x_{\rm Nb}^{\omega\gamma}$ are the molefractions of C and Nb respectively in NbC. Superscript ' $\omega\gamma$ ' denotes composition in carbide equilibrium with austenite.
- Temperature T in Kelvin.
- Solubility product: The solubility product data are calculated from MatCalc 'mc_ sample_fe.tdb' database. When dealing with mole-fraction compositions, the solubility product also needs to be expressed in terms of equilibrium molefractions in austenite, $x^{\gamma\omega} = (x_{\rm C}^{\gamma\omega}, x_{\rm Nb}^{\gamma\omega})$ where $x_{\rm C}^{\gamma\omega}$ and $x_{\rm Nb}^{\gamma\omega}$ are mole-fractions of C and Nb respectively in equilibrium austenite. For the present model, the solubility product k_T is defined as a function of carbon content at a constant temperature T.

$$k_T = [x_{\rm C}^{\gamma\omega}][x_{\rm Nb}^{\gamma\omega}] = A[x_{\rm C}^{\gamma\omega}] + B \tag{6.20}$$

where A and B are constants. As shown earlier in section 2.4.1, the NbC solubility in austenite depends on the composition and so, A and B values for the investigated alloys are listed in Table 7.1. The Fe-C-Nb composition indicates solubility in only ternary Fe-C-Nb austenite without other alloying elements.

Composition	Temperature / $^{\rm o}{\rm C}$	Valid range $(wt\% C)$	A (mole-fraction)	B (mole-fraction) ²
Fe-C-Nb	1300	0.7 - 0.9	1.196×10^{-4}	5.107×10^{-6}
P7802	1300	0.7 - 0.9	1.065×10^{-4}	4.591×10^{-6}
P7901	1200	0.7 - 0.9	5.016×10^{-5}	2.109×10^{-6}
B4002	1300	0.3 - 0.5	6.690×10^{-5}	3.484×10^{-6}
B4101	1200	0.3 - 0.5	2.950×10^{-5}	1.418×10^{-6}
B2102	1200	0.1 - 0.3	3.079×10^{-5}	1.191×10^{-6}

Table 7.1: Solubility product constants for different alloys at T=1300 °C.

• Initial precipitate diameter, d_1 (in m), so radius, $r_1 = d_1/2$ (in m) and initial precipitate volume fraction, V_1 . V_1 can be measured experimentally or can be approximated as the maximum equilibrium volume-fraction possible for the precipitate in austenite as calculated from MatCalc. If N_r is the total number of precipitates of radius r per unit volume; then the volume fraction for spherical particles becomes:

$$V = N_r \left(\frac{4}{3}\pi r^3\right) \tag{6.21}$$

As all N_r number of precipitates have similar initial radius r_1 , their dissolution behaviour will be similar and N_r will remain constant during dissolution. After time t, volume fraction V_t and radius r_t is given by:

$$\frac{V_t}{V_1} = \frac{r_t^3}{r_1^3} \tag{7.20}$$

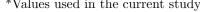
- Time step dt in seconds.
- Diffusion coefficient of niobium in austenite, D_{Nb} (in m² s⁻¹) at temperature T is defined by:

$$D_{\rm Nb} = D_0 \, \exp\left(-\frac{Q}{RT}\right) \tag{6.22}$$

where D_0 = Diffusion pre-exponent factor for niobium (in m² s⁻¹), Q=Diffusion activation energy for niobium (in J mol⁻¹) and R is the Gas constant (= 8.314 J mol⁻¹ K⁻¹). Table 7.2 lists D_0 and Q values reported in different literature for niobium diffusion in austenite and corresponding complete dissolution time for precipitates of 2 µm diameter at 1300 °C as calculated by the described model. Values used by Fujita et al. [127] (reference [11] of [111]) deviates substantially from the rest of the literature reported values as shown in Figure 7.4. The calculated complete dissolution times are about similar for the other reported diffusion coefficient values. For representative purpose, the values reported by San Martin et al. [128] are used for the current study.

Table 7.2: Diffusion coefficient parameters for niobium diffusion in austenite and corresponding complete dissolution time for precipitates of 2 μ m diameter at 1300 °C.

Reference	$D_0/~{ m m}^2~{ m s}^{-1}$	$Q/~{ m J}~{ m mol}^{-1}$	$D_{\rm Nb}/~{\rm m^2~s^{-1}}$ at 1300 $^{\rm o}{\rm C}$	Dissolution time/ ${\rm h}$
Gladman, 1997 [113]	0.053	344600	1.91×10^{-13}	1.93
Fujita, 2001 [127]	0.000056	286000	1.78×10^{-14}	20.61
San Martin, 2004 [128]*	0.00093	291966	1.87×10^{-13}	1.96
Oikawa, 1983 [129]	0.00056	286000	1.78×10^{-13}	2.06
Subramanian, 1985 [130]	0.000492	285000	1.69×10^{-13}	2.18
Lechuk, 2000 [131]	0.053	343000	2.16×10^{-13}	1.70
Kurokawa, 1983 [132]	0.000075	264000	1.28×10^{-13}	2.87
Xu, 2011 [133]	0.000083	266500	1.17×10^{-13}	3.14



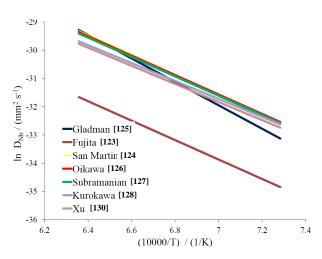


Figure 7.4: Different values for diffusion coefficient of niobium in austenite in literature.

7.4 Model results and discussion

Figure 7.5 compares dissolution kinetics for NbC precipitates of initial radius $r_1=2 \,\mu\text{m}$ and volume fraction $V_1=0.0002$ in Fe-0.78C-0.02Nb (wt%) system at 1300 °C for different approaches discussed in section 7.2. The other input values are:

dt(s)=10; $D_{0}(m^{2} s^{-1}) = 0.00093, Q(J mol^{-1}) = 291966;$ $\sigma (J m^{-2})=1; V_{M}^{\omega}(m^{3} \text{ per molecule})=2.23 \times 10^{-29};$ $x^{\omega\gamma}(\text{mole fraction}) \equiv (x_{C}^{\omega\gamma}, x_{Nb}^{\omega\gamma}) \equiv (0.5, 0.5);$ solubility product (in terms of mole fraction): $h = [\pi^{\gamma\omega}][\pi^{\gamma\omega}] = 1.1060 \times 1$

 $k_T = [x_{\rm C}^{\gamma\omega}][x_{\rm Nb}^{\gamma\omega}] = 1.1969 \times 10^{-4} [x_{\rm C}^{\gamma\omega}] + 4.5912 \times 10^{-6};$ Constants: R = 8.314 J mol⁻¹ K⁻¹; $k_B = 1.3806488 \times 10^{-23}$ J K⁻¹

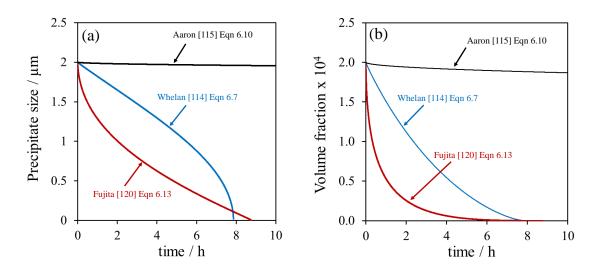


Figure 7.5: Comparison of different dissolution kinetics models for precipitates with initial radius $r_1=2\,\mu\text{m}$ and initial volume fraction $V_1=0.0002$ in Fe-0.78C-0.02Nb (wt%) system at 1300 °C. Evolution of (a) precipitate size and (b) precipitate volume fraction during dissolution. Total number of precipitates N_r remains constant during dissolution.

As discussed earlier, Aaron's solution is strictly for a one-dimensional diffusion field based on the assumption that the dissolution kinetics of a spherical precipitate in the limit of the early stages of dissolution is the same as that of a planar precipitate, so cannot be applicable for longer times during precipitate dissolution. Both Fujita's and Whelan's solutions are for three dimensional spherical precipitates, but the kinetics are different. Now, onwards the results are discussed in terms of diffusion controlled dissolution kinetics of spherical precipitates according to Whelan's approach using equation 7.5. Figure 7.6 shows the variation of different parameters during dissolution of a precipitate of 2 µm radius and initial volume fraction $V_1=0.0002$. Initially, supersaturation Ω decrease as dissolution progresses and the matrix solute content (x^m) increases. The increase in equilibrium matrix composition at interface $(x^{\gamma\omega})_r$ with decreasing precipitate size due to capillarity effect, is negligible initially. But when the precipitate size is sufficiently small towards the end of dissolution, $(x^{\gamma\omega})_r$ increases rapidly and as a result Ω starts to increase. This increases the dissolution rate of the precipitates and finer precipitates dissolve much faster.

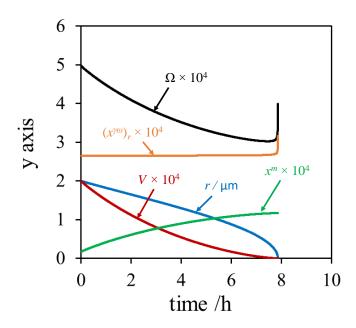


Figure 7.6: Variation of radius (r) in μ m, volume fraction (V), supersaturation (Ω) , niobium composition in austenite $(x^m \text{ in mol fraction})$ and equilibrium niobium at the interface $[(x^{\gamma\omega})_r \text{ in mol fraction}]$ for precipitates of 2 μ m radius and initial volume fraction $V_1=0.0002$ in Fe-0.78C-0.02Nb (wt%) system.

7.4.1 Effect of initial precipitate size

For a similar initial volume fraction of precipitates ($V_1 = 0.0002$), the complete dissolution time increases with increasing precipitate size as shown in Figure 5.13. This is the direct result of the interface velocity being inversely proportional to precipitate size. Before dissolution starts, as the initial radius r_1 is different in each case, total number of precipitates N_r will also be different for each initial radius to keep the initial volume fraction identical for each scenario. During dissolution of similar sized precipitates, N_r remains constant and precipitate volume fraction decrease.

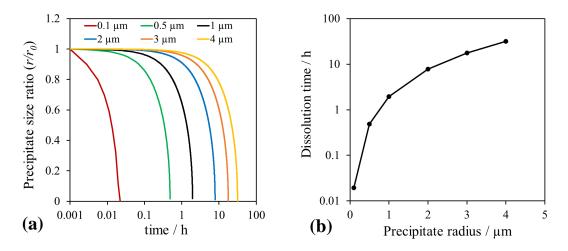


Figure 7.7: (a) Evolution of precipitate size ratio with dissolution time, (b) complete dissolution time for different initial precipitate sizes with similar initial volume fraction ($V_1 = 0.0002$). For each initial radius r_1 with similar V_1 , total number of precipitates N_r is different which remains constant during dissolution.

7.4.2 Effect of initial volume fraction and interfacial energy

For precipitates with identical initial size $(r_1=2 \,\mu\text{m})$, the complete dissolution time decreases with increasing initial precipitate volume fraction V_1 as shown in Figure 5.14a. This can be explained by the fact that precipitation removes solute from the matrix. So at large volume fraction, there will be a greater supersaturation for dissolution. For each initial volume fraction, N_r will be different which remains constant during the course of dissolution. The maximum initial volume fraction is limited by the total diffusing solute i.e. niobium content in the system. Interface energy (σ) values have a small effect on the dissolution kinetics as shown in Figure 5.14b.

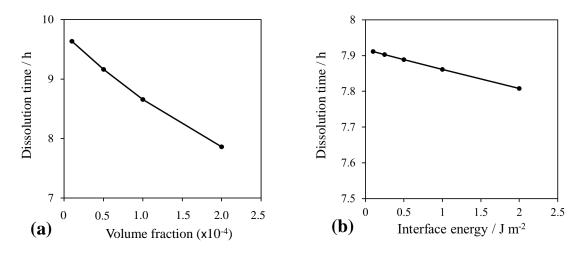


Figure 7.8: (a) Complete dissolution time for different initial volume fraction (V_1) of precipitates with similar initial size $(r_1=2 \,\mu\text{m})$. For each V_1 with similar r_1 , total number of precipitates N_r is different which remains constant during dissolution. (b) Effect of interfacial energy (σ) on dissolution time for $V_1=0.0002$ and $r_1=2 \,\mu\text{m}$.

7.4.3 Effect of precipitate size distribution

The model can be modified to take account of a size distribution of precipitates instead of a single precipitate size-class by the following equations. A normal distribution of precipitates can be defined as [123]:

$$\rho_{n_i} = \frac{V}{\frac{4}{3}\pi \sum (\rho_{n_i}^* r_i^3)} \rho_{n_i}^*$$
(7.21a)

$$\rho_{n_i}^* = \frac{1}{\sqrt{2\pi\sigma_n r_i}} \exp\left(-\frac{(r_i - \bar{r})^2}{2\sigma_n^2}\right)$$
(7.21b)

where r_i is the radius of *i*th particle, ρ_{n_i} is the probability density of a normal particle size distribution with volume fraction V, \bar{r} is the arithmetic mean of the distribution and σ_n is the standard deviation.

But the experimentally measured precipitate sizes are not in normal distribution but develop a log-normal distribution (Figure 5.3) which can be defined as [123]:

$$\rho_{l_i} = \frac{V}{\frac{4}{3}\pi \sum (\rho_{l_i}^* r_i^3)} \rho_{l_i}^*$$
(7.22a)

$$\rho_{l_i}^* = \frac{1}{\sqrt{2\pi\sigma_l r_i}} \exp\left(-\frac{(\ln r_i - \mu)^2}{2\sigma_l^2}\right)$$
(7.22b)

where ρ_l is the probability density of a log-normal particle size distribution, μ is the arithmetic mean of the distribution of $\ln r_i$ and σ_l is the standard deviation of the normal distribution of $\ln r_i$. Figure 5.15 shows a representative probability density distribution calculated from the experimental precipitate size measurement (Figure 5.3) for P7901. The experimentally measured size was based on the largest dimension of the precipitates so the radius is calculated as half of the experimentally measured size.

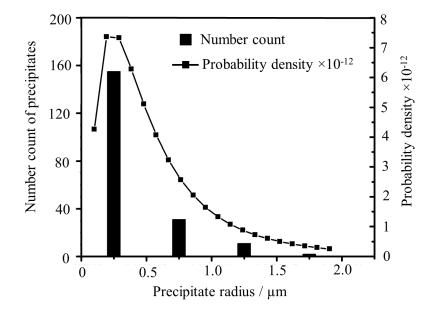


Figure 7.9: Probability density distribution calculated from experimentally measured size distribution for P7901 with initial volume fraction $V_1=0.0001$.

As the dissolution rate is inversely proportional to the radius and also due to capillarity effect, the finer precipitates dissolve faster and niobium in austenite increases. Thus, the already slowly dissolving coarser precipitates gradually dissolve under decreasing supersaturation. The complete dissolution time for all the precipitates is eventually controlled by the maximum size in the distribution.

7.4.4 Effect of temperature and composition

The dissolution temperature must be higher than the equilibrium niobium carbide formation temperature in the alloys. Higher the temperature, higher is niobium solubility in austenite and higher will be the supersaturation. The alloying elements also affect niobium solubility in austenite and in turn affect the supersaturation. Solubility data from Table 5.1 and the calculated size distribution from equation 5.23 are utilised to predict the dissolution kinetics in the investigated alloys and showed in Figure 5.16. The initial precipitate volume fraction is limited by the equilibrium niobium carbide volume fraction in the alloys.

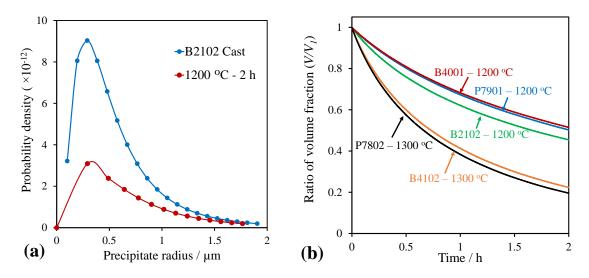


Figure 7.10: (a) Evolution of precipitate size distribution for B2102 cast, (b) Evolution of precipitate volume fraction during dissolution of precipitates with log-normal size distribution.

7.5 Summary

A theoretical model can be formulated to analyse the multi-component diffusion controlled dissolution kinetics of the niobium carbides and to study the evolution of niobium carbide volume fraction during dissolution which is otherwise experimentally difficult to study because of very low volume fractions involved. The dissolution rate is inversely proportional to the precipitate size and more coarse is the precipitate, lower is the dissolution rate. The primary carbide volume fraction is small which results in austenite being less depleted of niobium. This decreases the supersaturation i.e. the diffusion gradient ahead of the precipitate-matrix interface is shallow which also reduces the dissolution rate.

Chapter 8

Hot deformation of austenite and dilatometry

8.1 Introduction

The no-recrystallisation temperature (T_{nR}) is critical in investigating the effect of niobium on austenite hot deformation in high carbon pearlitic and Si-rich cementitefree bainitic alloys. In theory, dissolved niobium in reheated austenite would precipitate during subsequent hot rolling and inhibit austenite recrystallisation by pinning the austenite grain boundaries. T_{nR} is the temperature below which deformed austenite grains will not recrystallise for any given holding time [113]. Several empirical equations are available to predict T_{nR} temperatures [134–137] as well as recrystallisation kinetics of microalloyed austenite [138–141] but most of these equations are based on low to medium carbon (0.01-0.5 wt% C) steels and also seldom applicable for high silicon (>1 wt% Si) compositions. Some articles [34, 138, 142] have reported equations for austenite recrystallisation kinetics in non-microalloyed pearlitic rail compositions. Laboratory methods like double-hit deformation testing, multipass hot torsion or, multipass plane-strain compression testing, stress relaxation testing, tension-compression testing etc [90,134,143–150] can be utilised to determine T_{nR} experimentally. The advantage of multistep hot torsion [90] or plane-strain compression [150] testing is that single experiments can approximate the T_{nR} for a given deformation schedule as shown in Figure 8.1.

In this chapter, uniaxial compression tests are carried out on selected alloys from Table 5.1. The general experimental details are summarised in Chapter 5. The cylindrical samples are prepared from the as-rolled materials and reheated at 1200 °C for 2 h and helium-cooled at a fast rate (~ 50 °C) thereafter to take as much niobium into solution before hot deformation.

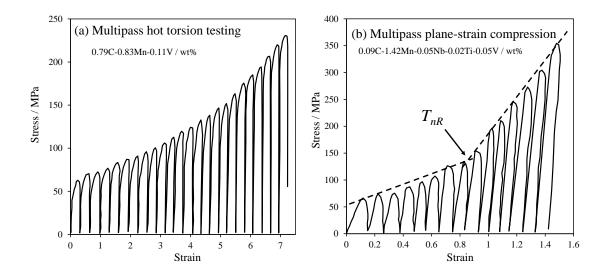


Figure 8.1: T_{nR} determination by (a) multipass hot torsion testing [90], (b) multipass plane-strain compression testing [150].

8.2 Determination of no-recrystallisation temperature

In order to approximate the no-recrystallisation temperature (T_{nR}) , multipass axisymmetric compression tests were carried out on the water-quenched cylindrical samples according to the schedule illustrated in Figure 8.2. The deformation temperature ranges from 1100 °C to 800 °C, soaking temperature and time are 1200 °C for 2 min. The other parameters are: strain per pass = 0.15, strain rate = 5 s^{-1} , cooling rate between deformations = 1 °C s^{-1} and inter-pass time = 50 s.

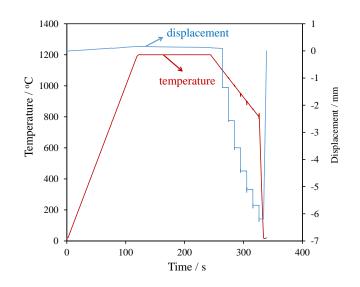


Figure 8.2: Deformation schedule to determine T_{nR} .

The T_{nR} is calculated from the determination of mean flow stress (MFS) which is calculated from equations 8.1 applied on the flow curves at each reduction pass [151]. The MFS at initial high temperature deformations are small and as the deformation temperature reduces with each pass, MFS increases. At deformation temperatures below T_{nR} , un-recrystallised austenite cause MFS to increase at a higher rate per each reduction pass. T_{nR} can be approximated from the inflexion point as illustrated in Figure 8.1.

$$MFS = \frac{1}{\epsilon_b - \epsilon_a} \int_{\epsilon_a}^{\epsilon_b} \sigma d\epsilon$$
(8.1a)

$$\sigma = \frac{4Ph}{\pi D_0^2 h_o} \tag{8.1b}$$

where ϵ is true plastic strain, σ is the true compressive stress, P is the compressive load, h is the instantaneous length, h_0 is the initial length and D_0 is the initial diameter of the cylinder.

Figure 8.3 and 8.4 compare flow curves and calculated mean flow stress for the alloys P7600, P7901 and B2200, B2102. The inflexion point in Figure 8.3b for P7901 and in Figure 8.4b for B2102, indicate T_{nR} for the respective alloys.

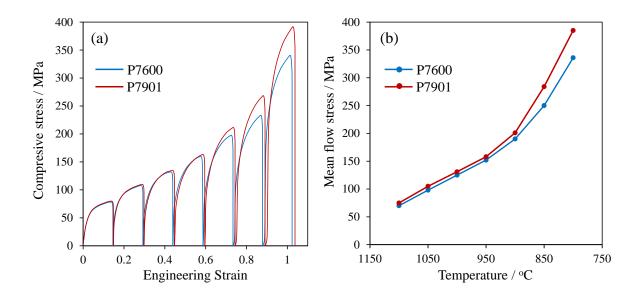


Figure 8.3: (a) Flow curves for the compression tested samples at each deformation step, (b) variation of mean flow stress (MFS) with deformation tempeature for the pearlitic alloys.

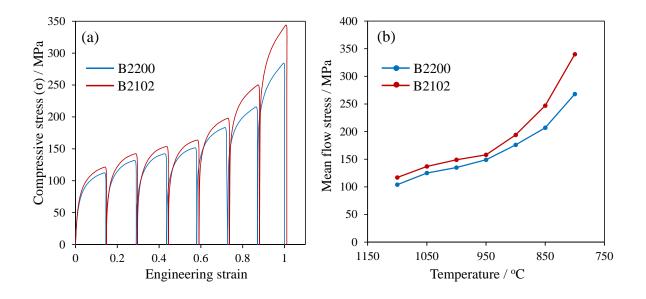


Figure 8.4: (a) Flow curves for the compression tested samples at each deformation step, (b) variation of mean flow stress (MFS) with deformation tempeature for the pearlitic alloys.

For both the pearlitic and bainitic alloys, the flow stress for the Nb-microalloyed alloys tend to be higher than the non-microalloyed alloys. This is possibly due to deformation induced NbC precipitation which strengthen the austenite. Figure 8.5 summarises the measured T_{nR} for the investigated alloys along with the T_{nR} tempera-

tures collected from the literature for Nb-microalloyed pearlitic steels. This indicates that T_{nR} increases with increasing niobium contents in high carbon pearlitic steels and the present experimental data fits reasonably into a linear trend.

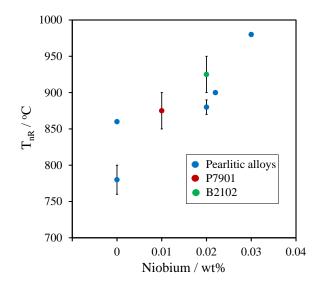


Figure 8.5: Experimentally determined T_{nR} for P7901 and B2102 along with reported T_{nR} for different Nb contents in pearlitic compositions.

8.3 Topology of austenite grain deformation

In the context of axisymmetric compression of tetrakaidecahedron shape of grains (Figure 8.6), the effect of plastic deformation on the austenite grain boundary per unit volume in the last deformation pass can be analysed using equations 8.2 and 8.3. Equation 8.2 is derived by applying homogeneous deformations to tetrakaidecahedra in a variety of orientations and the equation 8.3 is by using the principles of stereology [35,152].

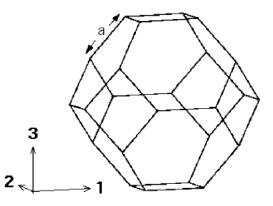


Figure 8.6: Tetrakaidecahedron shape of grains.

$$\frac{S_V}{S_{V_0}} = \frac{\left[8S_{33} + \frac{4}{S_{33}^2}\right]^{\frac{1}{2}} + \frac{1}{3}\left[\frac{1}{S_{33}} + 2S_{33}^{\frac{1}{2}}\right]}{1 + 2\sqrt{3}}$$
(8.2)

$$\frac{S_V}{S_{V_0}} = \frac{1}{2} (0.429 \exp\{-\epsilon_{11}\} + 0.571 \exp\{-\epsilon_{22}\} + \exp\{-\epsilon_{33}\})$$
(8.3)

where S_V =grain boundary per unit volume after deformation (un-recrystallised grains); S_{V_0} =grain boundary per unit volume before deformation; S_{33} = principal distortion along direction 3 (compression direction). The percentage reduction (p) is related to S_{33} by:

$$\frac{p}{100} = 1 - S_{33} \tag{8.4}$$

For axisymmetric compression, $\epsilon_{11} = \epsilon_{22}$ true strain along directions 1 and 2 = $-0.5 \epsilon_{33}$ where ϵ_{33} =true strain along direction 3 (compression direction)=ln(S₃₃).

The experimentally measured mean linear intercepts of austenite grains are related to the directional strains by the equation 8.5. $\overline{L_0}$ is mean linear intercept of equiaxed austenite grains before deformation and $\overline{L_1}, \overline{L_2}$ and $\overline{L_3}$ are mean linear intercepts along direction 1, 2, 3 respectively for un-recrystallised austenite grains after deformation. For axisymmetric deformations, $\overline{L_1} = \overline{L_2}$ as $\epsilon_{11} = \epsilon_{22}$.

$$\overline{L_0} = 2/S_{V_0} \tag{8.5a}$$

$$\overline{L_1} = \overline{L_0} \exp\{\epsilon_{11}\}$$
(8.5b)

$$\overline{L_2} = \overline{L_0} \exp\{\epsilon_{22}\} \tag{8.5c}$$

$$\overline{L_3} = \overline{L_0} \exp\{\epsilon_{33}\} \tag{8.5d}$$

So the experimental S_V/S_{V_0} can be calculated from the mean linear intercept measurement of the austenite grain sizes as [35,152]:

$$\frac{S_V}{S_{V_0}}\Big|_{\exp} = \frac{\overline{L_0}}{2} (0.429/\overline{L_1} + 0.571/\overline{L_2} + 1/\overline{L_3})$$
(8.6)

Also, the aspect ratio $(E = \overline{L_1}/\overline{L_3})$ of the un-recrystallised grains can be calculated from the percentage reduction (p) as:

$$E = \frac{\overline{L_1}}{\overline{L_3}} = \frac{\exp\{\epsilon_{11}\}}{\exp\{\epsilon_{33}\}} = \frac{1}{(S_{33})^{\frac{3}{2}}} = \frac{1}{(1 - \frac{p}{100})^{\frac{3}{2}}}$$
(8.7)

8.4 Two-stage compression tests

Two-stage compression tests are carried out on the water-quenched cylindrical samples at temperatures above and below the possible no-recrystallisation temperatures. During industrial scale rolling, the roughing passes reduce the large grain sizes which formed during the reheating. The following reheating temperature and time combination (Table 8.1) were selected to develop similar prior austenite grain size of about 200 µm (in terms of mean linear intercept $\overline{L_{\gamma}}$) before the two-stage deformation schedule (Figure 8.7a). A 6-pass compression schedule with 20% deformation per pass was carried out to understand the effect of multi-pass schedules (Figure 8.7b).

Table 8.1: Reheating temperature and time and corresponding austenite grain size

Steel	Temperature / °C	Time / s	$\overline{L_{\gamma}}$ / $\mu { m m}$
P7901	1200	120	208 ± 16
B2102	1200	120	218 ± 13

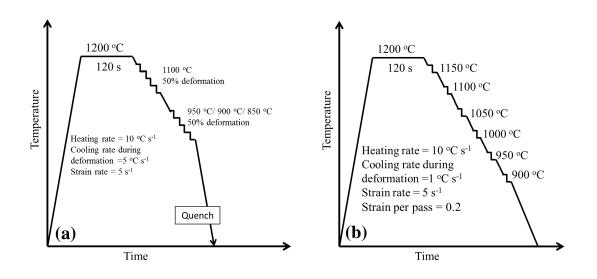
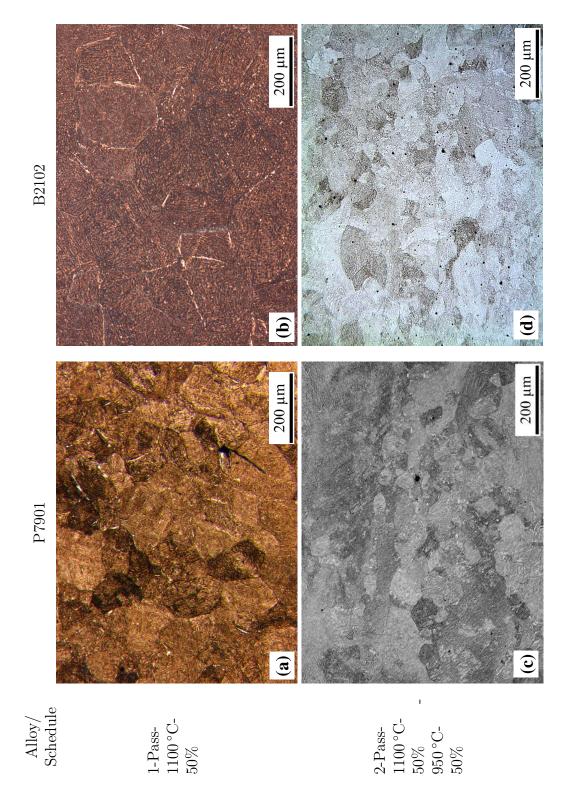


Figure 8.7: (a) Two-stage compression schedule, (b)multi-pass compression schedule.

Figure 8.8 summarises the microstructures of hot deformed prior austenite grains for the two-stage compression schedules of Figure 8.7a. The prior austenite grains from the multi-pass schedule of Figure 8.7b are shown in Figure 8.9. The mean linear intercepts ($\overline{L_0}, \overline{L_1}, \overline{L_3}$ as defined in section 8.3) and corresponding aspect ratio (E) and S_V/S_{V_0} , both predicted and experimentally calculated values, are summarised in Table 8.2. A minimum of 20 measurements were taken for each condition and the standard deviations are reported together with the average values.





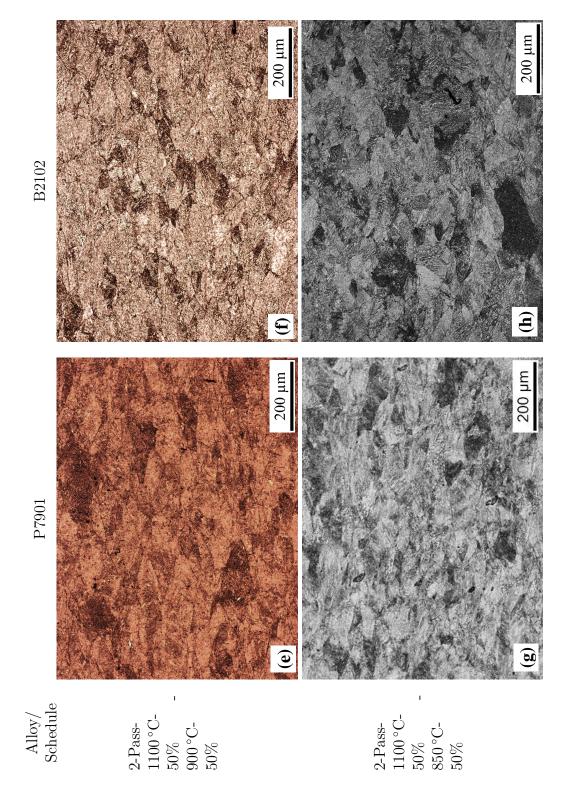


Figure 8.8 continue: Deformed austenite grain structures for two-stage compression schedules of Figure 8.7a.

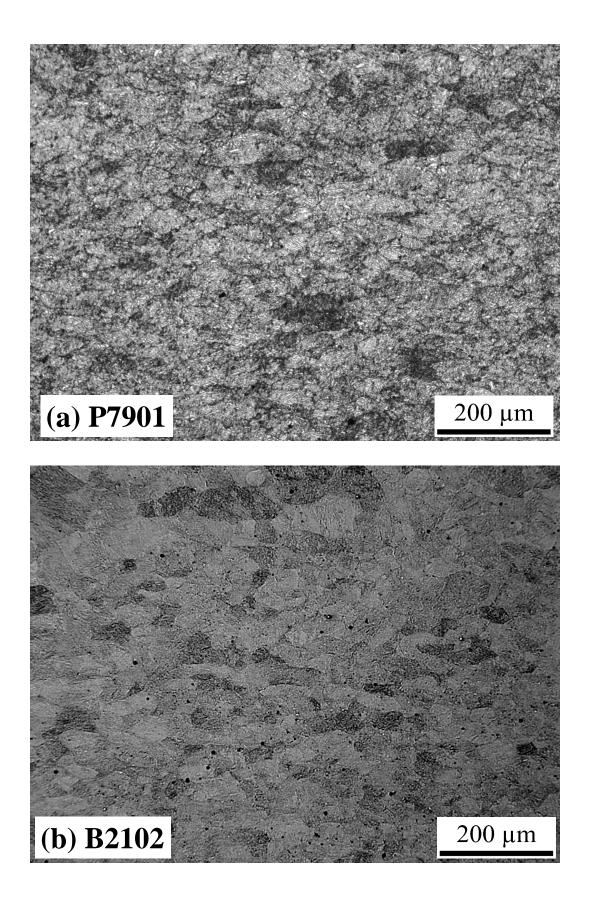


Figure 8.9: Deformed austenite grain structures for multi-pass compression schedules of Figure 8.7b.

Table 8.2: Mean linear intercepts $(\overline{L_0}, \overline{L_1}, \overline{L_3})$ as defined in section 8.3) of the deformed austenite grains and corresponding aspect ratio $(E_{\text{pred}} \text{ and } E_{\text{exp}})$ and S_V/S_{V_0} values.

exp		1.273					1.365		
$3 \frac{SV}{SV_0}$						1	1.		
$\frac{S_V}{S_{V_0}} = \text{eqn 8.3}$		1.353		1.072	l	1.353	1.072		
$\frac{S_V}{S_{V_0}} = \text{eqn } 8.2$		1.257		1.024		1.257	1.024		
$E_{\text{exp}} = \frac{\overline{L_1}}{L_3}$		0.965	3.078	1.484		1.051 3.082		1.459	
E_{pred}		2.828		1.397		2.828	1.397		
$\overline{L_3} \ / \ \mu m$		58 ± 4 51 ± 6		$31{\pm}11$		59 ± 9	49 ± 6	$37{\pm}11$	
$\overline{L_1} = \overline{L_2} / \mu \mathrm{m}$		$56{\pm}5$	157 ± 6	46±13		62±7	151±11	$54{\pm}13$	
$\overline{L_0} \ / \ \mu \mathrm{m}$	$98{\pm}13$				$101{\pm}16$				
Schedule/ Figure No.	1-Pass- 1100°C-50% Fig8.8a	2-Pass- 1100 ° C-50% -950 ° C-50% Fig 8.8c	2-Pass- 1100 ° C-50% -850 ° C-50% Fig 8.8g	Multi-pass (20% each pass) Fig 8.9a	1-Pass- 1100°C-50% Fig8.8b	1-Pass- 1100°C-50% Fig 8.8b 2-Pass- 1100°C-50% Fig 8.8d Fig 8.8d 2-Pass- 1100°C-50% Fig 8.8h Fig 8.8h		Multi-pass (20% each pass) Fig 8.9b	
Alloy			P7901		B2102				

From both Figure 8.8 and Table 8.2, it is clear that the deformed austenite grains recrystallise when finish deformed by 50% at 950 °C during the two-stage compression for both the Nb-microalloyed pearlitic (P7901) and bainitic (B2102) alloys. When the finish deformation temperature decreased to 900 °C and 850 °C, the austenite grains remain un-recrystallised and both the experimentally calculated aspect ratio and S_V/S_{V_0} values are close to the values predicted by the analytical equations 8.2, 8.3 and 8.7. If the austenite grains do not recrystallise when the deformation is less than 50%, it can be assumed that they will remain un-recrystallised under a 20% finish deformation which is typical in rail-head during rolling of rails. This is because 20% deformation will have a lower driving force for recrystallisation compared to 50% deformation.

For the multi-pass deformations with 20% reduction at each pass and finish deformed at 900 °C (Figure 8.9 and Table 8.2), the austenite also remain un-recrystallised. The $E_{\rm pred}$ and $E_{\rm exp}$ are quite similar but the S_V/S_{V_0} cannot be calculated experimentally at the moment as this would require the measurement of $\overline{L_0}$ of the deformed austenite grains at the preceding deformation step. But equations 8.2 and 8.3 can be used to calculate S_V/S_{V_0} analytically which yield lower S_V/S_{V_0} values. This indicates a lower degree of increase in grain boundary per unit volume compared to that during 50% finish deformation.

8.5 Transformation temperature

The transformation kinetics in the Nb-microalloyed pearlitic (P7901) and bainitic (B2102) alloys for different finish deformation temperature (950 °C, 900 °C, 850 °C) at 20% finish deformation during the two-stage compression tests are compared in Figure 8.10 for a typical rail-head cooling rate of $0.6 \,^{\circ}\text{C}\,\text{s}^{-1}$. The effects of the amount of finish deformation (20% and 50%) are also studied at 900 °C finish deformation temperature. The transformation temperatures were calculated by an offset method as described by Yang et al. [153] [Figure 8.11].

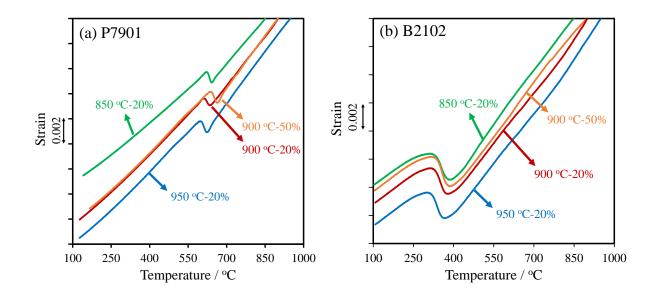


Figure 8.10: Dilatation curves during cooling at $0.6 \,^{\circ}\mathrm{C \, s^{-1}}$ after different finish deformation schedule during two-stage compression tests: (a) P7901, (b) B2102.

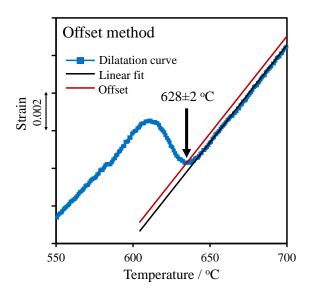


Figure 8.11: Determination of transformation temperature by offset method [153].

The pearlite transformation temperatures in alloy P7901, calculated by the offset method are summarised in Figure 8.12a along with the hardness of the transformed pearlite. The pearlite appeared similar under optical and scanning electron microscopes for different deformation conditions. Representative optical and scanning electron micrographs of the transformed pearlite are shown in Figure 8.12b-c. At a constant finish deformation of 20%, the transformation temperature tends to increase by about 10 °C when the finish deformation temperature decreased from 950 °C to 900 °C and 850 °C. The corresponding average hardness value decreased

with increasing transformation temperature but both hardness and transformation change are not significant. This is because at 20% finish deformation, the prior austenite grain boundary area per unit volume does not increase significantly in case of no-recrystallisation. If the finish deformation amount is increased up to 50%, the transformation temperature increase significantly (by ~ 30 °C) because of a greater nucleation site density. The corresponding hardness value decrease, probably because of a coarser pearlite structure due to increased transformation temperature.

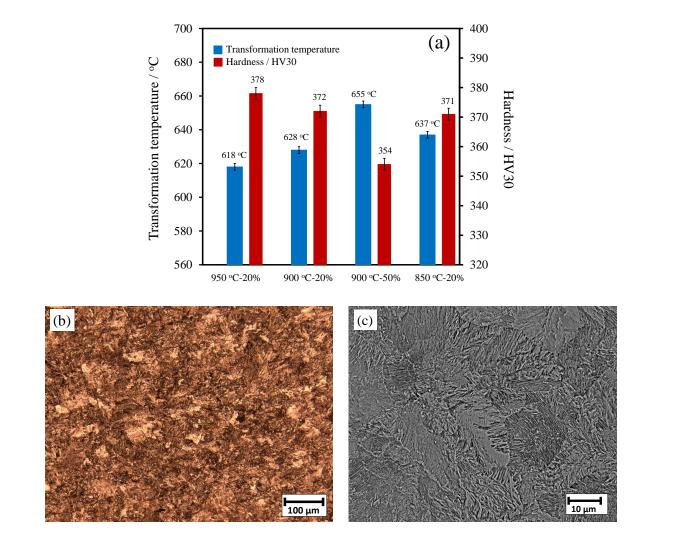


Figure 8.12: (a) Variation of transformation temperature and corresponding hardness for different finish deformation schedule for P7901 alloy. Optical micrograph in (b) and scanning electron micrograph in (c) are for $850 \,^{\circ}\text{C}-20\%$ finish deformation schedule.

The bainite transformation temperatures in alloy B2102, calculated by the offset method are summarised in Figure 8.13 along with the hardness of the transformed microstructure.

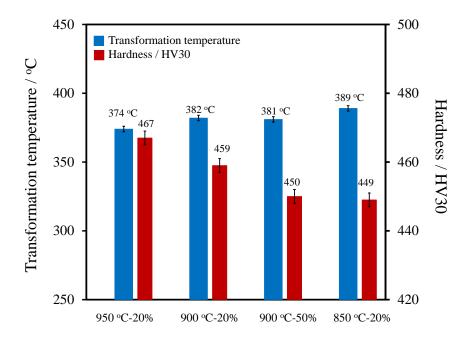


Figure 8.13: Variation of transformation temperature and corresponding hardness for different finish deformation schedule for B2102 alloy.

Representative optical and scanning electron micrographs of the transformed microstructure are shown in Figure 8.14. At a constant finish deformation of 20%, the transformation temperature tends to increase by about 8 °C when the finish deformation temperature decreased from 950 °C to 900 °C and 850 °C. The corresponding average hardness value decreased with increasing transformation temperature. When the finish deformation amount is increased up to 50% at 900 °C, the bainite transformation temperature does not change significantly but the hardness of the transformed microstructure decreases due to a mixed ferrite-bainite microstructure (Figure 8.14c-d). For 850 °C-20% deformation condition also, ferrite formation can be observed at prior austenite grain boundaries (Figure 8.14e). This ferrite may be formed due to either of the following reasons:

(i) due to increased deformation amount and low deformation temperature, the dislocation density in austenite as well as the grain boundary area per unit volume are increased which reduce the incubation time for diffusional ferrite transformation during cooling in Si-rich cementite-free bainitic alloys. But the dilatation curves (Figure 8.10b) do not show any deviation from linearity until bainitic transformation starts. This may be due to small amount of ferrite formation during cooling which does not result in detectable dilatation.

(ii) another possibility is the formation of deformation induced ferrite during deformation itself prior to cooling. The A_{e_3} temperature for B2102 is 846 °C and the deformation temperatures where ferrite formation has been observed, are quite close. So it is quite possible that during deformation at temperatures close to A_{e_3} , austenite may transform to ferrite and the transformed ferrite itself may undergo further deformation.

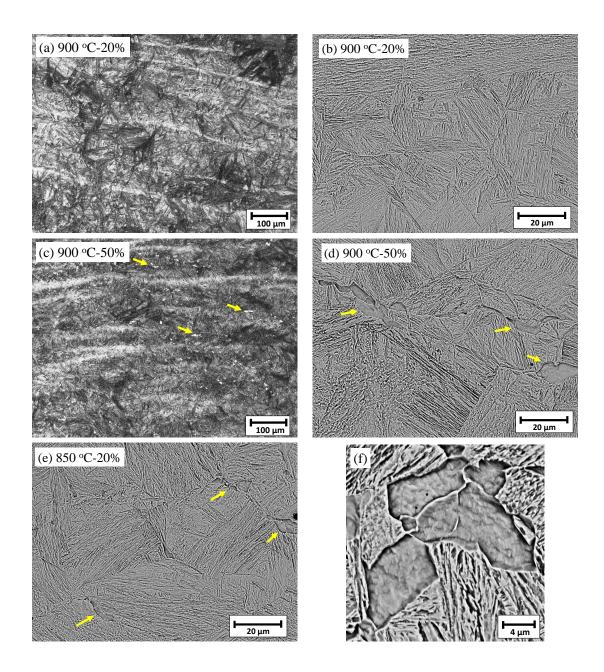


Figure 8.14: Transformed microstructures for different deformation schedules in B2102 alloy. Arrows indicate ferrite at prior austenite grin boundaries. (a), (b) 900 °C-20% finish deformation. (c), (d) 900 °C-50% finish deformation. (a) and (c) are optical micrographs while (b) and (d) are SEM micrographs. (e) SEM micrograph for 850 °C-20% finish deformation. (f) SEM micrograph showing ferrite at prior austenite grain boundary.

8.6 Summary

The important findings from this study are:

- (i) Niobium microalloying certainly affects the recrystallisation kinetics of high carbon (0.8 wt% C) austenite and low carbon (0.2 wt% C) Si-rich austenite in pearlitic and cementite-free bainitic alloys, respectively, by increasing the norecrystallisation temperature. Austenite tends to remain un-recrystallised below 900-950 °C for the investigated Nb-microalloyed alloys.
- (ii) The topology of the deformed austenite can be approximated by the stereological calculations provided the grains are not recrystallised. In case of recrystallised austenite grains, experiments with variable strain and strain rates, need to be carried out to develop equations for recrystallisation kinetics for these Nb-microalloyed alloys.
- (iii) The pearlite transformation kinetics tend to accelerate when deformed below the no-recrystallisation temperature but the effect is low until the amount of deformation is significant.
- (iv) The bainite transformation kinetics also tend to accelerate with decreasing deformation temperature. But during heavy deformation near A_{e_3} temperature for the Si-rich bainitic alloys, ferrite transformation may occur which reduce the effective hardness in the final microstructure.

Chapter 9

Microstructure and mechanical properties of as-rolled material

9.1 Introduction

The as-rolled microstructure and mechanical properties (tensile, impact toughness and wear) of the alloys listed in Tables 9.1 and 9.2 are analysed. The experimental methodology is detailed in Chapter 5.

Alloy	С	Mn	Si	Cr	Mo	Nb	Р	S
B2102	0.21	2.0	1.9	0.54	0.52	0.019	0.0023	0.0007
B2200	0.22	2.0	1.9	0.54	0.47	-	0.0026	0.001
P7901	0.79	0.98	0.41	0.57	-	0.011	0.0022	0.0005
P7600	0.76	1.0	0.42	0.53	-	-	0.0023	0.0007

Table 9.1: Composition for alloys (wt%)

Table 9.2: Hot rolling schedule

Alloy	Reheating temperature and time	Hot Rolling	Initial	Pass 1	Pass 2	Pass 3	Pass 4	Pass 5	
B2102 B2200 P7901 P7600	1200 °C - 2 h	Reduction/ $\%$	-	11	24	24	22	22	Air cooling
		Temperature/ $^{\rm o}{\rm C}$	1200	1180	1150	1100	1020	870	
		Thickness/ mm	95	85	64	49	38	30	0

9.2 Results and discussion

9.2.1 Microstructure and tensile properties

The optical and SEM micrographs of the bainitic alloys (B2200 and B2102) are shown in Figure 9.1 along with the hardness values. The inverse-pole figure (IPF) maps by EBSD are shown in Figure 9.2a-b with corresponding colour keys. The $\{100\}$ stereographic pole figures of ferrite and intensity contour plots are shown in Figure 9.2d-e. The prior austenite grain size measurements were carried out by delineating approximately the continuous retained austenite networks at austenite grain boundaries as shown in Figure 9.3. Figure 9.4 compares the prior austenite grain sizes (PAGS) in terms of mean linear intercepts along the rolling direction $(\overline{L_{\rm RD}})$ and along the normal direction $(\overline{L_{\rm ND}})$.

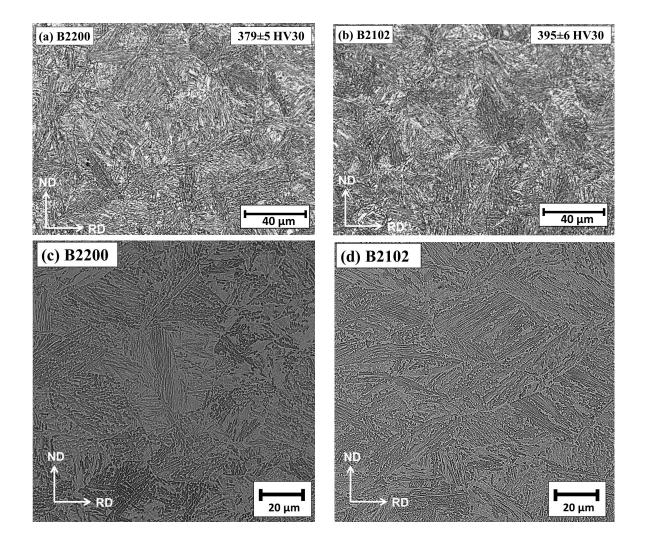


Figure 9.1: Optical micrograph of B2200 (a) and B2102 (b) and corresponding hardness values; SEM micrograph of B2200 (c) and B2102 (d)

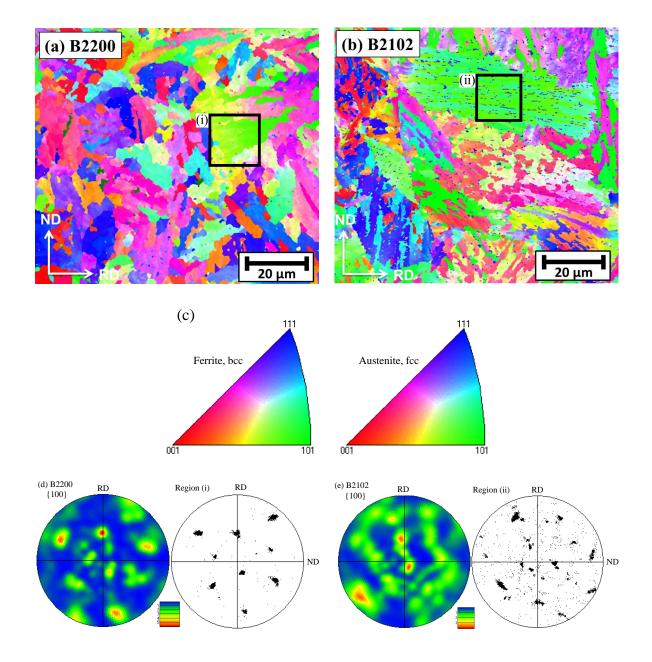


Figure 9.2: IPF map of B2200 (a) and B2102 (b) and the corresponding colour key in (c). {100} pole figure intensity contour plots of ferrite in B2200 (d) and B2102 (e) with the corresponding individual {100} poles from regions (i) and (ii) as marked in (a) and (b) respectively.

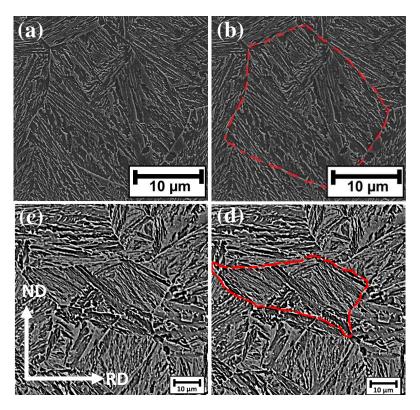


Figure 9.3: Representative austenite grain boundary delineation in bainitic microstructures: (a),(b) equiaxed grains in B2200 and (c),(d) elongated grains in B2102.

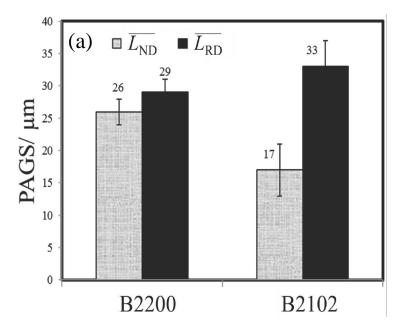


Figure 9.4: Comparison of prior austenite grain size (PAGS) in terms of mean linear intercept along rolling direction $(\overline{L_{\text{RD}}})$ and along the normal direction $(\overline{L_{\text{ND}}})$

Both SEM and EBSD maps along with the average aspect ratio ($E = \overline{L_{\text{RD}}}/\overline{L_{\text{ND}}}$) calculation show that the austenite grains in B2102 ($E_{\text{B2102}} = 1.98$) have not recrystallised while those in B2200 ($E_{\text{B2200}} = 1.11$) have. The stereographic projection of {100} poles for B2102 (Figure 9.2e), tend to be more homogeneously distributed compared to a relatively more scattered distribution of {100} poles for B2200 in Figure 9.2c. There will be gradients of orientation in the un-recrystallised austenite in B2102 caused by defects introduced by the deformation, which in turn lead to more random orientation of bainite during transformation. This is reflected into a more homogeneous distribution of poles in B2102.

X-ray diffraction spectra for the bainitic alloys are illustrated in Figure 9.5a. The retained austenite volume fraction (V_{γ}) was calculated from the integrated austenite (γ) and ferrite (α peaks by Rietveld refinement in both MAUD and High-Score Plus software for X-ray diffraction analysis. V_{γ} is more for Nb-microalloyed B2102, probably because of increased prior austenite grain boundary area due to un-recrystallised grains and mechanical stabilisation of bainite growth due to increased dislocation density in prior austenite. Individual $\gamma(200)$ and $\alpha(200)$ peaks of B2200 and B2102 are normalized with respect to their respective peak intensity and superimposed in Figure 9.5b-c. Substantial peak broadening of both austenite (γ) and ferrite (α) peaks can be observed for B2102 where bainite transformation occur from un-recrystallised austenite.

The longitudinal (L) and transverse (T) tensile properties are plotted in Figure 9.6. The change in tensile strength is negligible but the ductility, particularly reduction of area, tends to improve for the niobium containing B2102 compared to the steel B2200 which is not microalloyed. Because the elongation is not uniform along the entire gauge length and is greatest at the at the center of the neck, the percent elongation is not an absolute measure of ductility and also gauge length dependent. The reduction in area, being measured at the minimum diameter of the neck, is a better indicator of ductility. The increased retained austenite volume fraction in B2102 can be attributed to the increased ductility. According to the percolation model proposed by Bhadeshia [154], failure during a tensile test occurs when the retained austenite in the microstructure loses continuity due to progressive transformation during deformation. This percolation threshold being 0.1 (10%), below which continuity in austenite is lost and failure is initiated. More is the retained austenite volume fraction, more plastic strain will be required for failure which increases ductility.

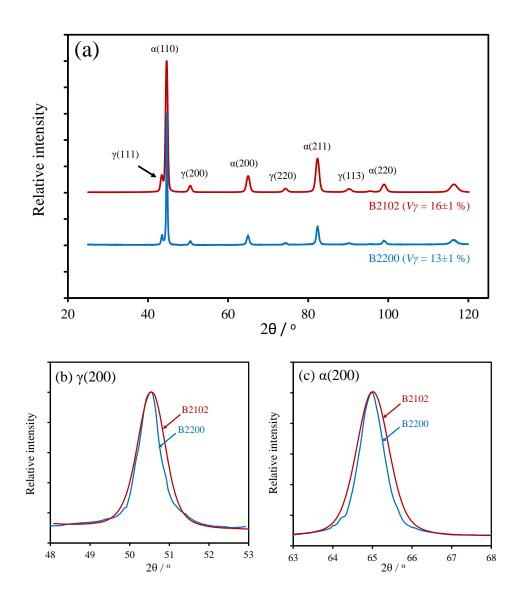


Figure 9.5: (a) X-ray diffraction spectra and measured retained austenite volume fraction V_{γ} for B2200 and B2102 steels. (b) $\gamma(200)$ peak and (c) $\alpha(200)$ peak. Each $\gamma(200)$ and $\alpha(200)$ peak from B2200 and B2102 is normalized with respect to their respective peak intensity and superimposed.

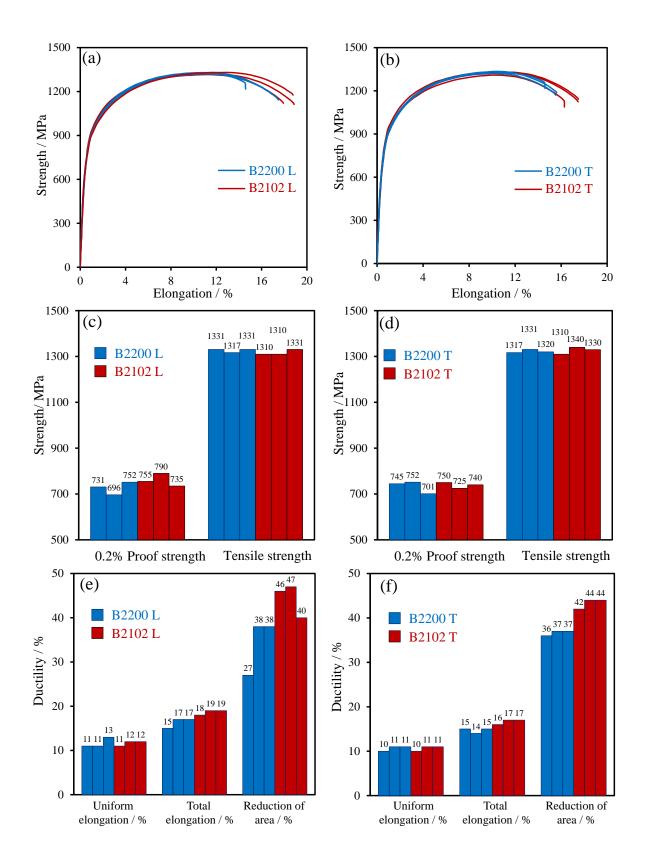


Figure 9.6: Tensile properties of bainitic alloys B2200 and B2102 in longitudinal (L) orientation in (a), (c), (e) and in tranverse (T) orientation in (b), (d), (f).

The optical and SEM micrographs of the pearlitic alloys (P7600 and P7901) are shown in Figure 9.7. The inverse-pole figure maps by EBSD and corresponding pole figures are shown in Figure 9.8. The change in crystallographic unit size with critical orientation angle is plotted in Figure 9.9. At small misorientation angles ($<10^{\circ}$), the crystallographic unit sizes are comparable in both alloys but at higher misorientation angles, the crystallographic unit size tends to refine in the Nb-microalloyed P7901, possibly due to refinement in prior austenite grain size due to Nb-microalloying. But this refinement is unlikely to have significantly affected the pearlite transformation temperature because as seen from Figure 9.10, the interlamellar spacing and hardness values are comparable in both the alloys.

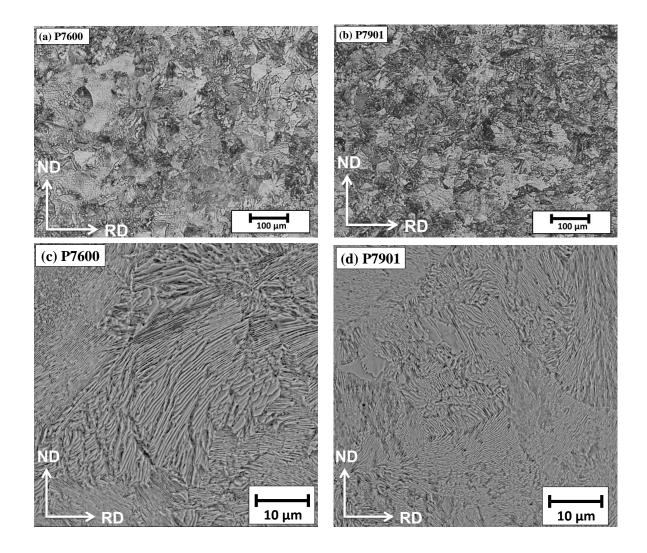


Figure 9.7: Optical micrograph of P7600 (a) and P7901 (b); SEM micrograph of P7600 (c) and P7901.

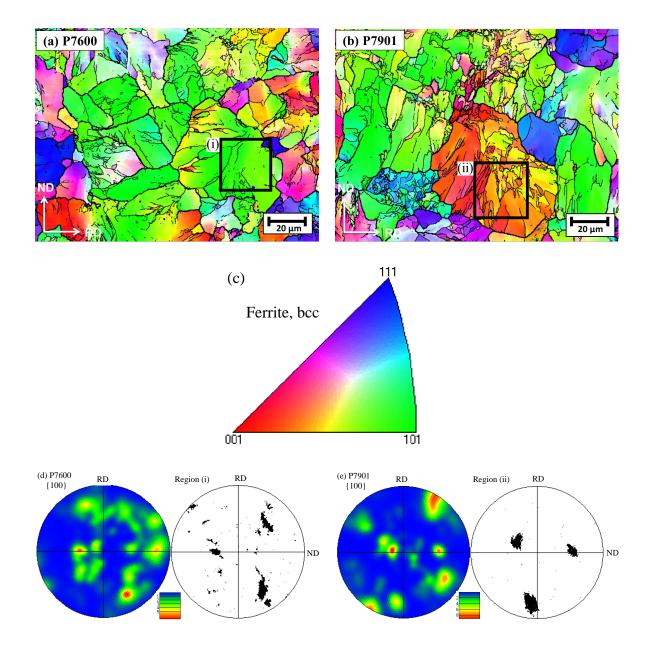


Figure 9.8: IPF map of P7600 (a) and P7901 (b) and the corresponding colour key in (c). Thick lines indicate high angle boundaries (> 15°) and thin lines indicate low angle boundaries $(3^{\circ} - 15^{\circ})$. {100} pole figure intensity contour plots of ferrite in P7600 (d) and P7901 (e) with the corresponding individual {100} poles from regions (i) and (ii) as marked in (a) and (b) respectively.

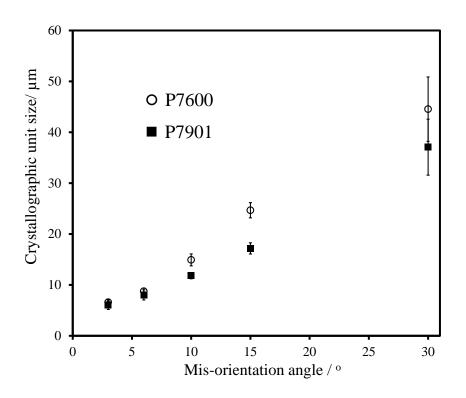


Figure 9.9: Variation of crystallographic unit size with critical misorientation angle

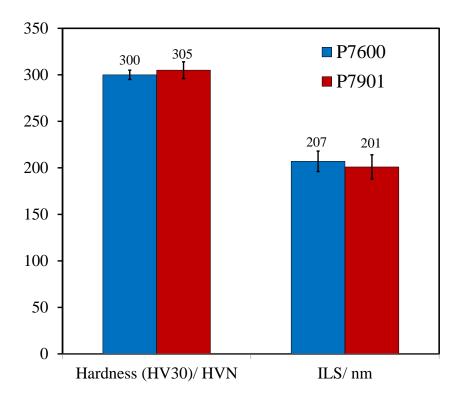


Figure 9.10: Comparison of hardness (HV30) and mean random interlamellar spacing (ILS) for P7600 and P7901.

The longitudinal and transverse tensile properties are plotted in Figure 9.11. The tensile strength improves by ~ 30 MPa in the Nb-microalloyed P7901 alloy despite having similar interlamellar spacing and hardness values compared to P7600. The small refinement in crystallographic unit size in Nb-microalloyed P7901 may be attributed to the improved tensile strength. Unlike the bainitic steels, the ductility, particularly the reduction in area tends to decrease in the Nb-microalloyed pearlitic steels due to increased strength. Here also, change in reduction in area is more significant than total elongation.

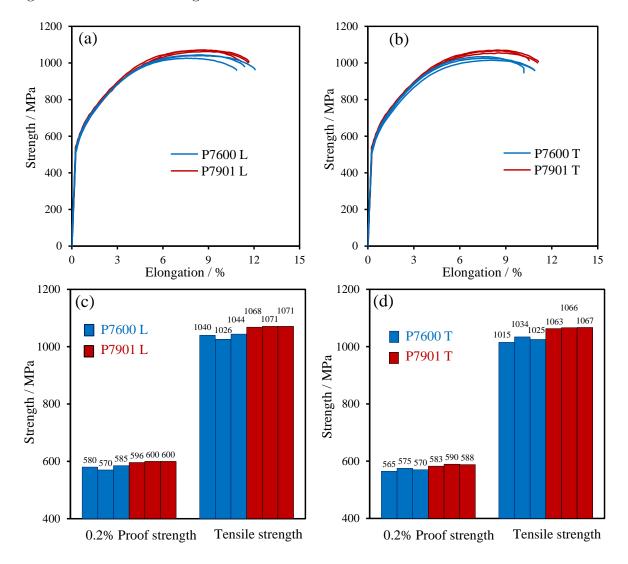


Figure 9.11: Tensile properties of pearlitic alloys P7600 and P7901 in longitudinal (L) orientation in (a), (c) and in tranverse (T) orientation in (b), (d).

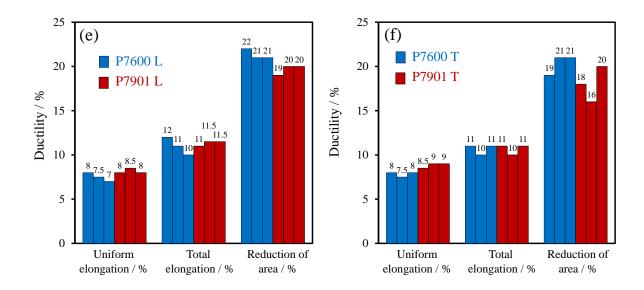


Figure 9.11 continued: Tensile properties of pearlitic alloys P7600 and P7901 in longitudinal (L) orientation in (e) and in tranverse (T) orientation in (f).

9.2.2 Charpy impact toughness

The Charpy impact toughness properties at room temperature in L and T orientation are summarised in Figures 9.12 and 9.13 for bainitic and pearlitic alloys respectively. For the bainitic alloys, the toughness tends to improve by $\sim 24\%$ in the L orientation for the niobium containing B2102 compared to the steel B2200 which is not microalloyed. The transverse toughness is about similar for both steels. The cementite in pearlite microstructure makes this kind of steel inherently brittle and the small refinement in crystallographic unit size (by $\sim 5 \,\mu\text{m}$ with an average size of $\sim 22 \,\mu\text{m}$) is not sufficient to improve the toughness significantly in the Nb-microalloyed P7901. But due to possible rolling anisotropy, the toughness in transverse (T) orientation decreases in P7901.

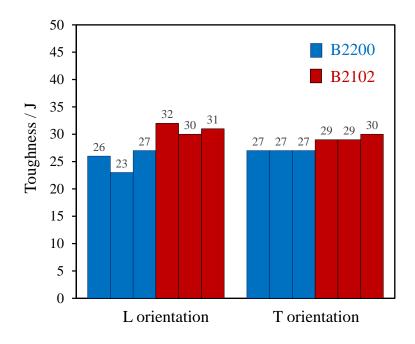


Figure 9.12: Charpy impact toughness in longitudinal (L) and transverse (T) orientation for B2200 and B2102 alloys.

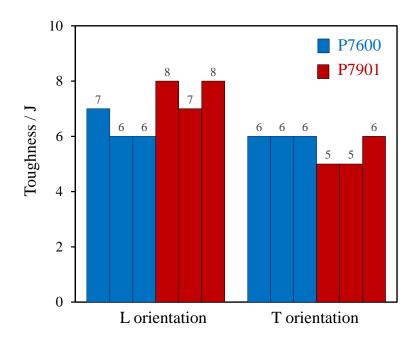


Figure 9.13: Charpy impact toughness in longitudinal (L) and transverse (T) orientation for P7600 and P7901 alloys.

The fracture surfaces of the impact tested samples were observed using SEM. Representative fractographs for the bainitic and pearlitic alloys are shown in Figures 9.14 and 9.15, respectively. The river lines in the fracture surface are traced back to find the origin of cleavage initiation. No coarse NbC particles can be observed at the initiation sites. The cleavage fracture facet boundaries were identified and delineated as shown in Figure 9.16. The facet size distribution was measured in terms of equivalent circle diameter and compared in Figure 9.17. Approximately 50 facets were identified and measured for each value quoted. The decrease in the cleavage facet size in the Nb-microalloyed B2102 indicates improvement in toughness.

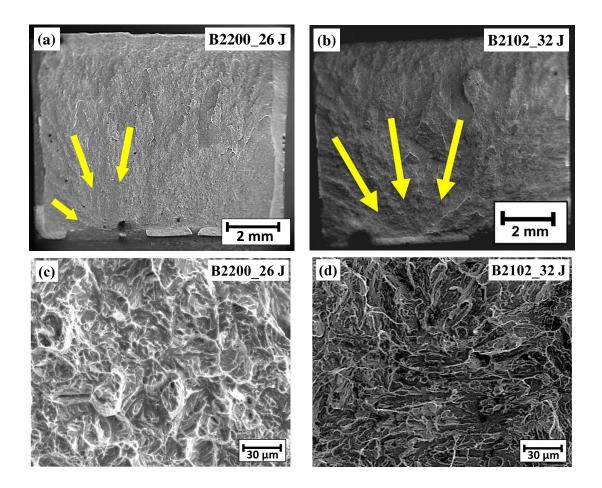


Figure 9.14: Fracture surface morphology of the impact tested samples at room temperature: (a), (c) B2200 (toughness 26 J); (b), (d) B2102 (toughness 32 J). Yellow arrows trace the river lines back to the cleavage fracture initiation points.

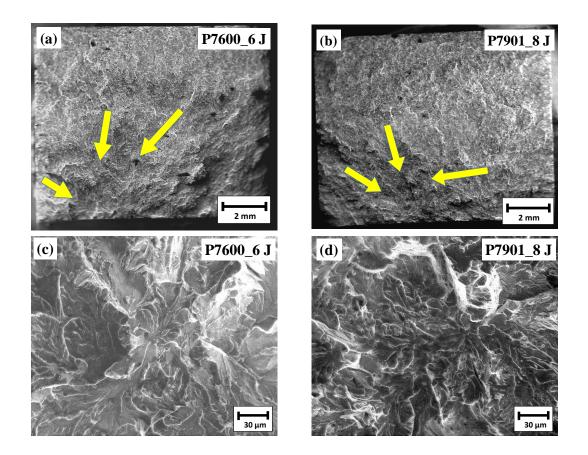


Figure 9.15: Fracture surface morphology of the impact tested samples at room temperature: (a), (c) P7600 (toughness 6 J); (b), (d) P7901 (toughness 8 J). Yellow arrows trace the river lines back to the cleavage fracture initiation points.

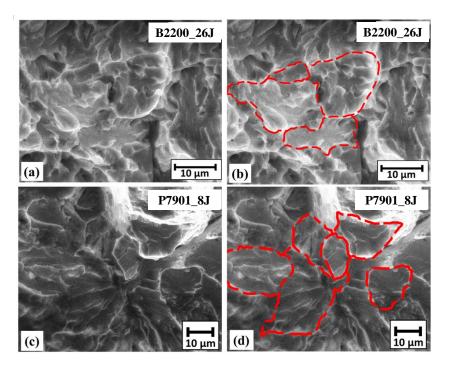


Figure 9.16: Representative cleavage fracture facet delineation for impact tested samples: (a), (b) Bainitic; (c), (d) Pearlitic.

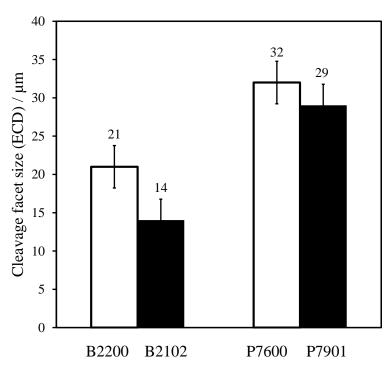


Figure 9.17: Cleavage fracture facet size in terms of equivalent circle diameter (ECD) comparison for the investigated alloys.

The impact tested samples were cut perpendicular to the main fracture surface and non-propagating secondary microcracks were studied in the vicinity of the main fracture surface as shown in Figure 9.18. Pearlite is inherently brittle as the number density and size of the microcracks are both significantly high compared to the bainitic steels. The cracks in the bainitic alloys tend to be blunted or deviate at the retained austenite networks. There is a slightly greater volume fraction of retained austenite in the Nb-microalloyed B2102, which contributes to its improved toughness compared to B2200 which is not microalloyed. Low angle grain boundaries (<15°) in pearlitic microstructures cannot arrest crack while high angle boundaries can deflect the crack, thus contributing to toughness as shown in Figure 9.19. In an instance, primary niobium carbide can be found in the vicinity of the notch as observed in Figure 9.20 for P7901 steel. For the B2102 steel, no such observation of niobium carbides in the vicinity of the notch is found.

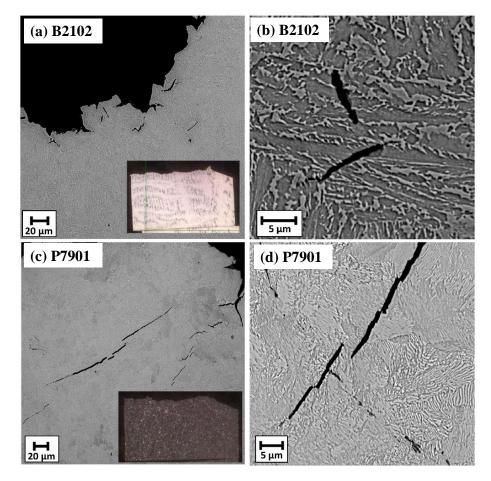


Figure 9.18: Non-propagating secondary microcracks in (a),(b) B2102 and (c),(d) P7901. The insets in (a) and (c) show the observation plane which is perpendicular to the main cleavage plane.

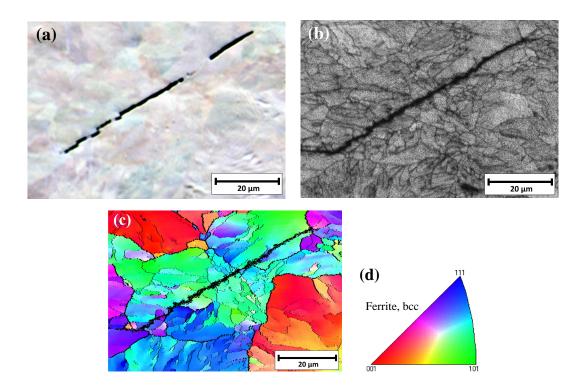


Figure 9.19: EBSD (step size= $0.16 \,\mu\text{m}$) of a secondary microcrack perpendicular to main cleavage plane in a pearlitic alloy: (a) back-scattered electron image, (b) band contrast map, (c) inverse pole figure (IPF) map and (d) corresponding colour key. Thick lines indicate high angle boundaries (> 15°) and thin lines indicate low angle boundaries (3° - 15°).

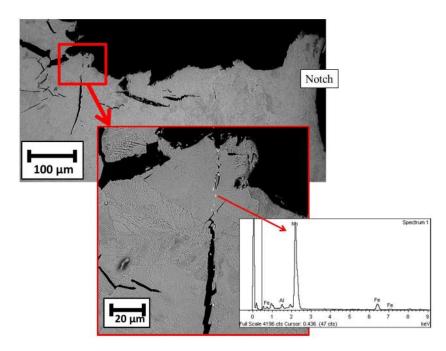


Figure 9.20: Primary niobium carbides in the vicinity of the notch for P7901 steels.

9.2.3 Wear performance

The wear testing methodology is detailed in the Chapter 5 on experimental methodology. Figure 9.21 compares the wear performance of the investigated alloys along with the hardness values. The Vickers hardness (HV 30) of each disc was measured at three positions just below the disc surface and the average of these measurements is used as the disc hardness. Bainitic alloys (hardness>320 HV) were tested at 750 MPa stress whereas the pearlitic alloys (hardness<320 HV) were tested at stress 560 MPa. The error in each experimental wear rate data is calculated from a neural network model perceived noise in a collection of 758 other wear test results from earlier experiments on different compositions using the identical test setup at STC, Tata Steel, UK. The details of the neural network model are summarised in Chapter 10.

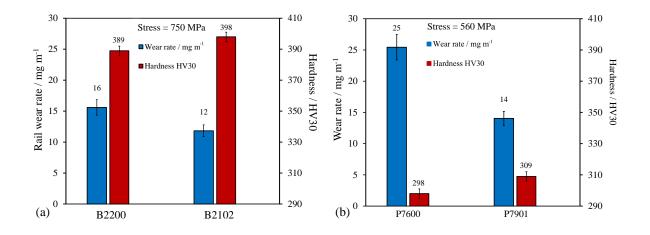


Figure 9.21: Wear rates and hardness for (a) bainitic alloys B2200 and B2102, (b) pearlitic alloys P7600 and P7901. The error in each experimental wear rate data is calculated from a neural network model perceived noise and reflect the repeatability error for each experiment.

Even though the bainite steels were tested at a higher contact stress, their wear resistance was better or comparable to the pearlitic alloys which were tested at a lower contact stress of 560 MPa. This is because the bainitic microstructures are generally more wear resistant than pearlite of the same strength levels. The wear rate decreased in the Nb-microalloyed alloys compared to their non-microalloyed counterparts essentially due to increased hardness. The decrease in wear rate is less in the bainitic alloys, presumably because the wear rate itself is low to begin with, but significant for pearlitic alloys. The addition of 0.01 wt% Nb in pearlitic compositions increased the hardness by $\sim 10 \,\text{HV}$ and the mean yield strength (averaged over both L and T orientation from Figure 9.11) by $\sim 20 \,\text{MPa}$, but approximately doubles the wear resistance.

The wear tested samples were cut parallel and also perpendicular to the wear direction and the subsurface cross-sections were observed using SEM. The wear mechanism for both the bainitic alloys are similar. Some regions contain a plastically deformed layer containing numerous voids and microcracks as shown in Figures 9.22a and b. The orientation of the samples are shown in the inset. Whereas in some areas, the deformed layer is worn out as shown in Figure9.22c indicating non-uniform wear along the circumference of the discs. Solano et al. observed similar kind of damage mechanism under rolling contact stresses in nanostructured bainitic steels [155] and in cementite-free bainite rails [156] where ductile micro-void initiation was attributed to the strain incompatibility at interfaces between bainitic-ferrite and blocky retained-austenite regions transformed into martensite or, between ferrite and austenite layers due to dislocation pile-up. Voids coalesce and form cracks. For the Nb-microalloyed B2102, sometimes NbC can be observed associated with the microcracks as shown in Figure 9.22d.

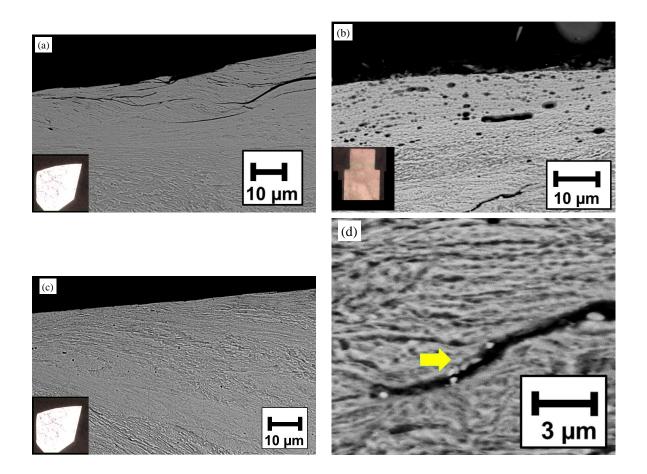


Figure 9.22: Deformed subsurface layer containing voids and microcracks in (a) parallel to wear direction, (b) perpendicular to wear direction. (c) Worn out deformed layer in a region parallel to wear direction. The observation planes are shown in the insets. (d) Yellow arrow indicating NbC particles associated with a microacrack.

For the pearlitic alloys, P7600, which is non-microalloyed undergoes gross plastic deformation as observed from the lip formation at the corners in Figure 9.23a due to increased plastic side flow as compared to microalloyed P7901 (Figure 9.23b). The mean yield stress (averaged for both L and T orientation) for P7600 is 574 MPa which is quite close to the 560 MPa contact stress whereas mean yield stress for P7901 is 593 MPa (Figure 9.11). Figures 9.24a and b shows depth of the plastically deformed layer parallel to the wear direction. Once the plasticity is exhausted, cracks form and eventually the layer is removed by flaking. Sub-surface voids and cracks can be observed as indicated by yellow arrows. The sub-surface cracks tends to be confined within a crystallographic unit grain i.e. arrested by high-angle boundaries as shown in Figure 9.24c. In P7901, sometimes NbC can be observed associated with the microcracks as shown in Figure 9.24d.

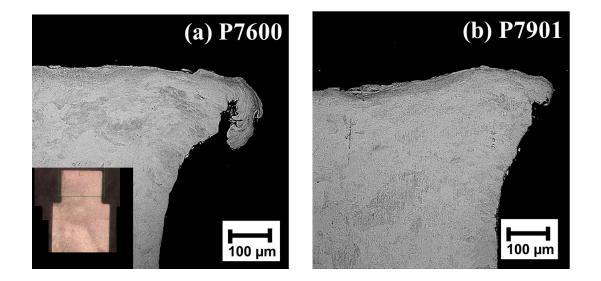


Figure 9.23: Plastic deformation in identically tested wear specimens (a) P7600, (b) P7901. The observation plane is shown in the inset in (a).

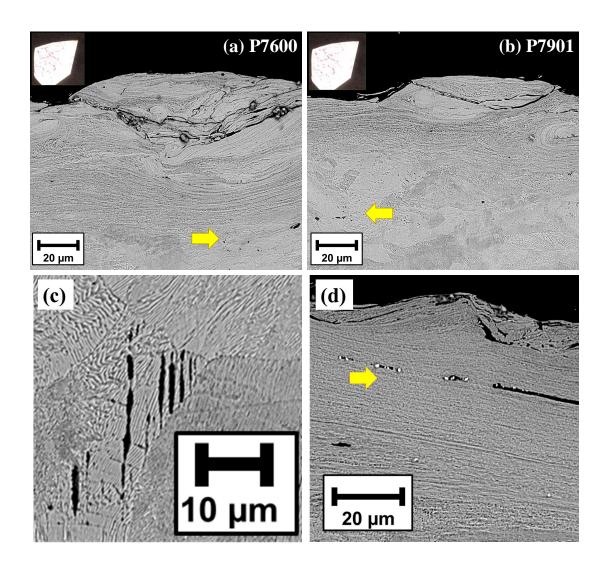


Figure 9.24: Deformed layer parallel to wear direction containing microcracks and sub-surface voids in (a) P7600, (b) P7901. (c) Microcracks arrested at high angle boundaries, (d) yellow arrow indicating NbC particles associated with a crack.

9.3 Summary

The important findings from this study are:

- (i) Niobium microalloying certainly affects the austenite recrystallisation kinetics of low carbon (0.2 wt% C) Si-rich cementite-free bainitic alloys. Austenite tends to remain un-recrystallised and develop a pancaked morphology in the Nb-microalloyed alloy when finish rolled at 870 °C; in contrast, the austenite in the non-microalloyed steel recrystallises and hence has an equi-axed grain shape.
- (ii) Increased austenite grain boundary area and increased dislocation activity, hinder bainite growth and the retained austenite volume fraction increase which leads to slightly improved ductility and toughness.
- (iii) Nb-microalloying improves the hardness and in turn the wear resistance properties of cementite-free bainitic steels. The bainitic microstructures are generally more wear resistant than pearlite of the same strength levels. Bainite with higher hardness than pearlite, when subjected to a higher contact stress (750 MPa), have comparable or better wear resistance than the less hard pearlite under a lower contact stress (560 MPa).
- (iv) For the pearlitic alloys, 0.01 wt% Nb addition refine the crystallographic unit size in the microstructure. The effect of this refinement improves the tensile strength and toughness negligibly, but the wear resistance improves significantly. Nb-microalloying minimizes the gross plastic deformation of pearlite, leading to low wear rate.
- (v) The undissolved primary niobium carbide sizes are fine enough to not trigger any cleavage fracture initiation. But brittle cementite in pearlite microstructure makes this kind of steels inherently brittle while the fineness in bainitic microstructures provide good toughness which can also be improved by niobium microalloying.

Chapter 10

Neural network modelling of wear

10.1 Introduction

A Bayesian neural network model can be constructed to estimate the wear performance of rail compositions. The perceived noise in the experimental data can also be analysed to ascertain the repeatability of an experiment. Details of the neural networks have been given by numerous authors [157–170] and relevant applications in materials science field have been comprehensively reviewed by Bhadeshia et al. [171,172]. The neural network models applied in a Bayesian framework [157–160], are implemented in 'Neuromat's Model Manager' [173,174] which provides a graphical interface to MacKay's 'bigback' program [175], used extensively in the Phase Transformations and Complex Properties group at the University of Cambridge.

10.2 The technique

In brief, a typical neural network consists of an input layer, a hidden layer and an output layer as illustrated in Figure 10.1. The output variable y is expressed as a linear summation of activation functions, h_i , with weights w_i and the bias θ .

$$y = \sum_{i} w_i h_i + \theta \tag{10.1a}$$

$$h_i = \tanh\left(\sum_j w_{ij}x_j + \theta_i\right) \tag{10.1b}$$

The weightings are simplified for interpretation purposes by normalising the data within the range ± 0.5 .

$$x_j = \frac{x - x_{\min}}{x_{\max} - x_{\min}} - 0.5 \tag{10.2}$$

where x is the input value and x_j is the normalised value [171,172,174].

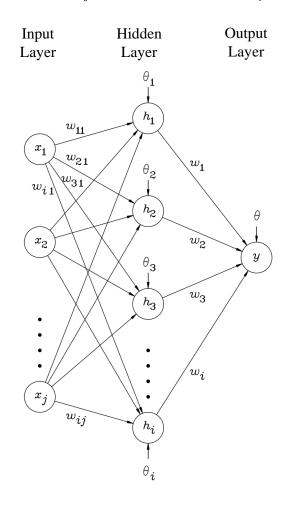


Figure 10.1: Sturcture of a three layer neural network [174].

The input data are divided into two sets, a training and a test data set to avoid overfitting of data. The model is produced using only the training data. The test data are then used to determine the optimum complexity of the model by assessing its ability to model previously unseen data.

In the Bayesian neural network [157], the 'training' is achieved by altering the parameters to fit the functions to the data using 'back-propagation' gradient descent optimisation procedures [176]. The purpose is to optimise an objective function which combines an overall error term (E_D) to assess how good the fitting is and a regularisation term (E_W) to force the network to use appropriately small weights.

$$M(w) = \beta E_D + \alpha E_W \tag{10.3a}$$

$$E_D = \frac{1}{2} \sum_{k} (t^k - y^k)^2$$
(10.3b)

$$E_W = \frac{1}{2} \sum_i w_i^2 \tag{10.3c}$$

where β and α are complexity parameters which greatly influence the complexity of the model, t^k and y^k are the target and corresponding output values respectively, for one example input from the training data x^k . This automatically infers overcomplex and underregularised models to be less probable, even though the flexibility of equation 10.1 allows them to fit the data better [174].

10.2.1 Noise and uncertainty

It is important to distinguish between two kinds of error: noise and uncertainty [171,172]. Noise is when the outcome of an experiment which is repeated a number of times results is slightly different results. A term $\sigma_{\rm v}(=\beta^{-\frac{1}{2}})$ is used as the framework estimate of the noise level of the training data [175]. The second kind of error is the uncertainty which originates from the ambiguity in the mathematical functions capable of representing the same experimental data. Assuming that the uncertainty about the output y^k has a Gaussian distribution, the size of the error bars i.e. variance $(\sigma_y^k)^2$ can be calculated from the Hessian of the parameters by,

$$(\sigma_y^k)^2 = G_k^T A^{-1} g_k \tag{10.4}$$

where g_k is $\partial y / \partial w$ evaluated at x^k [177,178].

10.2.2 Log predictive error

The final values of the weights depend upon the initial guess made for the probability distribution of the weights and the number of hidden units. Therefore a large number of separate models are trained with different starting conditions. These sub-models are best evaluated using the log predictive error (LPE), in comparison to calculating the test error (TE). LPE penalises wild predictions less when they are accompanied by large uncertainties. Splitting the data into a training and testing set, allows alternative submodels to be compared by their performance in predicting the unseen data using equation 10.5.

LPE =
$$\sum_{k} \left[\frac{1}{2} \frac{(t^k - y^k)^2}{(\sigma_y^k)^2} + \log(\sqrt{2\pi}\sigma_y^k) \right]$$
 (10.5a)

$$TE = \frac{1}{2} \sum_{k} (t^k - y^k)^2$$
(10.5b)

10.2.3 Committee

The best *n* models as ranked by the LPE (or TE) are combined to make a committee model in the hope of attaining more reliable results. The final prediction (\bar{y}) being the average of the predictions of the submodels and the variance of the committee's predictive distribution plus the mean of the variances are given by:

$$\bar{y} = \frac{1}{n} \sum_{l} y^{l} \tag{10.6a}$$

Variance
$$\sigma^2 = \frac{1}{n} \sum_{l} (\sigma_y^l)^2 + \frac{1}{n} \sum_{l} (y^l - \bar{y})^2$$
 (10.6b)

where n is the number of submodels in the committee and $\bar{y} \pm \sigma_y^l$ is the estimate of a particular model *l*. The test errors of the predictions made by the different committees, are calculated in a similar manner to the test error of a single model and the one with the lowest perceived predictive error used.

$$\mathrm{TE}\bigg|_{\mathrm{committee}} = \frac{1}{2} \sum_{n} (t_n - \bar{y}_n)^2 \tag{10.7}$$

Once trained, the network captures interactions between the inputs because of the nonlinearity of the activation function. The nature of the interactions are stored in the weights, however, in comparison to linear regression they are difficult to interpret directly, the best way to identify trends is to make predictions using the model. Predictions are accompanied by an indication of the uncertainty which depends upon the confidence of the model for that prediction, and also the level of noise perceived in the data which is assumed to have a Gaussian distribution.

10.3 The variables

The variables included in the dataset accumulated for analysis are listed in Table 10.1 along with the ranges, means and standard deviations. The full set consisted of some 758 experiments collected from TATA Steel, UK and the same rolling-sliding wear testing machine was utilised to evaluate the wear performance of the Nb-microalloyed alloys in the previous chapter.

Variables	Minimum	Maximum	Average	Standard deviation
Rail hardness $(H_R) / HV$	194	556	336.1609	75.3736
Wheel hardness $(H_W) / HV$	217	467	284.9776	32.5606
Contact stress / MPa	560	750	640.9631	94.0193
С	0.035	1.1	0.563	0.2194
Si	0.06	2.11	0.4569	0.4723
Mn	0.46	13	1.3366	1.7482
Р	0.005	0.057	0.0186	0.0081
S	0.003	0.17	0.0243	0.0136
Cr	0	2.04	0.4567	0.5514
Mo	0	2.29	0.1149	0.3101
Ni	0	8.86	0.4287	1.2887
Nb	0	0.044	0.0006	0.0043
Cu	0	0.52	0.0418	0.1025
V	0	0.16	0.0046	0.0213
Al	0	0.72	0.0049	0.0381
В	0	0.0036	0.0002	0.0007
Ti	0	0.04	0.0016	0.0063

Table 10.1: Variables and corresponding statistics. Compositions are in weight percent.

10.4 Model training

The wear rate of rails were modelled directly as a raw value, rather than as a functional form which would bound its values leading to bias [170]. This is particularly the case when training the model with logarithmic values, which induces an upper and a lower limit for the predicted values and hence biases the model, this becomes extremely obvious when extrapolating over long ranges. The input dataset is equally divided into a training and a test dataset randomly ⁸. The networks are trained with the training dataset starting with 25 hidden networks and 9 seeds ⁹. Once the training is completed, the model performances in terms of LPE, TE and σ_v , are analysed as function of model complexity (Figure 10.2).

⁸This randomness will affect the training each time the data is randomly divided for training and testing, and in turn affect the final model parameters and the output.

 $^{^{9}\}mathrm{The}$ seeds are for the pseudorandom number generator generating the initial guesses at the network weights.

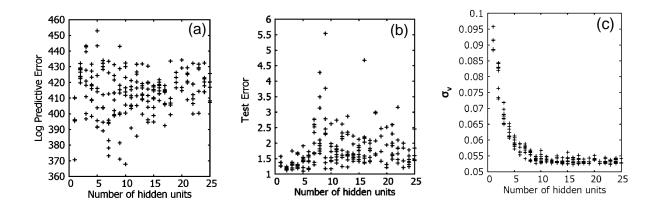


Figure 10.2: Variation in (a) log predictive error, (b) test error, and (c) σ_v , the perceived noise in the output as function of the number of hidden units.

10.5 Committee formation and testing

Predictions are averaged over a number of best-performing networks which are ranked by decreasing LPE. As discussed earlier, LPE penalises wild predictions less when they are accompanied by large uncertainties. The performance of the committees is tested against the unseen test data and the cumulative test errors are plotted against the number of submodels in the committee in Figure 10.3. The one giving the least cumulative error is selected as the best network for prediction which is in this case, is the committee comprising first 7 submodels ranked by decreasing LPE. Once the optimum committee is chosen, it is retrained on the entire dataset without changing the complexity of each model, with the exception of the inevitable and relatively small adjustments to the weights. Figure 10.4a-b shows normalised predicted values versus experimental values for the best model in the training and test datasets, respectively. The predictions made using the optimum committee of models are illustrated in Figure 10.4c.

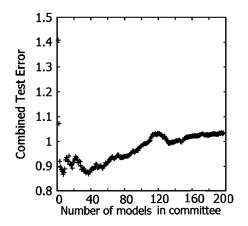


Figure 10.3: Cumulative test error with increasing number of submodels (ranked by decreasing log predictive error) in a committee.

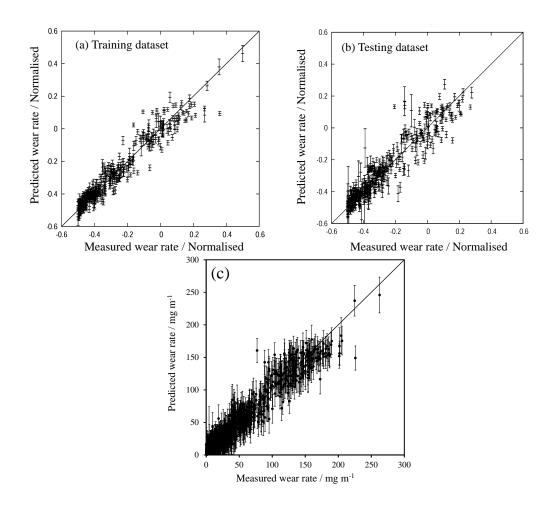


Figure 10.4: Predictions made using the best model, selected as the one having the largest log predictive error: (a) training data set, (b) test data set. (c) Predictions made on the entire dataset using the optimum committee. All the error bars contain both noise and uncertainty.

10.6 Maximum noise

The σ_v values of the 7 sub-models used to form the committee, are plotted in Figure 10.5. The maximum σ_v is 0.073. This noise, when multiplied to an experimental datum, can approximate the error in repeatability of that experimental datum. Similar concept has been used to find the error in the experimental wear data for the niobium microalloyed rails in Chapter 9. As discussed earlier, this noise is a constant and different from the uncertainty in prediction, which can be larger. The associated error will contain both the uncertainty and noise.

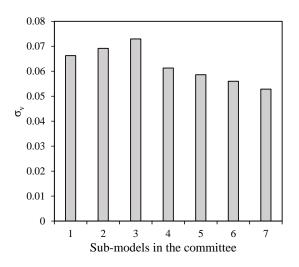


Figure 10.5: Cumulative test error with increasing number of submodels (ranked by decreasing log predictive error) in a committee.

10.7 Significance

For every input, it is possible to calculate a significance, which is a measure of the ability of an input to explain variations in the output. The significance is rather like a partial correlation coefficient, which is a function of the regularisation constants for the weights associated with the input [157,158]. Consequently the significance of each input, as perceived by the neural network model, in influencing the output wear rate can be compared against metallurgical experience. Fig. 5 illustrates the significance of each input in terms of mean of the significance from the 7 submodels in the committee and error bars represent the standard error. As expected, rail hardness (H_R) and wheel hardness (W_R) are the most important factors in controlling wear rate of rails. Among the alloying elements, Mn and S have some effect on the wear performance probably due to MnS inclusions in high sulphur steels.

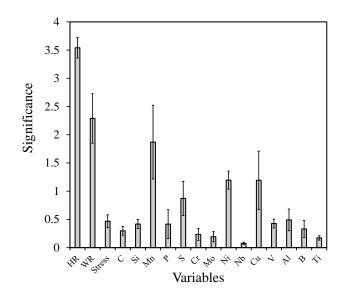


Figure 10.6: Network perceived significance of the input variables for the models in the committee.

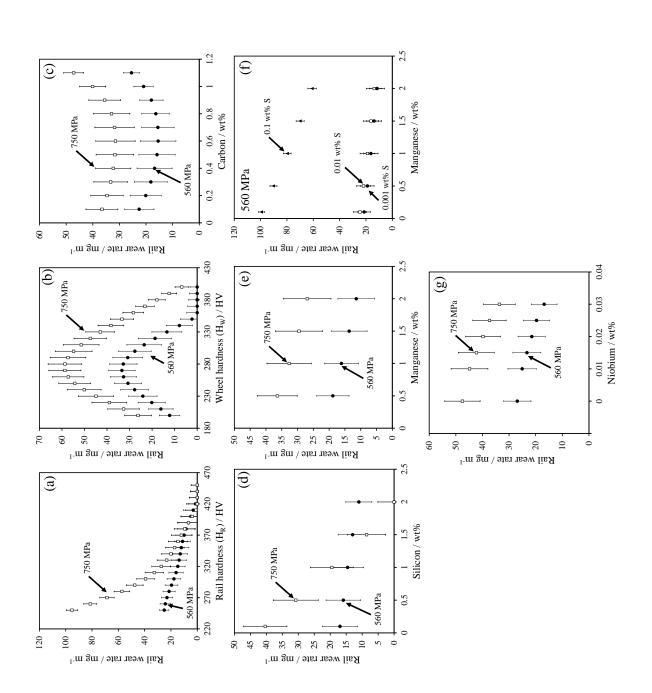
Unlike linear regression analysis, the range of applicability of a neural network model cannot be defined in terms of the range of the data used to create the model (Table 10.1). This is because the network is non-linear so the inputs will in general be expected to interact. It is the Bayesian framework of the present method which resolves this problem because it allows the calculation of error bars which define the range of useful applicability of the trained network. The model can therefore be used in extrapolation given that it indicates appropriately large uncertainties when knowledge is sparse.

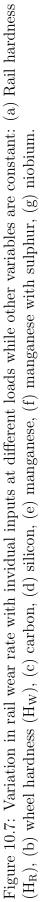
10.8 Predictions

To determine the sensitivity of the model to individual input variables, predictions are made by changing one variable whilst keeping all the others constant. The constant values for the variables are given in Table 10.2. Figure 10.7 demonstrates the effect of individual inputs on rail wear rates.

Table 10.2: Constant values for variables in Figure 10.7. Compositions are in wt%.

$\begin{array}{c} \text{Rail hardness} \\ (\text{H}_{\text{R}}) \end{array}$	Wheel hardness (H_W)	С	Si	Mn	Р	S	Cr	Mo-Ni-Nb-Cu-V-Al-B-Ti
310 HV	$210\mathrm{HV}$	0.78	0.42	1.0	0.0021	0.0005	0.55	0





For Figure 10.7a, at a constant wheel hardness of 210 HV and constant rail composition, the wear rate of rails decrease sharply with increasing rail hardness and the rate of decrease is higher at higher contact stress. At very high hardness of rails, variation in contact stress seems to have no effect on rail wear performance.

At a constant rail hardness of 310 HV, wear rate increase with increasing wheel hardness up to about 270 HV wheel hardness in Figure 10.7b. After that, rail wear decrease with increasing wheel hardness, probably due to less generation of abrasive debris due to harder wheels.

Carbon controls the microstructure of rails which generally varies from bainitic microstructures at low carbon (0.1-0.4 wt% C) contents to ferrite-pearlite or, fully pearlite at 0.4-0.8 wt% C to pro-eutectoid cementite-pearlite microstructure in hypereutectoid carbon (>0.8 wt% C) compositions. The rail wear decrease with increasing carbon concentration in Figure 10.7c because of gradually increasing pearlite volume fraction. At same hardness level, pearlite is more wear resistant to ferrite. Beyond 0.6-0.7 wt% C, wear rate increase with increasing carbon probably due to brittle pro-eutectoid cementite in the microstructure which are detrimental to mechanical properties.

With constant carbon (0.78 wt% C), silicon decreases wear rate for rails (Figure 10.7d) because high silicon ($\geq 1 \text{ wt}\%$) indicates cementite-free bainitic microstructure which is more-wear resistant than pearlite. Manganese (Figure 10.7e) has an independent effect on decreasing the wear rate but, in presence of high sulphur contents, wear rates increase (Figure 10.7f) due to MnS related rolling contact fatigue issues. Niobium addition also tend to decrease the wear rate of rails (Figure 10.7g).

The similar exercise can be carried out for a bainite based composition in Table 10.3 and the results are demonstrated in Figure 10.8.

Table 10.3: Constant values for variables in Figure 10.8. Compositions are in wt%.

$\begin{array}{c} \text{Rail hardness} \\ (\text{H}_{\text{R}}) \end{array}$	Wheel hardness (H_W)	С	Si	Mn	Р	\mathbf{S}	Cr	Мо	Ni-Nb-Cu-V-Al-B-Ti
$390\mathrm{HV}$	$240\mathrm{HV}$	0.2	2.0	2.0	0.015	0.03	0.55	0.5	0

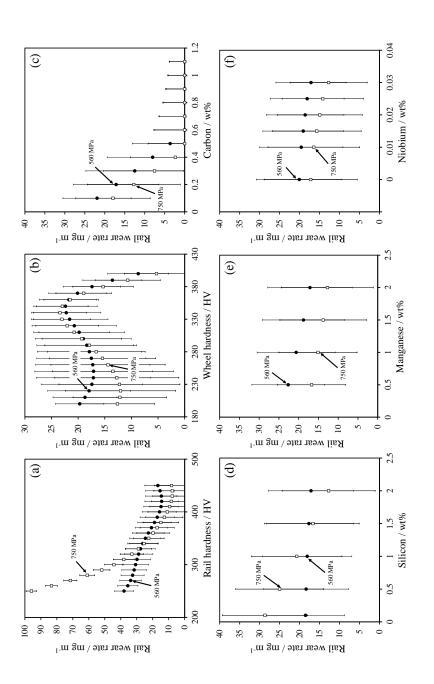


Figure 10.8: Variation in rail wear rate for bainite based compositions with invidual inputs at different loads while other variables are constant: (a) Rail hardness, (b) wheel hardness, (c) carbon, (d) silicon, (e) manganese, (f) niobium.

10.9 Summary

A neural network model has been developed to estimate the wear performance of rails and the perceived noise in experimental data to ascertain the repeatability of an experiment. Hardness of the rails and wheels are the most important variables in controlling the wear of rails. Predicted trends have been found consistent with metallurgical experiences and the perceived noise in the experimental data ascertain reasonable repeatability with an experiment with the concerned wear testing rig. The model can be applied widely to predict wear because of its capacity to indicate uncertainty, including both an estimate of the perceived level of noise in the output, and an uncertainty associated with fitting the function in the local region of input space.

Chapter 11 Conclusions and future work

The following conclusions can be drawn about the work presented in this thesis:

- (i) Pearlitic steels with fine interlamellar spacings, are hard but not necessarily tough as the pearlite colony size controls toughness. Cementite-free bainitic rails are hard as-well-as tough owing to fine bainitic ferrite plates and cementitefree retained austenite films. The solubility of niobium decreases with increasing carbon concentrations even at higher carbon levels (>0.8 wt% C) in austenite in contradiction to some analysis reporting increased niobium solubility at high carbon levels. Silicon decreases niobium solubility in austenite which affect high silicon cementite-free bainitic compositions.
- (ii) Niobium additions are limited by the maximum concentration that can be soluble in austenite at reheating temperatures. Any niobium concentration beyond that, will form carbides that cannot be dissolved in austenite at typical reheating temperatures. Even when the niobium addition is less than the maximum soluble niobium in austenite, microsegregation leads to solute enrichment in liquid and eventually formation of primary niobium carbides that precipitate from liquid. To dissolve these primary carbides in the segregated austenite, the dissolution temperature required is way higher than the standard 1200-1300 °C reheating temperatures and the carbides will remain undissolved.
- (iii) Coarse primary niobium carbides as large as $\sim 10 \,\mu$ m can be observed in the ascast high carbon pearlitic steels and Si-rich cementite-free low carbon bainitic steels. The largest observed precipitate size decrease with decreasing niobium concentration. To dissolve these primary precipitates in austenite, the reheating temperatures must be atleast greater than the equilibrium NbC solution

temperatures. But due to the coarse nature of the primary NbC precipitates, the diffusion controlled dissolution kinetics is slow and the standard reheating time of 2 h is not sufficient to dissolve all the precipitates. The dendritic morphology of the precipitates breaks down into spherical shape during reheating and hot rolling and the average diameter of such carbides in as-rolled alloys are 2-4 μ m. Dissolved niobium in reheated austenite precipitate during hot deformation as strain-induced fine niobium carbides (<50 nm) which are suitable to affect recrystallisation kinetics of deformed austenite.

- (iv) Nb-microalloying increases the no-recrystallisation temperature of deformed austenite in high carbon pearlitic and low carbon Si-rich bainitic alloys. Nbmicroalloyed austenite tends to remain unrecrystallised below 900-950 °C and the topology of the deformed austenite can be approximated by the stereological calculations. The pearlite transformation kinetics tend to accelerate when the austenite is deformed below the no-recrystallisation temperature but the effect is low until the amount of deformation is significant. The bainite transformation kinetics also tend to accelerate with decreasing deformation temperature. But during heavy deformation near A_{e_3} temperature for the Si-rich bainitic alloys, ferrite transformation occur at prior austenite grain boundaries which reduce the effective hardness in the final microstructure.
- (v) During hot rolling, 0.02 wt% Nb addition in cementite-free bainitic alloy leads to un-recrystallised austenite after finish rolling at 870 °C. Increased austenite grain boundary area and increased dislocation activity, hinder bainite growth which leads to increased retained austenite volume fraction. This leads to slightly improved ductility, improved toughness and improved wear resistance in the Nb-microalloyed alloy compared to the non-microalloyed one. For the as-rolled pearlitic alloys, 0.01 wt% Nb addition refine the crystallographic unit size in the as-rolled microstructure after finish rolling at 870 °C, but does not have any significant effect on the pearlite transformation temperature as the interlamellar spacing and hardness values are comparable in both microalloyed and non-microalloyed alloys. The toughness is comparable and the tensile strength improves slightly but the wear resistance improves significantly in Nb-microalloyed pearlitic alloys.
- (vi) Neural network analysis of wear data identify rail and wheel hardness to be the most important parameters in affecting wear performance of rails as well as indicating that niobium microalloying can lead to improved wear resistance.

11.1 Scope for future work

Knowing the work performed in this thesis and the results obtained, the following work could be relevant for further research on the field:

- (i) High resolution synchrotron X-ray experiments can be carried out to accurately measure the NbC volume fraction and corresponding dissolved Nb in solution after reheating conditions which is otherwise difficult to measure by electron microscopy or conventional X-ray diffraction because of very low volume fraction (about 0.0001-0.0002) of niobium carbide precipitates in the investigated alloys.
- (ii) Hot compression experiments with variable strain and strain rates can be carried out to develop equations for recrystallisation kinetics of deformed austenite in the investigated Nb-microalloyed rail steels. Also, the effect of plane-strain compression and other complex deformation schedules on the recrystallisation kinetics can be studied.
- (iii) A more in-depth study of non-propagating secondary cracks in various pearlitic and bainitic microstructures would provide valuable insight, and complement existing results.
- (iv) Effect of Nb-microalloying on other important rail properties like rolling contact fatigue performance, weldability, hydrogen embrittlement etc needs to be investigated.

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