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ABSTRACT Because modern technology depends on reliable supplies of a wide variety of materials and because of increasing concern about those supplies, a comprehensive methodology was created to quantify the degree of criticality of the metals of the periodic table. In this paper, we apply this methodology to iron and several of its main alloying elements (i.e., vanadium, chromium, manganese, and niobium). These elements represent the basic metals of any industrial society and are vital for national security and economic well-being. Assessments relating to the dimensions of criticality – supply risk, vulnerability to supply restriction, and environmental implications – for 2008 are made on the global level and for the United States. Evaluations of each of the multiple indicators are presented, with aggregate results plotted in “criticality space”, together with Monte Carlo simulation-derived “uncertainty cloud” estimates. Iron has the lowest supply risk, primarily because of its widespread geological occurrence. Vanadium displays the highest cradle-to-gate environmental implications, followed by niobium, chromium, manganese,

20 and iron. Chromium and manganese, both essential in steel making, display the highest
21 vulnerability to supply restriction, largely because substitution or substitution at equal
22 performance is not possible for all end-uses. From a comprehensive perspective, we regard the
23 overall criticality as low for iron and modest for the alloying elements we evaluated.

24 **KEYWORDS** Chromium, Manganese, Niobium, Vanadium, Industrial ecology, Metal
25 sustainability, Criticality assessment, Depletion time, By-product recovery, Life cycle
26 assessment

27

28 INTRODUCTION

29 Iron and steel are the basic metals of any industrial society. Globally, iron is the most
30 widely used metal and steel making is one of the world's largest industries¹. Raw steel
31 production (steel is an iron-based alloy containing up to 2% carbon) accounts for nearly 25% of
32 industrial and 9% of anthropogenic process carbon emissions ². Steel is used with alloying
33 elements (elements other than carbon, such as chromium, niobium, manganese, vanadium,
34 molybdenum, and tungsten) to obtain specific physical and chemical properties, such as heat and
35 corrosion resistance, high strength, and high abrasion resistance ³. As an example, stainless steel
36 contains 11 to 26% chromium to provide a high level of corrosion resistance. It is these
37 properties that make alloyed steels versatile in a multitude of today's products and applications,
38 with more than 3,500 different steel products currently utilized ³ in a diverse array of products
39 that includes construction equipment and appliances, machine tools, military weapons, pipelines,
40 and vehicles ^{3,4}.

41 Global raw steel production is not limited by resource availability, because iron ore is
42 globally abundant ⁴ and end-of-life recovery rates are high ⁵. From an individual element
43 perspective, iron's predominant use is as steel in construction, transportation, machinery, and
44 other steel products ^{6,7}. Chromium is widely used in stainless and alloy steels, chemicals, and
45 refractory products ⁸. Vanadium and manganese are principally used in iron-based steels, with
46 smaller amounts going into superalloys, chemicals, and batteries ⁹⁻¹³. Niobium finds use mostly
47 in microalloyed high-strength-low-alloy (HSLA) steels, stainless steels, and superalloys ^{13,14}.
48 Because many of the unique properties of alloyed steels are due to the additional alloying
49 elements, the criticality of these elements is of significant interest.

50 In 2008, the United States Research Council (NRC) published a criticality assessment
51 methodology for metals ¹⁵ that formed the basis for a series of other criticality assessments (some
52 of which developed alternative methodologies and addressed one or more of the metals that are
53 the subject of this paper; see the review by Erdmann and Graedel (2011)) ¹⁶. Building upon the
54 NRC report, a more comprehensive criticality methodology was published by Graedel et al.
55 (2012) ¹⁷ and was subsequently applied to the elements of the geological copper family ¹⁸. In the
56 present work, we apply this methodology to assess the criticality of iron and several of its
57 alloying elements – vanadium (V), chromium (Cr), manganese (Mn), and niobium (Nb) – on a
58 global level and at the national scale for the United States. Results for other common alloying
59 elements of iron, such as nickel, molybdenum, and tungsten, will be presented in a forthcoming
60 publication that evaluates the superalloys metals group.

61

62

63 MATERIALS AND METHODS

64 The criticality methodology is described in Graedel et al. (2012)¹⁷ with recent modifications
65 presented in Harper et al. (2014)¹⁹. The methodology axes are supply risk (SR), environmental
66 implications (EI), and vulnerability to supply restriction (VSR). The criticality assessment is
67 carried out for a base year of 2008 for the globe and at the national level for the United States.
68 Recent modifications relate to the introduction of a materials assets (MA) indicator in the VSR
69 axis (see also Graedel and Nassar (2013)²⁰) which replaces the “percentage of population
70 utilizing” indicator used previously. Results are presented in three-dimensional criticality space,
71 with uncertainty clouds derived by assigning each input parameter an uncertainty range and
72 distribution and then using Monte-Carlo analysis. Further details and a summary of the
73 components and indicators of the criticality methodology are available in the Supporting
74 Information (see Table S1 to S4).

75 **Supply Risk (SR).** SR at the national level (medium term outlook) consists of the
76 following components: geological, technological, and economic (GTE), social and regulatory
77 (S&R), and geopolitical (GP). At the global level (long term outlook), SR is comprised only of
78 the GTE component. Each component, in turn, is comprised of two indicators: depletion time
79 (DT) and companion metal fraction (CF) for GTE, policy potential index (PPI) and human
80 development index (HDI) for S&R, and worldwide governance indicators-political stability and
81 absence of violence/terrorism (WGI-PV) and global supply concentration (GSC) for GP. The
82 evaluation approach for each indicator is described in Graedel et al. (2012)¹⁷, and the result for
83 each is transformed to a 0 to 100 (low to high SR) common scale. The results for the components
84 and for the overall SR are generated by equally weighting the indicators and the components,

85 respectively. Other weightings are an option if it is felt that some indicators are more important
86 than others.

87 Using information about the lifetimes of products in use, recycling rates, and process
88 losses during production (see Supporting Information, Table S5 for a summary of all DT
89 parameters), the DT model calculates the amount of time it would take to deplete the geological
90 reserves (medium term outlook, used in the national assessments) or reserve base (long term
91 outlook, used in the global assessments) of each metal at the current rate of demand given the
92 expected future supply from recycling.

93 The companion metal fraction (CF) refers to the fraction of an element obtained as a
94 byproduct with another metal (Table S18 in Supporting Information). Approximately 82% of
95 vanadium production occurred as a byproduct in 2008, with 62% attributed to steelmaking slag,
96 12% attributed to alumina and oil residues, 7% to spent catalysts (the catalysts collect vanadium
97 during the refining of some crude oils), and 1% to uranium residues²¹. Iron and chromium were
98 not mined as companion metals in 2008. More recently, some mines have recovered chromite
99 from platinum tailings from the UG2 seam in South Africa¹². According to RMG (2006)²² and
100 in 2005, roughly 4% of global manganese produced was generated as a companion of iron ore in
101 the Urucum Mine, Brazil. Niobium production occurs sometimes as a companion to tantalum
102 mining and processing of tin slag. Approximately 13% of niobium is derived from mining of
103 tantalum-containing ores and processing of tin slag, based upon an average derived from
104 information from the Tantalum-Niobium International Study Center²³.

105 Global mine and refinery production data are taken from United States Geological Survey
106 (USGS) Yearbooks and World Mining Data^{12,24}, and reserve and reserve base estimates

107 originate from USGS Mineral Commodity Summaries ²⁵. Sub-national mining data were
108 available for Australia ²⁶, Canada ²⁷, and the United States ²⁸. Where production values were
109 reported in gross weight rather than elemental concentration (e.g., iron content), conversion
110 factors were obtained from industry experts or derived using atomic weight ratios (see
111 Supporting Information for details). Several of the supply risk indicators – PPI, HDI, WGI – PV,
112 and GSC – were weighted by each metal’s production (see Supporting Information for details).

113 **Environmental Implications (EI).** The cradle-to-gate environmental impacts of metal
114 production are captured using life-cycle assessment (LCA). The indicator consists of impacts to
115 human health and ecosystem damage per kilogram of metal at the factory gate. These are
116 calculated using SimaPro7.3 LCA software and the ReCiPe 1.06 Endpoint World H/H impact
117 assessment method ²⁹. Results are normalized to a 0 to 100 scale ¹⁷. Life cycle inventory data for
118 iron, chromium, and manganese are available from the Ecoinvent database ^{30,31}. Data for
119 vanadium are available from TU Delft (2001) ³² as given in the IDEMAT 2001 database in
120 SimaPro7.3. For niobium (consisting of ferroniobium and metallic niobium), inventory data are
121 obtained from various sources ^{33–35} as described in further detail in the Supporting Information
122 (Table S23).

123 **Vulnerability to Supply Restriction (VSR).** VSR consists of a number of components
124 that vary depending upon the organizational level (in this paper, global and national) being
125 evaluated. Components at the global level include importance (I) and substitutability (S),
126 whereas the national level is comprised of importance (I), substitutability (S), and susceptibility
127 (SU). Each component, in turn, is comprised of indicators that are described in detail in Graedel
128 et al (2012) ¹⁷. At the global level, I is comprised solely of material assets (MA) and S of

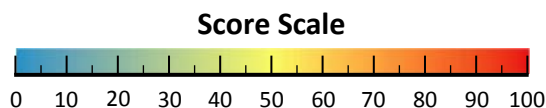
129 substitute performance (SP), substitute availability (SA), and environmental impact ratio (ER).
130 At the national level, I is comprised of material assets (MA) and national economic importance
131 (NE). Substitutability is comprised of the substitute performance (SP), substitute availability
132 (SA), environmental impact ratio (ER), and net import reliance ratio (IRR). Susceptibility (SU) is
133 comprised of net import reliance (IR) and the global innovation index (GII). Results for each
134 indicator are transformed to a 0 to 100 (low to high) common scale.

135 Substitutability is evaluated by detailing the end uses of each metal of focus and the
136 percentage of metal production employed in each end use category. In this paper, end uses are
137 reported either at the sector level (e.g., construction, transportation, and chemicals), or by steel
138 type (e.g., HSLA steel, stainless steel, and titanium alloys). The former end use categories are
139 generally used in the DT model, because it is more tractable to assign a lifetime to a sector rather
140 than a steel type. End use by steel type, however, is preferentially utilized to determine primary
141 substitutes, because it is often more accurate to determine potential substitutes by steel type
142 rather than by sector. The primary substitute is the material that may be used if the metal of focus
143 is not available. SP is determined on a qualitative basis by evaluating each substitute's
144 performance as poor, adequate, good, or exemplary, and these ratings translate directly into a
145 numerical scale ¹⁷. Applications, primary substitutes, and SP are detailed in Table S24 in
146 Supporting Information. SA is determined by calculating SR for each primary substitute
147 determined in Table S24 (see Table S19 in Supporting Information).

148 RESULTS

149 Figure 1 presents component and indicator assessments on a 0 to 100 scale for iron and its
150 alloying metals for 2008, at national and global levels. The median values (also called the
151 default values) for each score are listed in the columns labeled “D”. The columns labeled
152 “U” show the uncertainty range by providing the 5th percentile, the median, and the 95th
153 percentile. These scores are used to calculate the overall SR score for the medium term
154 (SR_M) and long term (SR_L).

Figure 1. Resulting criticality assessment values for indicators, components, and parameters of iron and its alloying elements. DT_M = depletion time (medium-term time scale); CF = companion metal fraction; PPI = Policy Potential Index; HDI = Human Development Index; WGI-PV = World Governance Indicators – Political Stability & Absence of Violence/Terrorism; GSC = global supply concentration, SR_M = supply risk (medium-term time scale); DT_L = depletion time (long-term time scale); SR_L = supply risk (long-term time scale); EI = environmental implications; SP = substitute performance; SA = substitute availability; ER = environmental impact ratio; NE = national economic importance; MA_N = material assets (national); IRR = net import reliance ratio; IR = net import reliance; GII = Global Innovation Index; VSR_N = vulnerability to supply restriction (national); MA_G = material assets (global); VSR_G = vulnerability to supply restriction (global). For each indicator, component, and axis score, four values are provided per metal. Under the column labeled “D”, the default value is provided; this value is obtained when all of the stated assumptions are utilized. Under the column labeled “U”, three values from the uncertainty analysis are provided: the 5th percentile, the mean, and the 95th percentile in that order, from top to bottom. Note that values reported for all indicators are based on the appropriately weighted and scaled “transformed” scores (see ¹⁷ for details). More information regarding the assumptions and uncertainty analysis is provided in the Supporting Information. Note that the DT_M was used to calculate GTE_M . Values are reported to the nearest whole number and colored according to the following color ramp:



- (A) Supply Risk Scores
- (B) Environmental Implications Scores
- (C) Vulnerability to Supply Restriction – National (United States)
- (D) Vulnerability to Supply Restriction - Global

(A)

Element	Geological, Technological, and Economic								Social and Regulatory						Geopolitical						Supply Risk			
	DT _M		DT _L		CF		GTE _M		PPI		HDI		S&R		WGI-PV		GSC		GP		SR _M		SR _L	
	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U
V	0	0	0	0	82	73	41	36	59	51	67	59	63	57	66	58	80	73	69	59	56	41	36	
	0	0	0	0	82	82	41	41	59	59	67	67	63	63	66	65	80	80	73	73	59	59	41	41
	0	0	0	0	93	93	46	46	69	69	77	77	70	70	72	72	81	81	76	76	62	62	46	46
Cr	96	95	86	80	0	0	48	47	63	56	65	59	64	60	58	51	75	73	63	60	58	43	40	
	96	96	86	86	0	0	48	48	63	64	65	66	64	65	58	58	75	75	66	67	60	60	43	43
	97	97	91	91	0	0	49	49	72	72	73	73	70	70	65	65	77	77	70	70	62	62	45	45
Mn	89	85	0	0	4	3	46	44	54	47	72	66	63	58	66	59	82	80	74	70	61	59	2	2
	89	89	0	0	4	4	46	46	54	54	72	72	63	63	66	66	82	82	74	74	61	61	2	2
	92	92	0	0	5	5	48	48	62	62	80	80	69	69	72	72	84	84	77	77	63	63	2	2
Fe	9	0	0	0	0	0	4	0	54	48	73	68	63	60	60	55	75	72	67	64	45	42	0	0
	9	9	0	0	0	0	4	4	54	54	73	74	63	64	60	60	75	75	67	67	45	44	0	0
	20	20	0	0	0	0	10	10	60	60	82	82	69	69	65	65	78	78	71	71	47	47	0	0
Nb	80	71	76	65	13	10	46	42	49	38	73	59	61	52	62	48	97	97	73	73	62	58	44	39
	80	81	76	76	13	12	46	47	49	49	73	73	61	63	62	60	97	97	79	79	62	62	44	44
	87	87	83	83	15	15	50	50	64	64	89	89	72	72	72	72	98	98	85	85	66	66	48	48

(B)

Element	Human Health	Ecosystems	EI	
	(supply source-weighted average points)	(supply source-weighted average points)	D	U
V*	1.24	0.12	7	6 7 9
Cr	0.28	0.01	2	2 2 3
Mn	0.13	0.01	1	1 1 1
Fe	0.09	0.01	1	1 1 1
Nb	0.59	0.05	4	4 4 5

155

* Represents primary vanadium production³².

(C)

Element	Importance						Substitutability									Susceptibility						VSR			
	MA _N		NE		I		SP		SA _M		ER		IRR		S		IR		GII		SU		VSR _N		
	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	D	U	
V	67	60	1	1	34	31	65	58	64	60	34	28	57	47	55	55	91	76	29	23	60	50	50	47	
		67		1		34		64		64		35		55		55		91		29		60		49	
		73		1		37		71		68		44		66		58		100		36		66		52	
Cr	100	100	11	9	56	55	65	48	59	43	60	43	50	33	58	49	66	55	29	23	47	58	58	54	
		100		11		56		65		59		60		60		49		58		66		47		58	
		100		14		57		80		75		77		66		67		79		36		55		61	
Mn	99	94	28	21	64	59	89	85	92	89	96	93	88	85	91	89	100	84	29	23	64	73	70	72	
		99		28		63		89		92		96		96		88		91		100		29		63	72
		100		36		68		92		94		98		91		93		100		36		67		75	
Fe	94	89	51	39	72	65	52	44	43	42	100	99	10	8	51	49	13	11	29	23	21	48	48	45	
		94		51		72		50		43		100		10		10		51		13		29		21	48
		99		66		80		59		44		100		12		53		16		36		25		51	
Nb	89	83	2	2	46	42	49	42	62	59	92	79	35	31	59	55	100	84	29	23	64	56	56	53	
		89		2		46		47		62		90		36		58		100		29		63		55	
		95		3		49		53		64		99		42		62		100		36		67		58	

(D)

Element	Importance		Substitutability								Vulnerability to Supply Restriction	
	MA _G		SP		SA _L		ER		S		VSR _G	
	D	U	D	U	D	U	D	U	D	U	D	U
V	26	24	65	59	47	42	35	29	49	46	38	36
		26		64		47		36		49		38
		28		71		51		45		53		40
Cr	69	67	68	54	41	27	60	46	56	48	63	58
		69		68		40		60		56		63
		72		82		54		75		65		67
Mn	36	34	95	93	96	95	96	95	96	95	66	65
		36		95		96		96		96		66
		39		96		97		98		97		67
Fe	54	53	57	49	26	22	100	97	61	58	58	55
		54		56		26		100		61		58
		56		64		30		100		64		58
Nb	59	57	42	34	43	36	86	67	57	49	58	54
		59		41		43		84		55		57
		62		48		47		98		61		60

156 **Vanadium.** SR is 59 (medium term) and 41 (long term). DT is zero in the medium
157 and long term, indicating depletion times of 100 years or longer, assuming current global
158 rates of recycling and demand. CF is high because primary production from vanadium-rich
159 ores accounted for only about 18% of total vanadium production in 2008 ²¹. Production of
160 vanadium from steel slags (62%) is driven by the economics of the steel ³⁶ and vanadium is
161 considered a companion. Vanadium from oil residues and spent catalysts (together 19%) is
162 considered a companion, because the source of the vanadium is crude oils that deposit the
163 element on refining catalysts. Production from uranium residues (1%) and alumina is
164 considered companion production as well. GSC is 80, because only a few countries (South
165 Africa (36%), China (35%), Russia (26%), Kazakhstan (2%), and Japan (1%)) produced
166 vanadium in 2008 ¹². Vanadium's environmental impact score is 7 and is higher than any of
167 the other metals considered in this study, but still at the low end of the 0 to 100 ordinal scale.
168 VSR is moderate at 50 for the United States and 38 for the globe. IR is 91 for the United
169 States which is at the higher end of the criticality scale, illustrating that vanadium was
170 mostly imported in 2008.

171 **Chromium.** DT is 96 in the medium term (corresponds to 13 years before year 2008
172 geological reserves are depleted) and 86 (i.e., 31 years before the geological reserves
173 indicated for 2008 are depleted) in the long-term. DT scores are high as a result of high
174 demand when compared to USGS reserves/reserve base estimates, relatively long in-use
175 lifetimes (see Table S5 in Supporting Information) that delay chromium-steel availability to
176 offset primary production, and a moderately high recycling rate of 54% ^{8,37}. However, world
177 chromium resources, at greater than 3.7 billion tons of chromium content (i.e., 12 billion
178 metric tons shipping grade chromium converted into metal content) ²⁵, are roughly 100 times

179 more than the reserve base estimate used to derive DT_L . DT largely depends on the reserve
180 and reserve base estimates used, with larger estimates reducing the DT score. This results in
181 an SR score of 60 at the national level (medium term) and 43 at the global level (long term),
182 while the VSR scores are 58 at the national level and 63 at the global level. This is, in part,
183 because substitution is not possible in industrial machinery (e.g., turbines) operating at high
184 temperatures, where chromium's primary function is to provide oxidation and corrosion
185 resistance³⁸⁻⁴¹ (see Supporting Information for a detailed discussion). However, we find that
186 partial substitution may be possible in buildings and infrastructure, transportation, and
187 household appliances (Table S24). Chromium's use in building and infrastructure is
188 dominated by alloy steels, because of its hardenability characteristics, which are used, for
189 example, in elevators, metal furniture, and boilers, with manganese reported as a good
190 substitute⁴¹. Transportation is dominated by trains, passenger cars, and motorcycles⁸ with
191 aluminum being an adequate substitute. Aluminum is also a possible substitute for
192 household appliances (e.g., dishwashers and washing machines⁸), together with plastics⁴¹.
193 MA is high at both national and global levels due to large per capita in-use stock estimates
194 (about 87 kg chromium per capita for the United States and 20 kg per capita for the globe) in
195 relation to the sum of total in-use stock and reserves (United States) or reserves base (globe).
196 Global in-use stock values result from the DT model, whereas the United States per capita
197 in-use stock is estimated by extrapolating the global in-use stock estimates via nominal gross
198 domestic product^{17,19}.

199 **Manganese.** SR scores for manganese are 61 in the medium term and 2 in the long
200 term. DT is 89 (i.e., 27 years before geological reserves are depleted) in the medium term
201 and 0 (i.e., ≥ 100 years before the reserve base is depleted) in the long term. This is due to

202 the large difference in 2008 reserves (500 Tg chromium content) and reserve base (5.2 Pg
203 chromium content) estimates²⁵. Process losses are 36%⁴², which is slightly higher than for
204 the other metals investigated and is a result of the strong deoxidation capacity of manganese
205 used in steelmaking to remove sulfur and that results in high manganese losses to the slag⁴³.
206 Jones (1994)⁴⁴ indicates that the use of manganese in batteries and chemicals was used in a
207 dissipative way, so we assign an end-of-life recycling rate of zero to these end-uses in our
208 DT model. VSR is 73 at the national level and 66 at the global level. Manganese's largest
209 end use is in steel metallurgy²⁵ where it acts as a desulfurizing and deoxidizing agent in steel
210 making (see Supporting Information for a detailed discussion), and no satisfactory
211 substitutes have been identified for this end use²⁵. For manganese's other uses, we find that
212 plastics (i.e., bottle-grade polyethylene terephthalate) may be a suitable substitute for
213 aluminum alloys used, for example, in metal cans⁴⁵, and lithium could substitute for
214 manganese in battery applications, assuming a technology switch from dry-cell to lithium
215 batteries (Table S24). ER is high due to the fact that lithium is associated with higher cradle-
216 to-gate environmental burdens than manganese (see Table S23). In addition, IR at the United
217 States level is high, as manganese was mostly imported in 2008.

218 **Iron.** Mine deposits of iron are widespread and recycling rates are high (58-87%)⁴⁶.
219 As a result, DT is found to be 9 in the medium term (i.e., 95 years before geological reserves
220 are depleted) and zero in the long term (indicating depletion times of around 100 years or
221 longer). Iron is not a companion metal (CF is 0). Iron's medium term SR is 45, which is
222 lower than for any of the other elements investigated. The long term SR consists of the
223 average of DT and CF and is zero. For the United States, VSR is moderate at 48. NE is high
224 for iron when compared to the other elements considered in this study, because of high

225 consumption in relation to the United States gross domestic product. Substitutability of iron
226 is possible using materials like wood, aluminum, and fiber-reinforced polymers ³ (see
227 Supporting Information for a detailed discussion). These substitutes have low- to medium
228 SR themselves, but higher environmental burdens ³¹, which results in an ER of 100 (see
229 Table S23 in Supporting Information). The depletion time model results in an estimate of
230 global per capita iron in-use stock of 4.1 metric tons in 2008. This is used to calculate an
231 MA_G of 41. Our estimate is similar to per capita in-use stock estimates reported
232 elsewhere ^{47,48}. In our study, for the United States, per capita in-use stock is estimated at
233 17.8 kg iron per capita in 2008 and MA_N is 94. This estimate is slightly higher than
234 estimates of 9.3 to 14.3 kg iron per capita reported in the literature for prior years ⁴⁷.

235 **Niobium.** SR is 62 in the medium term and 44 in the long term. The fact that most
236 niobium is mined in Brazil (92%) and Canada (7%) ¹² is reflected in the high GSC. DT is 80
237 (39 years before reserves are depleted) in the medium term and 76 (44 years before the
238 reserve base is depleted) in the long term. However, according to USGS (2009) ²⁵, world
239 niobium resources are sufficient to supply projected demands, given that the extractable
240 global resources are estimated at 480 Tg (this compares to a reserve base of 3 Tg ²⁵ used in
241 the DT model). VSR for the United States (56) and the globe (58) are roughly similar. The
242 high IR indicator of 100 reflects the fact that no niobium was mined in the United States in
243 2008. The high ER score is governed by the fact that all potential substitutes (i.e., vanadium,
244 molybdenum, and tantalum) display higher cradle-to-gate environmental burdens than
245 niobium (see Table S23 in Supporting Information).

246 **Results in three-dimensional criticality space.** Figure 2 shows the results for iron
247 and its principal alloying elements in “criticality space”, at the national (a) and global (b)

248 levels. Several characteristics are immediately apparent from the diagrams. Firstly,
249 environmental burdens of iron and its principal alloying elements are on the lower end of the
250 0 to 100 EI axis, which has been designed to display the wide range of environmental
251 burdens of all metals of the periodic table on a per kilogram basis (functional unit). As such,
252 it shows iron and its alloying elements in relative comparison to all other elements. We note,
253 however, that environmental issues occurring during the use or end-of-life phases are not
254 captured in our assessment. While environmental implications for vanadium and niobium
255 are highest on a per kilogram basis, if the functional unit is changed to global mine
256 production in 2008, iron had, by far, the largest environmental burdens, due to its enormous
257 production quantity (Figure S2 in Supporting Information).

258 The second feature of Figure 2 is that there are some obvious differences between
259 the United States and global assessments, which emphasizes that there is no universal
260 criticality evaluation for a metal. Rather, the evaluation is a function of organizational level
261 and of the supply and demand characteristics of the organization (e.g., country or planet).
262 Third, there is only modest diversity in SR at the United States level (where vanadium,
263 chromium, manganese, and niobium are just above median values and iron just below), but
264 somewhat more diversity at the global level (modest SR for vanadium, chromium, and
265 niobium, and very low SR for iron and manganese). There is slightly greater assessment
266 diversity on the VSR axis. Vanadium, iron, and niobium are generally moderate (their major
267 uses have good substitutes), while chromium and especially manganese are moderate to high
268 on the national and global level. Uncertainty clouds (Figure 2) and upper and lower
269 percentiles of each parameter (Figure 1), derived using Monte-Carlo analysis, indicate that

270 uncertainties of each parameter are small enough to analyze overall trends. However, where
271 uncertainty clouds overlap, a direct comparison of elements may be difficult.

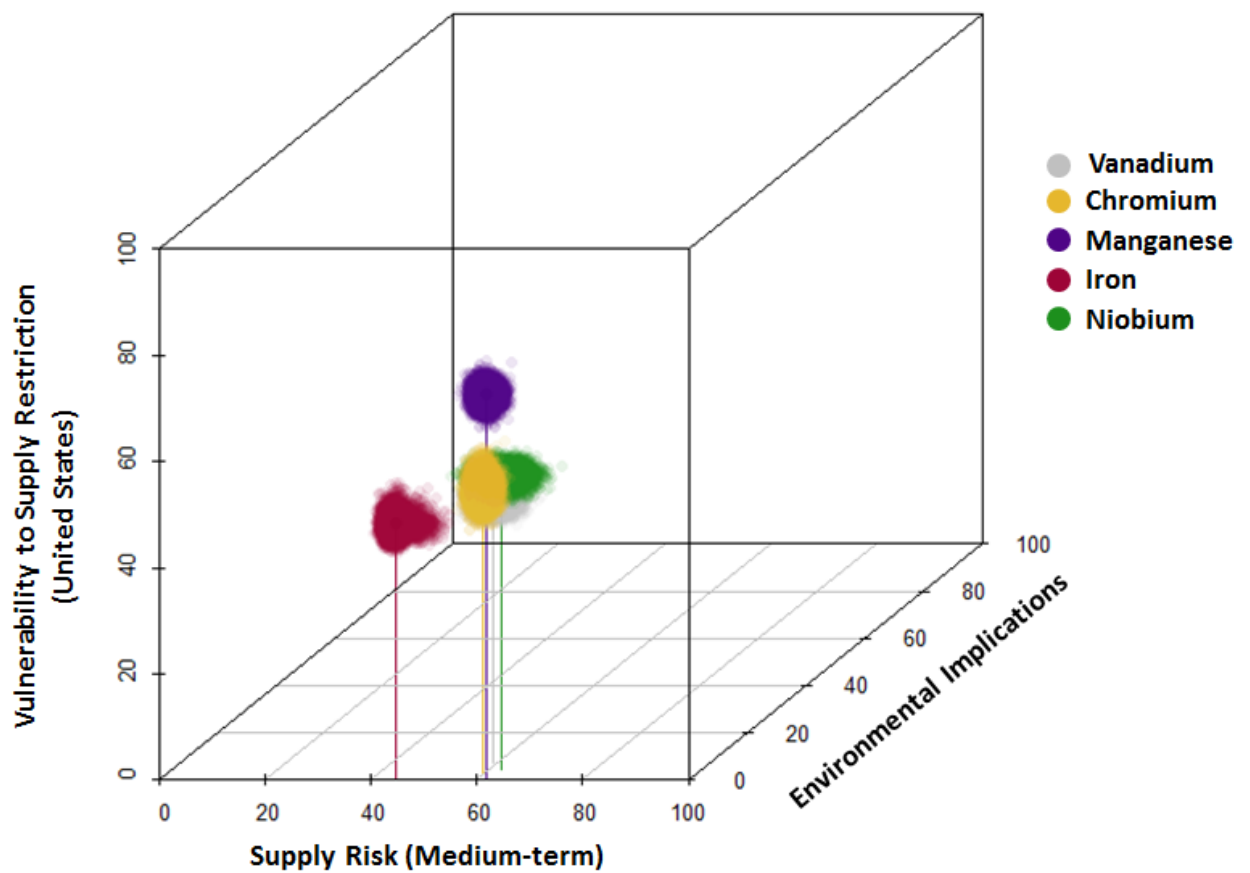
272 The criticality danger areas on these diagrams is the region of high SR and high VSR
273 (upper right region in the X-Y portion of the 3D diagram) and, even more problematic, at
274 the high SR, high-EI, high VSR region (back-right-top). In no case do any of the elements
275 investigated approach either of these regions, either at the national or global levels. We
276 conclude that the criticality of these metals from both global and United States perspectives
277 is modest for vanadium, chromium, manganese, and niobium, and low for iron.

278

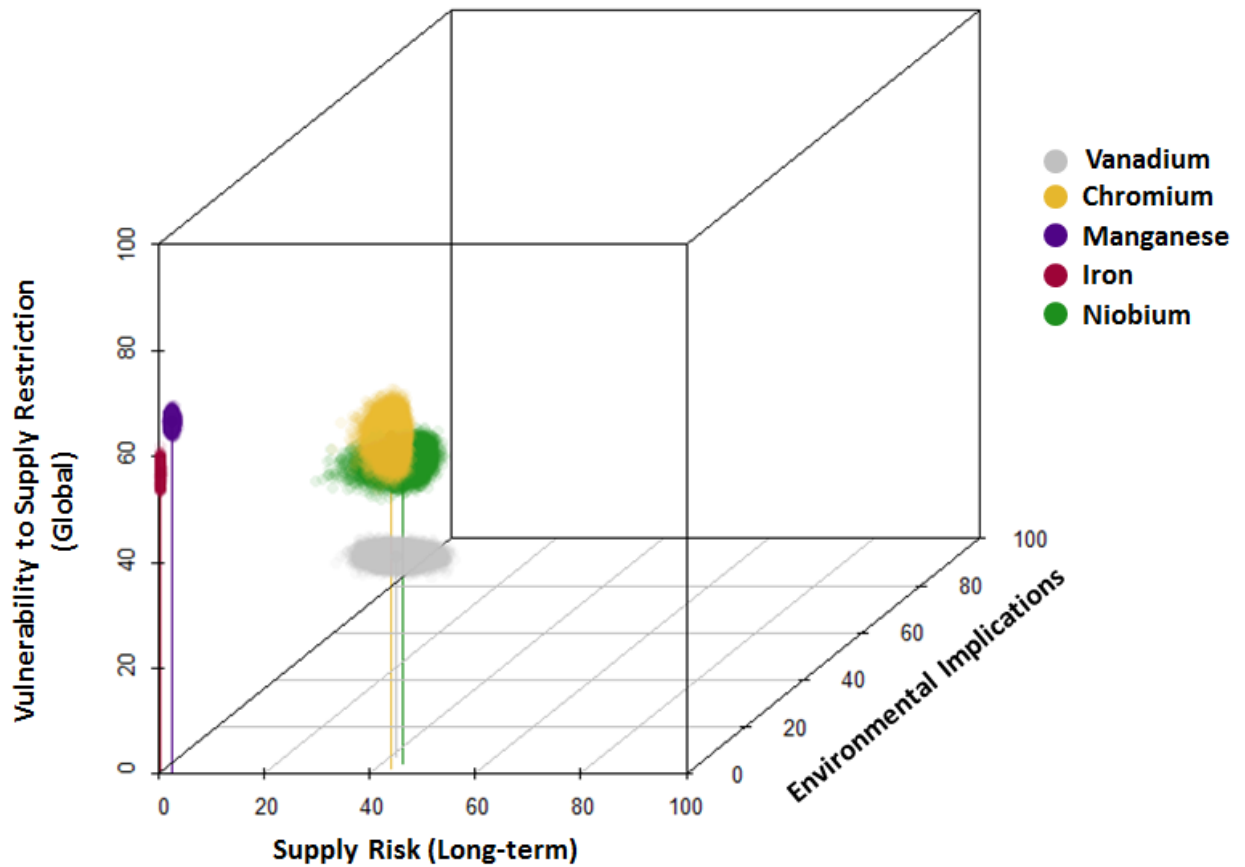
279

Figure 2: Locations of iron and its alloying elements in criticality space: (a) national level, for the United States (2008 epoch), and (b) global level (2008 epoch). The highest level of criticality is at 100, 100, 100 (back right top). The figure are created using R programming language⁴⁹ with the Scatterplot 3D plugin⁵⁰.

(A)



(B)



280 DISCUSSION

281 A legitimate comment on the results presented above is that they reflect the decision to
282 apply equal weighting to all of the indicators, some of which might be regarded as more
283 important than others. As a consequence, criticality becomes not a precisely defined statistic,
284 but one reliant in part on value choices. To explore the consequences of that situation, we
285 imagine a quite different choice from that of equal weighting: weighting PPI, HDI, and ER
286 at zero while ignoring the EI axis completely, and retaining equal weighting for the

287 remaining indicators. This choice essentially ignores social and regulatory considerations.
 288 With the exception of iron, the results for SR and VSR turn out to change at most by about
 289 7%, and to lesser degrees in nearly all cases. Iron's change (-23% for SR_M and -12% for
 290 VSR_M) is found to be more pronounced because of larger relative differences between PPI,
 291 HDI, and ER compared to the other indicators. Nevertheless, it can be concluded that the
 292 methodology is reasonably robust even to quite dramatically different weightings of the
 293 indicators.

294 It is also of interest to compare our criticality results with those of other evaluations,
 295 which we do in Table 1.

Table 1. Comparison of criticality results to other studies (adapted from Erdmann and Graedel (2011) ¹⁶)

Metal	EU Study ¹⁰	DOD Study ⁵¹	IW Consult Study ⁵²	NEDO study ⁵³	NRC Study ¹⁵	Oakdene Hollins Study ⁵⁴	This study (Global and United States)
V	Not critical	No shortfall	Not investigated	Not critical	Not critical	Not insecure	Modest criticality
Cr	Not critical	Cr metal: shortfall (718 short tons); all other forms of Cr: no shortfall	Medium risk	Not critical	Not investigated	Not insecure	Modest criticality
Mn	Not critical	Mn metal (electrolytic): shortfall (7,406 short tons); all other forms of Mn: no shortfall	Medium risk	Not critical	Critical	Not investigated	Modest criticality
Fe	Not critical	Not investigated	Low to medium risk	Not investigated	Not investigated	Not insecure	Low criticality
Nb	Critical	No shortfall	High risk	Critical	Critical	Not insecure	Modest criticality

296 There are seven different studies shown in the table, including the present study. All
297 agree, for studies in which evaluations were carried out, that iron and vanadium are of low
298 concern. Two of five studies other than ours find chromium to be of high risk or to have
299 shortfalls (one study omitted the element). Similar concern but higher shortfalls are derived
300 for manganese metal. In the case of niobium, however, five of the six studies other than ours
301 express varying degrees of concern, generally due to the high geographical concentration of
302 niobium production. The results are quite strongly dependent on the different assessment
303 methodologies chosen in the various studies, some rather detailed, some less so. In any
304 event, with the possible exception of niobium, there is relatively good agreement among the
305 several studies.

306 We conclude by emphasizing a consideration that we mentioned in a previous
307 publication by Nassar et al. (2012)¹⁸: there is no such thing as “critical” or “not critical”,
308 and we have avoided making such a distinction. There are, however, metals that are more
309 critical than others under some conditions, for some users, and for some time scales. This
310 immediately suggests that policy options should be explored when the higher criticality
311 situations are encountered. The real value of criticality analysis is not whether a particular
312 metal is labeled “critical”, it is the assessment and presentation of the status of that metal by
313 a variety of relevant criteria. Doing so enables issues of concern to be identified and
314 addressed by actions such as substitution, alternative sourcing, revisions to corporate or
315 national strategy, or other measures. By doing so, the mineral resources of the planet can be
316 responsibly utilized over the long term in ways that improve human lives while paying
317 attention to environmental issues and to resource sustainability over the long term.

318

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323

324 SUPPORTING INFORMATION

325 This information is available free of charge via the Internet at <http://pubs.acs.org>.

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