Electronic Supplementary Information for:

Engineered nanomaterials in the context of global element cycles

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Global Material Efficiencies

Global nanomaterial production volumes were obtained from *The Global Nanotechnology and Nanomaterials Market Opportunity Report*¹. The anthropogenic flows considered herein are those from mining, spanning the entire life cycle of a primary material from raw material extraction to the end-of-life phase. World mine, smelter, and/or refinery production volumes for 2014 were obtained from the U.S. Geological Survey (USGS) Minerals Yearbook, USGS Commodity Summaries, and the International Nickel Study Group (INSG) –see tables below. It should be noted that USGS minerals reports often withhold U.S. production volumes to avoid disclosing company proprietary data.

Global material efficiencies (Figure 3) across a single life cycle (i.e., rates of material flow through the life cycle within a given year) were calculated from global anthropogenic element cycles available in the literature with the exception of cobalt, copper, and nickel, where production losses were partially calculated from values reported by the USGS Minerals Yearbooks, USGS Commodity Summaries, and the INSG (refer to Table S1). Sufficient data were available for the 2014 cobalt, copper, and nickel production volumes to supplement cycling efficiencies calculated from the literature (i.e. cycles for years preceding 2014). Therefore, production efficiencies were calculated *ab initio* when possible. Primary material flows were decoupled from secondary flows, within the limit of available data, using cycling rates calculated from the literature. Efficiencies were calculated across one life cycle; therefore, stock accumulation was omitted and the entirety of materials mined were assumed to reach the end-of-life phase within the same year. The use phase and end-of-life cycling rates for copper were calculated from the International Copper Study Group (ICSG) 2013 cycle. Global material mass flows for 2014 were calculated (in Gg) from the associated material cycling rates (refer to Table S1).

Details pertaining to the nickel cycle

Nickel is extracted from two types of ores: sulfide ores and laterite ores. Sulfide ores deposits are mined underground and separated from gangue minerals through beneficiation of crushed ore, i.e. froth flotation and magnetic separation processes. Subsequently, nickel concentrates are further purified through a leaching or smelting process. Smelting yields a nickel-iron sulfide, known as nickel matte, which can further be processed and refined into nickel metal, ferronickel, nickel oxide sinter, and nickel chemicals. Lateritic ores are found near the surface and are mined in earth-moving operations. Laterite ores are typically low-grade deposits, which are "difficult to concentrate by common ore beneficiation processes"². Thus, large amounts of laterite ore must be smelted to concentrate the contained nickel. Laterite ore processing includes a variety of hydrometallurgical techniques (i.e. leaching) followed by solvent extraction-electrowinning (SXEW). Both sulfide and laterite ores are processed to nickel matte and refined to the various nickel products (listed above), albeit through diverse metallurgical routes. From the 2005 Ni cycle, the largest losses of nickel to tailings are from crushing/milling sulfide ore.

Nickel production losses (i.e. tailings and slag) were 18% of ore production (i.e. extracted metal) in 2005³ and 29% in 2014 (Table S1). The same loss rate to tailings in 2005, calculated from Reck³, was applied to the 2014 cycle in the absence of sufficient 2014 data. However, sufficient data was available to calculate losses to slag, leaching, and refining. The production efficiency of nickel fell 11% between 2005 and 2014 (Table S1). This shift in production efficiency can be reconciled by (1) an increase in lower grade ore mining, (2) a redundancy in reported mine and plant production efficiency, or (3) a discrepancy in data sources used. To interrogate (1), the reported mine production figures must be dissected. The USGS reports mine production as laterite ore, concentrates (assumed to originate from sulfide ore), ore and ore milled (assumed to originate from sulfide ore), ferronickel, nickel sulfate, and unspecified/undifferentiated. The latest USGS data available with the above breakdown for mine production is 2013. The USGS world mine production figure for 2014 used here is reported only as a total sum of world mine production. In 2005 concentrates dominated the world mine production value, accounting for 35% of the total; conversely in 2013 laterite ore dominated mine production, accounting for 52% of the total. Laterite ore mine production dramatically increased after 2011 (likely to accommodate the increase in China's nickel pig iron production). The increase in mining lower grade ores may account for the decrease in production rate of refined nickel products. An increase in laterite ore mining implies an increase in losses to leaching and slag, not to tailings. Thus, the 11% difference is likely

an overestimate, assuming nickel losses to tailings were predominantly from milling of sulfide ore (similarly to 2005), whose production has remained stable since 2005. A redundancy in data reported for mine production and refinery production (nickel products) could not exclusively account for the totality of the 11% discrepancy, as ferronickel and nickel sulfide make up a small portion of the reported mine production.

Finally, the source data for 2005 nickel production was the INSG, which reports mine production as nickel contained in laterite ore mined and nickel contained in sulfide ore concentrates. Additionally, losses to tailings and slag were calculated from company data for 2005. While the data sources for mine production differ from 2005 and 2014, resolving an 11% divergence in production efficiency based on a discrepancy in reporting alone is unlikely. Nevertheless, a combination of any of the factors described above could certainly account for the observed divergence.

GLOBAL ANTHROPOGENIC MATERIAL EFFICIENCIES

				WORL	D PRODU	CTION Enters Fa Manufactu	ibrication, ring, & Use		F&M		USE		Enters Waste Management		
Element	Cycle Year	Ore Production	Tailings	Mine Production	Slag, Leaching, Dross, By- products, Residues	Primary Smelter Production	Primary Refinery Production	Total Production Losses (b)	Fabrication & Manufacturing Losses (c)	Flow from use phase	In-use Dissipation (d)	In-use Dissipation Rate	Discards	Recycling	Non- functional Recycling
Ag (Gg)	1997	20.2	4	16.2	1.4		14.8	5.4					14.02	7.95	
	(a)	100%	20%	80%	7%		73%	27%						42%	
Al (Ga)	2014	37200	7400	29800	400	29700	24.5	7800		19100	1200	6%	17900	9800	
, (e.g)	(a)	100%	20%	80%	1%	80%	79%	21%		10100	5%	0,0		41%	
	2014	67590	13445	54145	727	53963	53418	14172			3356			27408	
Ce (Gg)	2007	42	8.4	33.6	3.3	30).3	11.7	4.4				21.6		
	(a)	100%	20%	80%	8%	72	2%	28%	10%						
	2014	63.6	12.7	50.9	5.00	45	5.9	17.7	6.66						
Co (Gg)	2005	126.7	63.35	63.35	9.272		54.078	72.622					40.523	9.009	3.643
	(a)	100%	50%	50%	7%		43%	57%						9%	4%
	2014	246	123	123	32		91.3	154						20.3	8.21
Cu (Ga)	(a) 2013	100%	50%	50%	13%		37%	03%		12100	500	4%	11600	0% 4050	3%
ou (ag)	(a)	100%					82%	18%		12100	3%	1,0	11000	27%	
Total	2014	22397		18509			18292	4105			756			6122	
	(a)	100%			15%		85%	15%							
Leaching, electrowon		4791			719		4072	719							
	(a)	100%	18%	82%	1%		81%	19%							
Concentrates, other		17606	3169	14437	218		14220	3387							
Fe (Gg)	2000	694000	92000	602000	28000	574	000	120000		265000	8000	3%	351000	267000	
	(a)	100%	13%	87%	4%	83	3%	17%			2%			61%	
	2014	1645642	218154	1427488	66395	136	1093	284549			41090			1004105	
Ni (Gg)	2005	1585	205	1380	85	12	95	290					650	410	105
	(a)	100%	13%	87%	5%	82	2%	18%						52%	13%
	2014	2814	364	2450	456	19	94	820						1258	322
	(a)	100%	13%	87%	16%	71	%	29%						45%	11%
Zn (Gg)	2010	14000	1800	12200	760	11440		2560		8300	1100	13%	10100	4700	
	(a) 2014	100% 15294	13% 1966	87% 13327	5% 830	82% 12497		18% 2797			11% 1656			33% 5045	

 Table S1.
 Bolded and italicized data are 2014 production values reported by USGS and/or INSG.
 These values provide a starting basis for calculation of all other 2014 global material efficiency values

 (i.e., data presented in Figure 3 and in the 2014 rows listed here), where that calculation relies on various element cycling rate data calculated from the listed references on an element-by-element basis.

 (a) Global material efficiencies were calculated across a single life cycle of the particular element; primary materials were deconvoluted from secondary materials to the extent possible.

(b) Total losses during production are titled as "Tailings & Slag" in Figure 4.; this value includes all production losses (e.g. leaching, dross).

(c) Fabrication and manufacturing losses, originating from primary materials, were calculated for cerium, as there are no secondary cerium sources, i.e. the EOL-RR for Ce is zero. Fabrication and manufacturing losses for all other cycles are assumed to be zero.

(d) In-use dissipation is relevant to AI, Cu, Fe, and Zn cycles; these are flows from the use phase that do not enter waste management.

(e) Dissipation is the flow of waste from waste management that is informally discarded directly to the environment. This definition is specific to the Ag cycle.

(f) For the iron cycle, landfill flow includes end-of-life dispersion to the environment.

		WASTE MA	WASTE MANAGEMENT				END-OF-LIFE RATES						
							Recycling Rate						
Element	Cycle Year	Dissipation (e)	Landfill (f)	Incineration	Other Repository	Processing or Separation Loss	End-of-life Recycling Rate (EOL- RR)	Non- functional Recycling Rate	Dissipation rate	Landfill Rate	Incineration Rate	Other Repository Rate	Processing or Separation Loss Rate
Ag (Gg)	1997	2.1	4				57%		15%	29%			
	(a) 2014	11% 3.67	21% 6.99										
Al (Gg)	2009			4700	3200	200	55%			:	26%	18%	1%
	(a)			19%	13%	1%							
	2014			13145	8950	559							
Ce (Gg)	2007 (a)		21.6 62%							100%			
	2014		39.2										
Co (Ga)	2005		27.871				22%	9%		69%			
	(a)		29%										
	2014		62.8										
	(a)		26%			1950	959/			409/			169/
Cu (Gg)	2013		5700			1000	35%			49%			10%
Total	(a) 2014		30% 8617			2797							
	(a)												
Leaching, electrowon													
.	(a)												
Concentrates,													
other													
Fe (Gg)	2000		84000				76%			24%			
	(a)		19%										
	2014		315898										
Ni (Gg)	2005		135				63%	16%		21%			
	(a)		17%										
	2014		414										
	(a)		15%										
Zn (Gg)	2010		5400				47%			53%			
	(a)		38%										
	2014		5796										

Table S1 cont'd. Bolded and italicized data are 2014 production values reported by USGS and/or INSG. These values provide a starting basis for calculation of all other 2014 global material efficiency values (i.e., data presented in Figure 3 and in the 2014 rows listed here), where that calculation relies on various element cycling rate data calculated from the listed references on an element-by-element basis.

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Element	Cycle Year	Additional Information	References
Aq (Gq)	2014		Johnson et al., 2005 ⁴
		Assumed all slag and leachate originated from primary smelter/ refinery production. Data in mass of silver content.	U.S. Geological Survey Minerals Yearbook 2014 ⁵
Al (Gg)	2014	Mine production is defined as the production of alumina from bauxite. Tailings include mining losses and red mud. Smelter production is defined as the production of Molten AI from alumina. Refinery production is defined as the production of AI ingot. 2014 primary smelter production may include the mass of secondary aluminum ingot and alloying materials, see USGS Minerals Yearbook 2015. Data in mass of aluminum content.	Liu et al., 2012 ⁶ U.S. Geological Survey Minerals Yearbook 2015 ⁷
Ce (Gg)	2014	Rare earth elements mine production is reported in rare earth oxide equivalents by the USGS, as the rare earths occur jointly in ore deposits. CeO ₂ content of rare earth oxides assumed to be 50% ^{8, 9} . Smelting/ refining processes are defined generally as the separation of individual rare earths from rare earth concentrates. Data reported herein is converted to cerium content.	Du and Graedel, 2011 ¹⁰ U.S. Geological Survey Minerals Yearbook 2014 ¹¹
Co (Gg)	2014	Approximate cobalt primary refinery production; refer to USGS Minerals Yearbook 2014 for further details on mine production and refinery production data. Refer to Harper et al. for a detailed description on waste generation in the production stages. Data in mass of cobalt content.	Harper et al., 2012 ¹² U.S. Geological Survey Minerals Yearbook 2014 ¹³
Cu (Gg)	2014	Mine production total, Gg: 18477 Refinery production total, primary, Gg: 18292 Concentrates, Gg: 14437 Other, Gg: 14220 Leaching, electrowon, Gg: 4040 Electrowon, Gg: 4072	U.S. Geological Survey Minerals Yearbook 2014 ¹⁵
		The difference in mine production and refinery production of electrowon Cu (produced by the SXEW (solvent extraction/ electrowinning- process)) is due to a discrepancy between Zambia's mine production (leaching, electrowon estimate) and refinery production (electrowon figure). Herein, the reported refinery electrowon Cu figure is used. Data in mass of copper content.	U.S. Geological Survey Minerals Yearbook 2014 ¹⁵
		Cu losses in the SXEW-process are assumed to be 15% of ore production. Cu losses in the production of concentrates using the pyrometallurgical process are assumed to be 18% of ore production. Note that typically the smelting process is ~97% efficient and the electrolytic refining process is ~99% efficient (these values were not applied here). Herein, the waste resulting from smelting and refining is calculated as the difference between mine production and primary refinery production. Refer to supplemental information of Glöser et al., 2013 for details on Cu production processes.	Glöser et al., 2013 ¹⁴
		Waste management and in-use dissipation rates extracted from International Copper Study Group figure: Industry Global Flows of Copper (2013) and Derived Recycling Rates.	International Copper Study Group, 2015 ¹⁶
Fe (Gg)	2014	Assumed all slag and by-products originated from primary smelter/refinery production. Smelter and refinery production is not differentiated; the reported figure represents the flow relevant to fabrication and manufacturing life stages. Mine production represents the total usable ore produced. Data in mass of iron content.	Wang et al., 2007 ¹⁷ U.S. Geological Survey Minerals Yearbook 2014- Advance Data Release ¹⁸
Ni (Gg)	2014	Assumed all slag originated from primary smelter production. Smelting and refining processes are not differentiated. Relevant flow of extracted nickel into fabrication and manufacturing is considered. Data in mass of nickel content.	Reck and Graedel, 2012 ³
		2005 mine production composition, and associated losses to tailings, assumed to be representative for 2014, due to lack of detailed mine production data. Refer to 2005 nickel study ¹⁹ . A detailed discussion can be found above.	U.S. Geological Survey Mineral Commodity Summaries 2016 ²⁰
		Primary nickel production defined as the flow nickel originating from mine production and purified through smelting and/or refining processes.	International Nickel Study Group, World Nickel Statistics 2015 ²¹
Zn (Gg)	2014	Global anthropogenic Zn cycle base case considered. Assumed all slag originated from primary smelter production; smelter production consists of zinc slab, which flows to fabrication and manufacturing. Data in mass of zinc content.	Meylan and Reck, 2015 ²² U.S. Geological Survey Minerals Yearbook 2014 ²³

Table S1 cont'd. Bolded and italicized data are 2014 production values reported by USGS and/or INSG. These values provide a starting basis for calculation of all other 2014 global material efficiency values (i.e., data presented in Figure 3 and in the 2014 rows listed here), where that calculation relies on various element cycling rate data calculated from the listed references on an element-by-element basis.

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(d) In-use dissipation is relevant to AI, Cu, Fe, and Zn cycles; these are flows from the use phase that do not enter waste management.

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(f) For the iron cycle, landfill flow includes end-of-life dispersion to the environment.

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Glossary

Note that general definitions are given here, and we direct the readers to the primary literature sources for *scope* and *system* boundaries.

Anthropogenic element cycles account for the stocks and flows of materials mobilized through human activity across relevant reservoirs/compartments.

Dissipation: The non-recovered portion of discards lost to the environment. *In-use dissipation*: materials lost to the environment during the use phase. *Related:* Dispersion.

Dross: Solid impurities present in molten metals during smelting.

Fabrication and manufacturing losses: Wastes from fabrication of semi-fabricated products and final products that enter the use phase (e.g., industrial scrap).

Fabrication, manufacturing, and use phase: Fabrication of semi-products (e.g., sheets, rolls), followed by the manufacturing process to transform materials into final goods. The resultant mass fraction of material goods flows to the use phase.

Incineration: Portion of discards disposed via burning (may include waste-to-energy).

Landfill: The non-recovered portion of material that enters waste management and recycling is assumed to be landfilled or lost to the environment.

Leaching: The extraction of minerals from ore through dissolution in acidic solutions.

Mine production: Production of mineral concentrates and/ or usable ore through one or more beneficiation steps. Mine production is the difference between ore production and tailings.

Nano: Mass fraction of engineered nanomaterials.

Natural element cycles account for natural material stocks and flows, or biogeochemical pathways by which elements are transformed and moved, through relevant geological and biological reservoirs or environmental compartments.

Nonfunctional recycling: Recovered material for another use in which that particular element's properties are *not* required/utilized.

Ore production (i.e., extraction): Metal content of ore removed from the lithosphere.

Other repository: Unidentified portion of materials entering waste management and recycling, this compartment likely arises to balance masses at the end-of-life. See primary cycle source.

Primary refinery production: Refining can include a variety of metallurgical purification techniques, such as electrolysis. Refining is the final processing step in production of pure metal (or alloy), which enters the fabrication stage, where semi-fabricated products such as metal sheets, plates, and rolls are produced. Primary refinery production is the difference between ore production and the total production/ separations wastes (as wastes originate only from primary sources herein).

Primary smelter production: Production of elemental metal from mineral concentrates, through the reduction of metal oxides. Smelting utilizes heat and reducing agents to reduce the desired metal and extract it from concentrates. Primary smelter production is the difference between mine production and slag (as slag originates only from primary sources herein).

Processing loss: Loss of discards due to processing of waste at the end-of-life. *Related:* Separations loss.

Recycling: Recovered fraction of mass that enters waste management and recycling (i.e., discards). Refer to source cycle for more detail (e.g., obsolete scrap, industrial scrap). *Functional recycling:* Material is recycled for another use in which that particular element's properties are required/utilized.

Residues: General term for separations waste/by-products generated in metallurgical processing.

Slag: The by-product of smelting. Slags are separations waste generated in metal smelting.

Tailings: Uneconomic portion of materials found in ore deposits (gangue). Gangue is separated from the mineral of interest typically through a beneficiation process that includes the crushing or milling of ore, followed by a flotation process.

	ENM Productior	n Volume 2014 (Gg)		Nano-Fraction of Mine Production 2014 (%)			
Element	Low Estimate	High Estimate	Mine Production 2014 (Gg)	Low Estimate	High Estimate		
Ag	0.1	0.4	27	0.5	2		
Au	0.001	0.003	3	0.04	0.1		
Bi	0.03	0.05	11	0.3	0.5		
Ce	0.7	1	51	1	2		
Cu	0.2	0.5	18509	0.001	0.002		
Fe ^a	0.006	0.03	1427488	4E-07	2E-06		
Fe ^b	0.006	0.03	1427488	4E-07	2E-06		
Ni	0.005	0.02	2450	2E-04	8E-04		
Sb	0.009	0.02	158	0.006	0.01		
Sn	0.09	0.2	286	0.03	0.06		
Ti ^c	20	89	3620	0.5	2		
Zr ^d	1	26	671	0.2	4		
Al	3	5	54145	0.005	0.01		
Со	0.004	0.006	123	0.003	0.005		
Mg ^e	0.009	0.02	9390	1E-04	2E-04		
Mg ^f	0.009	0.02	970	9E-04	2E-03		
Mn	0.001	0.002	17800	8E-06	1E-05		
Si ^g	86	654	8110	1	8		
Si ^h	86	654	2600	3	25		
Zn	5	26	13327	0.04	0.2		

Table S2. All values are in metal content of the particular element; nanomaterial metal content is calculated based on assumed chemical formulas listed in Table S6. Iron composition of nanomaterial is calculated based on the assumption that the total composition of the reported production volume is (a) Fe_2O_3 or (b) Fe_3O_4 . (c) Ti mine production is the combination of ilmenite and rutile. (d) ZrO_2 content of Zr mineral concentrates assumed to be ca. 63% (Table S7). (e) Total magnesium production is assumed to be the sum of magnesite mine production and Mg metal; a fraction of Mg metal is produced from magnesite; dolomite ore production not available. (f) Primary Mg metal production; Mg content of Mg metal assumed to be ca. 100%. (g) Estimated Si content of ferrosilicon and silicon metal production. (h) Si metal production; Si content of Si metal assumed to be ca. 100%. Refer to Table S1 for further details on mine production of select elements.

We performed Web of Science Core Collection searches for the total number of publications on each nanomaterial (e.g., material name + nano) and the terms "EHS", "environmental health and safety", "toxicity", "environment", "LCA", or "green chemistry." We then illustrate that there is no correlation with study rate and production volumes, as an example that environmental research is seldom prioritized by market volume. Here, we are cautious to note that market volumes should not be the only prioritization criteria. Below we note details about the search criteria.

"TOPIC" searches title, abstract, author keywords, and Keywords Plus. Timespan=All years. Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, BKCI-S, BKCI-SSH, ESCI.

> TOPIC: (zinc oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (gold) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (nickel) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (nanodiamond) AND TOPIC: (X) TOPIC: (nanofiber) AND TOPIC: (X) TOPIC: (nanoclay) AND TOPIC: (X) TOPIC: (cobalt oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (titanium dioxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (silicon oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (manganese oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (silver) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (zirconium oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (cerium oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (fullerene) AND TOPIC: (X) TOPIC: (iron oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (copper oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (bismuth oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (magnesium oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (antimony tin oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (aluminum oxide) AND TOPIC: (nano) AND TOPIC: (X) TOPIC: (quantum dot) AND TOPIC: (X) TOPIC: (dendrimers) AND TOPIC: (X) TOPIC: (nanocellulose) AND TOPIC: (X) TOPIC: (graphene) AND TOPIC: (X) TOPIC: (carbon nanotube) AND TOPIC: (X)

X = toxicity, environment, EHS, environmental health and safety, LCA, or green chemistry

While the possible search queries are innumerable, we note that the specific subset of search queries performed here is meant to be representative (i.e., demonstrate a pattern, which we expect to remain similar even if alternative/ other queries are run). Quotation marks and spelling variations were **not** used in these searches (i.e., search *words* are exact). Please, refer to Web of Science search rules.



Figure S1. *nano*-EHS research focus versus ENM production volumes. Titles above each panel indicate words used in a Web of Science Core Collection search conducted on either June 03, 2019 (for LCA or green chemistry) or September 27, 2018 (for toxicity, environment, EHS, or environmental health and safety). Note that this is a log-log plot, and the use of log scale prevented plotting of zero values (i.e., publication search query equal to zero); these are plotted as n=1 publication. QDs (quantum dots; QDs*) had zero production mass in 2015, and so the 2016 production volume is displayed. Colors indicate upper (blue) and lower (yellow) range of production volume estimates.

Technology Readiness Level

ENM	Applied R&D	Demonstration	Commercial
Aluminum Oxide	Medical implants	Environmental adsorbents	Anti-wear coatings
	Environmental adsorbents	Conductive coatings	Nanofillers for polymer composites
		Filtration membranes	Catalysts supports
			Heat transfer fluids
			Conductive coatings
			Propellants
			Polishing additives
			Paint additives
			Filtration membranes
			Specialty fibers
			Lubricants
n =	2	3	11
Antimony Tin Oxide	Smart windows	Lubricant oil	Anti-static coatings
	Lubricant oil	Catalysts	
	Catalysts	Sensors (humidity, gas)	
	Sensors (humidity, gas)	LIB & SIB battery additives	
	LIB & SIB battery additives	EMI shielding coatings	
	EMI shielding coatings	Conductive coatings	
	IR attenuation films and coatings	Conductive composites	
		IR attenuation films and coatings	
n =	7	8	1
Bismuth Oxide	Anti-microbial coatings	Medical device coatings	Ceramics
	Battery additives (anode)	Medical imaging (contrast agents,	
	Ballory addition (anodo)	nanoprobes and biolabels)	
	Radioprotective textiles	Thermoelectric devices	
	Sensors	Solid oxide fuel cells	
	Medical imaging (contrast agents,	BEL shielding	
	nanoprobes and biolabels)	i i i olinoiding	
	Thermoelectric devices		
	Solid oxide fuel cells		
	RFI shielding		
<u>n =</u>	8	5	1
Carbon Nanotubes	Catalysts	Acoustics	Anti-static composites & films for electrostatic painting and static dissipation
	Imaging probes and fluorescent labels	PEM fuel cells	Marine coatings
	Electrochemical and gas phase hydrogen storage	E-textiles	Battery additives
	Solar cells	Electrochemical and gas phase hydrogen storage	Data cables & power transmission lines

ENM	Applied R&D	Demonstration	Commercial		
	Drug delivery	Solar cells	De-icing coatings		
	Conductors & semiconductors in lighter and more efficient solar cells (flexible foils)	Drug delivery	Thermoset composites, thermoplastics, and rubber additives		
	Antibacterials	Conductors & semiconductors in lighter and more efficient solar cells (flexible foils)	Fuel system components		
	Biosensors	Biosensors	Conductive additive in composites & pastes		
		Stretchable films for electronics	Electromagnetic Interference Shielding (EMI) composites & coatings		
		Supercapacitor additives	Automotive polymer composites		
		Chemical sensors	Sporting goods composites		
		Field emission devices	Aerospace composites		
		Memory devices	Filtration membranes		
		Fire retardant materials	Microscopy (TEM grids, SPM tips, AFM tips)		
		TCF additives	EMI, ESD and antistatic, shielding coatings		
			& composites		
			TCF additives		
n =	8	15	16		
Cellulose	Anti-static coatings	Cement additives	Cement additives		
	E-textiles	Printing paper	Printing paper		
	Drug delivery	Polymer composites in plastics packaging	Polymer composites in plastics packaging		
	Sensors	Anti-static coatings	Transparent barrier films in food packaging		
	Aerospace composites	Transparent barrier films in food packaging	Rheology modifiers		
	Medical implants	Self-cleaning coatings	Paper composites		
	Drilling fluids in oil and gas	Filtration membranes	Hygiene products		
		Insulation	Filter media		
		Paint additives			
		3D printing additives			
		Automotive composites			
		Drilling fluids in oil and gas			
n =	7	12	8		
Cerium Oxide	Conductive coatings	Solid oxide fuel cells	Polishing slurries		
	Sensors	Anti-corrosion additives	UV absorbers		
	Hydrogen production		Fuel additives		
	Bioscaffolds		Catalysts		
	Therapeutic agents				
	Catalytic antioxidants				
n =	6	2	4		
Clays	Medical implants	Medical implants	Barrier films in packaging		
	Water filtration	Water filtration	Automotive composites		
			Automotive tire additives		
			Rheology modifiers		

ENM	Applied R&D	Demonstration	Commercial			
			Flame retardant plastic additives			
n =	2	2	5			
Cobalt Oxide	LIB electrode additives	LIB electrode additives	Magnetic fluids			
	Electrochromic devices	Electrochromic devices	Catalysts			
	Sensors	Sensors				
	Drug delivery & cancer therapy					
n =	4	3	2			
Copper Oxide	Field emission devices	Gas sensors	Industrial catalysts			
	Super hydrophobic coatings	Anti-microbials	Semiconductor additives			
	Thin film solar cells	Anti-oxidants				
	Filtration	Groundwater treatment				
	Gas sensors	LIB additives				
		Thin film solar cells				
		Filtration				
n =	5	7	2			
Dendrimers	Gene therapy	Drug delivery/ cancer therapy	Antimicrobial agents in sexual health			
	Catalytic agents	Water repellent coatings	Cosmetics			
	Separating agents	Gene therapy	Antibody reagents			
	Chelating agents	Catalytic agents	Medical imaging			
	Water treatment	Separating agents	Inkjet inks			
	Chemical sensors		Water repellent coatings			
	Light harvesting					
n =	7	5	6			
Diamonds	Drug & gene delivery	Polymer composites	Lubricants			
	MRI contrast agents	MRI contrast agents	Polishing slurries			
		Thermal compounds (pastes) for electronics	Anti-friction & wear coatings			
			Thermal compounds (pastes) for electronics			
n =	2	3	4			
Fibers	Biosensors	Biosensors	Air/ liquid filtration membranes			
		Battery separators	Medical textiles (hydrogel dressings)			
		Conductive additives for energy storage	Bone/ skin regeneration			
		Medical textiles (hydrogel dressings)				
		Bone/ skin regeneration				
n =	1	5	3			
Fullerenes	Electron acceptors in polymer-based solar	Electron acceptors in polymer-based solar	Lubricant additives			
	Polymers in supercapacitors	Polymers in supercapacitors	Whitening and anti-aging cosmetics			
	Fuel cell catalyst	Fuel cell catalyst	Drug delivery			
	Medical imaging	Medical imaging				
		Drug delivery				
		Lubricant additives				
n =	4	6	3			

Gold MRI contrast agents Biosensors Electronics MRI contrast agents Gasensors Gas sensors Gas sensors Gas sensors Mater remediation Water remediation Supercapacitor additives Braphene Antibacterials Thermal barrier Antistatic coatings Optical switches Supercapacitor additives Battery additives Pield effect transistors Anti-corrosion coatings Tires MRI contrasts agents Anticagentials Oilfield chemicals MRI contrasts agents Antibacterials Oilfield chemicals MRI contrasts agents Antibacterials Polymer composites Stress strain actuators Polymer composites Conductive inks Stress strain actuators Cement additives Gisplays Gisplays Gasensors Inks & 3D printed materials Polymer composites Conductive inks Electron microscopy sample supports Gisplays Inservert Cement additives Conductive inks Biosensors Inks & 3D printed materials Polymer composites Conductive inks Electron Conductive inks Biosensors Inks & 3D printed materials Polymer composites Lubricants Electron Electron <	ENM	Applied R&D	Demonstration	Commercial			
Image: market is a seried of the se	Gold		MRI contrast agents	Biosensors			
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Biosensors Inks & 3D printed materials Lubricants EMI shielding Flame retardants EMI shielding Paints & coatings EMI shielding Descrives and impermeable films EMI shielding Iron Oxide Fuel cell catalysts Cancer therapy & drug delivery Magnetic storage media Thermochromic smart windows Magnetic bioseparation MRI contrast agents Hyperthermia agents Hyperthermia agents EMI shielding			Adhesives	Humidity sensors			
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n =61613Iron OxideFuel cell catalystsCancer therapy & drug deliveryMagnetic storage mediaThermochromic smart windowsMagnetic bioseparationMRI contrast agentsImmunoassaysPolishing mediaHyperthermia agentsHyperthermia agents			Barriers and impermeable films				
Iron Oxide Fuel cell catalysts Cancer therapy & drug delivery Magnetic storage media Thermochromic smart windows Magnetic bioseparation MRI contrast agents Immunoassays Polishing media Hyperthermia agents Fuel cell catalysts	n =	6	16	13			
Thermochromic smart windows Magnetic bioseparation MRI contrast agents Immunoassays Polishing media Hyperthermia agents Polishing media	Iron Oxide	Fuel cell catalysts	Cancer therapy & drug delivery	Magnetic storage media			
Immunoassays Polishing media Hyperthermia agents		Thermochromic smart windows	Magnetic bioseparation	MRI contrast agents			
Hyperthermia agents			Immunoassays	Polishing media			
			Hyperthermia agents				
Propellants			Propellants				
Environmental remediation			Environmental remediation				
Magnetic coatings			Magnetic coatings				
Biosensors			Biosensors				
MRI contrast agents			MRI contrast agents				
n = 2 9 3	n =	2	9	3			
Magnesium Oxide IR attenuation films and coatings Fuel additives Catalysts	Magnesium Oxide	IR attenuation films and coatings	Fuel additives	Catalysts			
Antibacterials High-temperature dehydrating agents Flame retardants		Antibacterials	High-temperature dehydrating agents	Flame retardants			
Cancer therapy Superconductors Refractory material in furnace linings		Cancer therapy	Superconductors	Refractory material in furnace linings			
Gas sensors Fuel additives (e.g. rocket propellants)		Gas sensors	Fuel additives (e.g. rocket propellants)				
Adsorbent for toxic chemical agents IR attenuation films and coatings		Adsorbent for toxic chemical agents	IR attenuation films and coatings				
Antibacterials			Antibacterials				
Gas sensors			Gas sensors				

ENM	Applied R&D	Demonstration	Commercial			
		Adsorbent for toxic chemical agents				
n =	5	8	3			
Manganese Oxide	Electrocatalysts	MRI contrast agents				
	Water purification	Anode materials in LIBs				
	Supercapacitor additives	Water purification				
	Biosensors	Supercapacitor additives				
	Electrochemical sensors	Biosensors				
		Electrochemical sensors				
n =	5	6	0			
Nickel	Catalysts	Magnetic fluids				
	Conductive coatings	Propellant additives				
	Electrochromic coatings	Catalysts				
		Conductive coatings				
		Electrochromic coatings				
n =	3	5	0			
Quantum Dots	Quantum switches/ quantum computing	Thin film solar cells	Edge optic LCDs in TVs			
	Printable solar cells	On chip LCDs in TVs	On surface LCDs in TVs			
	Thin film solar cells	Medical contrast agents	Medical contrast agents			
	Solar windows	Biosensors	Security inks & tags			
	Drug delivery	Infrared imaging	Image sensors			
		Security inks & tags				
		QD lasers				
n =	5	7	5			
Silicon Dioxide	Sensors	Catalysts	Rubber and plastic additives			
		Silicon nanowires in electronics	Coating additives			
		Sensors	Cosmetics additives			
			Fillers in nanocomposites			
			Structural adhesives			
			Automotive tire additives			
			Cement additives			
n =	1	3	7			
Silver	Smart glass	Smart glass	Antimicrobial wound care			
		Water filtration & purification	Antimicrobial medical devices			
			Textiles			
			Antimicrobial coatings			
			Cosmetics & personal care additives			
			Conductive inks & films			
			Food packaging			
			Water filtration & purification			
n =	1	2	8			
Titanium Dioxide	Microfluidic devices	Theranostics	Photovoltaics (dye-sensitized solar cells)			

ENM	Applied R&D	Demonstration	Commercial
	Non-volatile memristive devices	Solar fuel generation via water splitting	Sunscreens & cosmetics
	Solar fuel generation via water splitting	Photocatalysts for environmental	Photocatalytic self-cleaning coatings
	Theranostics		
n =	4	3	3
Zinc Oxide			Sunscreens & cosmetics
			UV absorbers for paints, coatings, plastics/
			synthetics & textiles
			Antimicrobial and bacteriostatic agent
			Adhesives
			Electrically conductive applications
n =	0	0	5
Zirconium Oxide	Cancer diagnostics	Fuel cell additives	Resins for optics
		Biomedical implant coatings	Thermal barrier coatings
		Dental composites	Ceramics additives
		Polymer additives	Refractory products
			Cement additives
			Catalysts
			Oxygen sensors
n =	1	4	7

Table S3. Technology readiness level¹

Engineered Nanomaterial Global Production Volumes (Mg)

ENM	ENM Formula	2010	2011	2012	2013	2014	2015	2016	2017	2018	2019	2020	2021	2022	2023	2024	2025
Aluminum Oxide	Al ₂ O ₃	4250-7800	4400-8200	4500-8750	4725-9400	4960- 10100	5200- 10870	5500- 11700	5750- 12550	6000- 13500	6400- 14650	6800- 15900	7250- 17300	7750- 18900	8300- 20600	8800- 22450	9500- 24450
Antimony Tin oxide	SnO ₂ /Sb ₂ O ₅ (90%/10% wt.)	90-160	95-170	100-185	110-200	120-225	130-255	140-290	150-320	165-360	180-410	195-460	210-505	225-555	240-610	260-670	275-740
Bismuth oxide	Bi ₂ O ₃	25-32	27-37	30-43	32-49	35-57	37-67	40-80	43-88	46-97	52-108	58-118	61-130	65-143	70-170	75-188	80-205
Carbon nanotubes	С	350-1700	400-1700	400-2000	450-2200	520-2500	550-2750	585-2850	615-3150	650-3300	685-3500	710-3750	750-4000	785-4300	810-5700	850-6100	915-7000
Cellulose	(C ₆ H ₁₀ O ₅) _n	17-17	41-41	90-175	200-380	300-800	345-1120	415-1570	500-2195	600-3077	735-4149	910-5600	1140-7560	1420- 10210	1175- 13270	2200- 17250	2775- 24150
Cerium oxide	CeO ₂	750-1000	788-1090	800-1188	830-1295	880-1412	933-1539	989-1677	1048-1828	1111-1993	1177-2172	1248-2367	1323-2580	1402-2813	1486-3066	1576-3342	1670-3642
Clays	-	23000- 40000	24000- 44000	24600- 46200	25200- 48510	26000- 51200	26500- 54000	27300- 57250	28100- 60650	29000- 64300	30000- 68200	31000- 72300	31500- 77000	33000- 82000	34000- 87300	35250- 93000	36500- 99000
Cobalt oxide	Co ₃ O ₄	4.8-7.0	4.8-7.0	4.9-7.5	5.0-8.0	5.2-8.5	5.4-9.0	5.6-9.5	5.9-10.1	6.2-10.7	6.5-11.7	6.8-13.0	7.2-14.4	7.5-16.0	7.9-17.7	8.3-19.7	8.7-21.8
Copper oxide	CuO	200-330	220-380	240-440	270-490	290-570	320-640	350-710	385-790	420-900	460-1030	500-1150	550-1220	610-1270	680-1350	750-1450	830-1600
Dendrimers	-	0.20-0.80	0.25-0.90	0.28-1.00	0.31-1.12	0.34-1.25	0.37-1.48	0.40-1.75	0.44-2.06	0.48-2.43	0.54-2.97	0.60-3.62	0.67-4.52	0.75-5.66	0.83-7.07	0.93-8.84	1.03-11.05
Diamonds	С	8.0-10.0	8.8-11.3	9.7-12.7	10.7-14.3	12-16.2	13.5-18.3	15.2-20.8	17.1-23.7	19.3-27.3	21.8-31.4	24.6-36.4	27.8-42.2	31.4-49	35.5-57.3	40.1-67.1	46.2-79.1
Fibers	-	110-170	130-220	150-250	162-275	175-308	192-354	212-407	233-468	260-539	290-628	323-731	365-874	412-1044	474-1248	545-1491	627-1797
Fullerenes	С	20-45	25-60	30-75	35-81	40-98	50-115	60-132	73-148	87-165	100-183	112-204	123-231	136-260	149-294	164-333	180-376
Gold	Au	0.8-1.8	0.9-2.0	1.0-2.0	1.0-3.0	1.1-3.0	1.3-3.1	1.5-3.2	1.8-3.4	2.0-3.7	2.2-4.0	2.4-4.3	2.8-4.7	3.1-5.1	3.4-5.5	3.8-5.9	4.3-6.3
Graphene	С	0.25-1.5	0.25-3	0.5-10	0.7-25	1-40	1.5-75	2-125	3-175	5-240	7-310	10-400	20-525	45-650	60-800	85-925	115-1050
Iron oxide	Fe ₂ O ₃ /Fe ₃ O ₄	4.5-13	5-22	5.8-33	7-38	8.1-45	9.2-54	10.7-69	15-82	19.5-97	24.5-115	32-132	36.8-161	42.3-197	48.7-240	56-292	64-357
Magnesium oxide	MgO	6-14	7.2-17.5	10-20.3	13-25.5	15-31.7	18.5-38	21-46	25-54.5	31-63	37-75	44-93	48.4-107	53-123	59-141	64-162	71-187
Manganese oxide	Mn ₂ O ₃	1.4-1.8	1.4-2.2	1.6-2.6	1.8-3.1	2-3.5	2.4-4.2	2.4-5	2.8-6	3.3-7.1	3.7-8	4.3-8.7	4.7-10	5.2-11.5	5.6-13.2	6.2-15.2	6.8-17.5
Nickel	Ni	4.0-11.0	4.1-12.1	4.2-13.9	4.4-16.0	4.6-19.2	4.9-23.0	5.1-27.7	5.4-33.2	5.6-39.8	5.9-47.8	6.3-58.5	6.6-71.7	7.0-87.8	7.4-109.8	7.8-137.2	8.3-171.6
Quantum dots*	-	-	-	-	-	-	-	> 0.5	-	-	-	> 5	-	-	-	-	-
Silicon oxide	SiO ₂	120000- 700000	130000- 800000	140000- 930000	155000- 1150000	185000- 1400000	210000- 1600000	240000- 1900000	280000- 2200000	320000- 2500000	365000- 2800000	400000- 3150000	440000- 3300000	480000- 3600000	496800- 3888000	514188- 4199040	532185- 4534963
Silver	Ag	90-320	100-350	110-370	120-390	135-420	150-450	165-475	185-500	210-530	230-560	255-600	280-635	310-670	350-710	380-753	410-798
Titanium dioxide	TiO ₂	30000- 120000	30600- 130000	31500- 135000	32150- 142000	33000- 148000	34000- 160000	35000- 174000	36000- 190000	37250- 210000	38500- 225000	40000- 245000	42000- 268000	43500- 290000	45560- 325000	47500- 364000	49500- 497000
Zinc oxide	ZnO	6000- 30000	6000- 30000	6150- 31500	6250- 31500	6390- 32300	6845- 34720	7190- 37500	74560- 40500	7960- 43740	8440- 47460	8945- 51500	9525- 55870	10145- 60890	10800- 66900	11500- 73000	12250- 79954
Zirconium oxide	ZrO ₂	1375- 31000	1375- 32000	1400- 32000	1450- 33000	1500- 35000	1545- 36400	1591- 37856	1639- 39370	1688- 40945	1739- 42583	1791- 44286	1845- 46058	1900- 47900	1957- 50055	2016- 52308	2097- 54662

Table S4. Global production volume estimates from low to high in Mg. *The quantum dot market was not reported on a mass basis, with the exception of 2016 and 2020 estimates. Global quantum dot revenues for the years 2013, 2015, and 2025 (projection), respectively: **\$40-80M**; **\$400-600M**; **\$8,000-10,000M** (from low to high estimates and rounded to one significant digit). Data adapted from *The Global Nanotechnology and Nanomaterials Market Opportunity Report*¹.

Element	Ore Production 2014 (Gg)	ENM Production Volume 2014 (Gg)	Nano Fraction of Ore Production (%)			
Ag	33.4	0.4	1%			
Al	67590	5	0.008%			
Ce	63.6	1	2%			
Со	246	0.006	0.003%			
Cu	22397	0.5	0.002%			
Fe ^a	1645642	0.03	0.000002%			
Fe ^b		0.03	0.000002%			
Ni	2814	0.02	0.0007%			
Zn	15294	26	0.2%			

Table S5. Nanomaterial production volumes are based on the high 2014 estimates. All values are in metal content of the particular element; nanomaterial metal content is calculated based on assumed chemical formulas listed in Table S6. Iron composition of nanomaterial is calculated based on the assumption that the total composition of the reported production volume is (a) Fe_2O_3 or (b) Fe_3O_4 .

SUMMARY OF GLOBAL ANTHROPOGENIC MATERIAL EFFICIENCIES

Element	Cycle Year	Ore Production	Enters Fabrication, Manufacturing, & Use	Total Production Losses	Fabrication & Manufacturing Losses	In-use Dissipation	Recycling	Non-functional Recycling	Dissipation	Landfill, Dispersion and/or Incineration	Other Repository	Processing or Separation Loss	Nano
		100%	720/	07%			100/		110/	219/			10/
	0011	100%	73%	21%			42%		11%	21%			1 %
Ag (Gg)	2014	33.4	24.5	8.94		50/	13.9		3.67	6.99	100/	10/	0.4
		100%	79%	21%		5%	41%			19%	13%	1%	0.008%
AI (Gg)	2014	67600	53400	14200		3360	27400			13100	8950	559	5
		100%	72%	28%	10%					62%			2%
Ce (Gg)	2014	63.6	45.9	17.7	6.66					39.2			1
		100%	37%	63%			8%	3%		26%			0.003%
Co (Gg)	2014	246	91.3	154			20.3	8.21		62.8			0.006
		100%	82%	18%		3%	27%			38%		12%	0.002%
Cu (Gg)	2014	22400	18300	4110		756	6120			8620		2800	0.5
		100%	83%	17%		2%	61%			19%			0.000002%
Fe (Gg)	2014	1650000	1360000	285000		41100	1000000			316000			0.03
		100%	71%	29%			45%	11%		15%			0.0007%
Ni (Gg)	2014	2810	1990	820			1260	322		414			0.02
		100%	82%	18%		11%	33%			38%			0.2%
Zn (Gg)	2014	15300	12500	2800		1660	5040			5800			26

Table S6. All masses are rounded to three significant digits with the exception of nanomaterial flows.

Element	Data Source	2014 World Mine, Smelter, and/ or Refinery Production (Gg)	Data		
Ag	U.S. Geological Survey Minerals Yearbook 2014 ⁵	Mine Production: 26.8	Includes data available through April 4, 2016.		
AI	U.S. Geological Survey Minerals Yearbook 2015 ⁷	Primary Smelter Production: 54000	Includes data available through October 6, 2016		
Au	U.S. Geological Survey Mineral Commodity Summaries 2016 ²⁵	Mine Production: 2.99	Published January 2016		
Bi	U.S. Geological Survey Minerals Yearbook 2015- Advance Data Release ²⁶	Mine Production: 10.6	Includes data available through August 8, 2016.		
Ce	U.S. Geological Survey Minerals Yearbook 2014 ¹¹	Mine Production: 50.9	Includes data available through August 26, 2016.		
Со	U.S. Geological Survey	Mine Production: 123	Includes data available through November 2, 2015.		
	Minerals Yearbook 2014 ¹³	Primary Refinery Production: 91.3			
Cu	U.S. Geological Survey	Mine Production: 18500	Includes data available		
	2014 ¹⁵	Primary Refinery Production: 18300	through May 9, 2016.		
Fe	U.S. Geological Survey Minerals Yearbook 2014- Preliminary ¹⁸	Mine Production: 1430000	Includes data available through December 15, 2015.		
Mg	U.S. Geological Survey Mineral Commodity Summaries 2016 ^{27, 28}	Magnesite Mine Production: 8420 Primary Metal Production: 970	Published January 2016		
Mn	U.S. Geological Survey Mineral Commodity Summaries 2016 ²⁹	Mine Production: 17800	Published January 2016		
Ni	U.S. Geological Survey Mineral Commodity Summaries 2016 ²⁰	Mine Production: 2450	Published January 2016		
	International Nickel Study Group, World Nickel Statistics 2015 ²¹	Primary Smelter Production: 1990	Includes data available through August 27, 2015		
Sb	U.S. Geological Survey Mineral Commodity Summaries 2016 ³⁰	Mine Production: 158	Published January 2016		
Si	U.S. Geological Survey Mineral Commodity Summaries 2016 ³¹	Silicon Production: 8110	Published January 2016		
	U.S. Geological Survey Minerals Yearbook 2014 ³²	Silicon Metal Production: 2600	Includes data available through July 30, 2015.		
Sn	U.S. Geological Survey Mineral Commodity Summaries 2016 ³³	Mine Production: 286	Published January 2016		
Ti	U.S. Geological Survey Mineral Commodity Summaries 2016 ³⁴	Mine Production: 3620	Published January 2016		
Zn	U.S. Geological Survey Minerals Yearbook 2014 ²³	Mine Production: 13300	Includes data available through November 5, 2015.		
Zr	U.S. Geological Survey Minerals Yearbook 2014 ³⁵	Mine Production: 671	Includes data available through April 21, 2016.		

Table S7. All values expressed in content of particular element and rounded to three significant digits. CeO_2 content of rare earth oxides assumed to be 50%^{8,9}; approximate cobalt primary refinery production; total magnesium production is assumed to be the sum of magnesite mine production and Mg metal; a fraction of Mg metal is produced from magnesite; dolomite ore production not available; Si content of Si metal assumed to be ca. 100%; Ti mine production is the combination of ilmenite and rutile; ZrO_2 content of Zr mineral concentrates assumed to be ca. 63%²⁴.

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