

# Global Metal Use Targets in Line with Climate Goals

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Cite This: *Environ. Sci. Technol.* 2020, 54, 12476–12483

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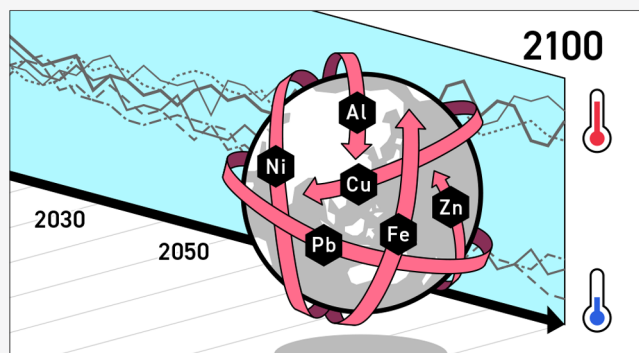
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**ABSTRACT:** Metals underpin essential functions in modern society, yet their production currently intensifies climate change. This paper develops global targets for metal flows, stocks, and use intensity in the global economy out to 2100. These targets are consistent with emissions pathways to achieve a 2 °C climate goal and cover six major metals (iron, aluminum, copper, zinc, lead, and nickel). Results indicate that despite advances in low-carbon metal production, a transformative system change to meet the society's needs with less metal is required to remain within a 2 °C pathway. Globally, demand for goods and services over the 21st century needs to be met with approximately 7 t/capita of metal stock—roughly half the current level in high-income countries. This systemic change will require a peak in global metal production by 2030 and deep decoupling of economic growth from both metal flows and stocks. Importantly, the identified science-based targets are theoretically achievable through such measures as efficient design, more intensive use, and longer product lifetime, but immediate action is crucial before middle- and low-income countries complete full-scale urbanization.



## 1. INTRODUCTION

International agreement on both climate change mitigation<sup>1</sup> and sustainable development<sup>2</sup> poses a fundamental global challenge: how to satisfy the basic needs of an expanding global population without jeopardizing the 1.5–2 °C climate goals. Meeting this challenge calls for immediate changes in metal production and usage, which currently accounts for approximately 10% of global greenhouse-gas (GHG) emissions<sup>3</sup> while underpinning vital services in a modern society in the form of products, factories, and infrastructures.<sup>4</sup> Despite its importance, however, a clear vision of a future metal use system in harmony with long-term climate goals is lacking, impeding our ability to achieve an international consensus on global targets for metal flow, stock, and use intensity in the global economy based on a systematic understanding.<sup>5</sup> One key to building this consensus is to explore future metal use scenarios that satisfy the metal service demands of future generations without compromising long-term climate goals and to develop a science-based target (SBT)<sup>6–8</sup> to accelerate concerted and innovative efforts by government and industry.

Technology-rich integrated assessment models are typically used to provide such scenarios by exploring possible technology mixes and their costs.<sup>9–11</sup> However, this approach often fails to reflect the physical interconnection in the series of metal cycles<sup>12</sup> that includes material production, manufacturing, in-use stock, and waste management, resulting in a weak foundation for explaining future demand and scrap availability.<sup>13</sup> Furthermore, existing studies have focused strongly on innovative technology

solutions such as carbon capture and storage (CCS)<sup>14</sup> and hydrogen-based production,<sup>15</sup> while metal cycle solutions,<sup>16</sup> including circular economy (CE)<sup>17</sup> strategies, have tended to receive less attention. Although several studies<sup>4,18–20</sup> have demonstrated important steps by systematically linking metal cycles to carbon emissions based on the principle of material flow analysis (MFA), such studies have failed to account for cumulative emissions—carbon budgets<sup>21</sup>—and provide no explicit long-term or time-series targets for metal flows, stocks, and use intensity.

In this study, we develop global targets for metal flow, stock and use intensity out to 2100 harmonized with 2 °C climate goals using a dynamic MFA model coupled with an optimization routine and a global MFA system boundary incorporating 231 countries. Our approach explicitly deals with the physical interconnections of the entire metal cycle based on mass balance principles and carbon budgets, enabling the elucidation of the time series of metal flows, stocks, and efficiency required to meet the climate goal. Given the large uncertainties and environmental risks associated with innovative technology solutions,<sup>22</sup> we aim to provide a benchmark indicating the extent to which

Received: April 20, 2020

Revised: August 27, 2020

Accepted: August 28, 2020

Published: September 11, 2020



material efficiency needs to be improved if the innovative technologies fail to scale as planned. The metal cycle solutions considered in our analysis include product lifetime extension and improved end-of-life recycling based on the concept of a CE.<sup>23</sup> We also discuss strategies to meet basic human needs using less metal, including more intensive use of metal stocks, and efficient product design.<sup>24</sup> As our aim is to cover metals that are widely used in modern society, we have included six major metals—iron, aluminum, copper, zinc, lead, and nickel—which account for more than 98% by mass of all metal production.<sup>25</sup>

## 2. METHODS

**2.1. Historical Metal Flows and Stocks.** Historical world flows and stocks of major metals from 1900 to 2010 are estimated by linking global MFA system boundaries for 231 countries<sup>26,27</sup> with a dynamic stock model<sup>28</sup> that explicitly describes the multiyear physical interconnections of the entire metal cycle.<sup>29,30</sup> In this modelling approach, the trade flows of metals contained in semimanufactured and finished products often cause mass imbalances because of data quality. This is resolved by adjusting the metal content and cut-off value for each trade commodity using a quadratic programming technique.<sup>26</sup> All metal flows in the 231 countries are then calculated based on the mass balance equations (eqs 1–13 in the Supporting Information). Stock dynamics aggregated according to the income level<sup>31</sup> are estimated using the inflow-driven approach,<sup>32</sup> assuming a specific lifetime for each product sector (Tables S2–S7).

**2.2. Future Metal Flows and Stocks under the Carbon Budget.** Future metal flows and stock dynamics aligning with the emission pathways of the 2 °C climate goal are explored by the optimization routine, which links to the dynamic stock model and emission intensities obtained from a life cycle assessment (LCA) database.<sup>33</sup> The optimization routine determines the maximum production available under the annual carbon budget while aiming to minimize the divergence between supply and estimated baseline demand within the scenario period (2010 to 2100). In this case, the production includes both primary and secondary production; the latter covers two supply sources: new and old scrap. The new scrap is supplied from the yield generated at each processing stage; the old scrap is supplied from the outflow from the society as end-of-life products. Old scrap availability depends on the metabolism of the metal stock, and primary production is estimated as the remaining demand that cannot be satisfied by secondary production. The baseline demand is calculated based on future stock dynamics, which are determined under an assumption that global per capita in-use stocks follow growth patterns similar to those experienced by the current high-income countries. This trajectory does not take into account the emission constraints and is given as an exogenous variable to the optimization routine.

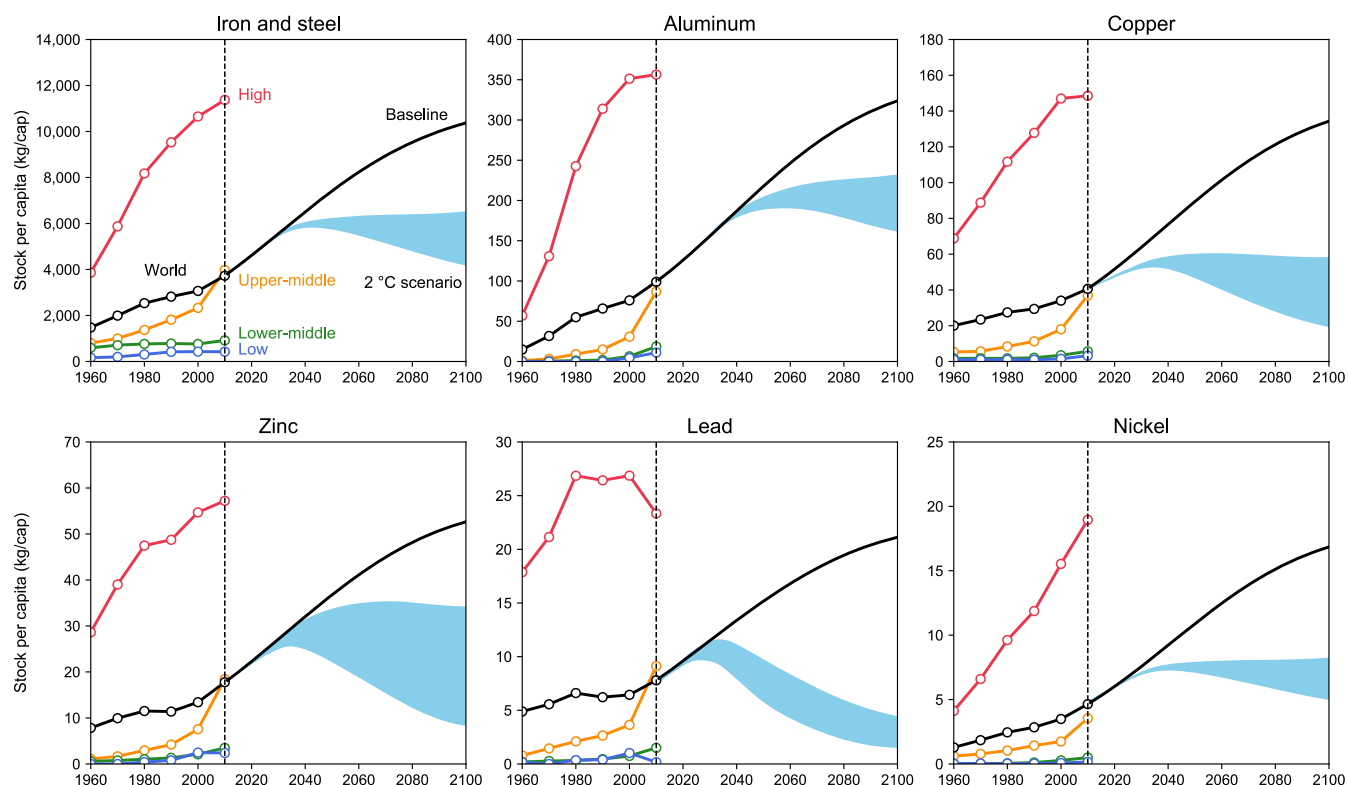
With regard to the emission intensities of each production route, we follow the method developed by Van der Voet and colleagues,<sup>34</sup> who linked MFA with LCA to simulate the future environmental implications associated with metal demand–supply scenarios. The dataset distinguishes between primary and secondary production routes and is a time series from 2010 to 2100. We consider the potential of an ore grade decline (for copper, zinc, lead, and nickel), energy efficiency improvements in the primary production route (for iron and aluminum), and electricity system decarbonization that reduces indirect emissions (for all six metals) as in existing studies<sup>34</sup> (see Figure

S3). Note that we assume here that future metal supply will not be limited by physical availability or any other environmental impacts such as biodiversity losses and water contaminations but is solely constrained by carbon emissions. Although our approach has some obvious limitations because of its simplification of several other factors (e.g., the rebound effect, market dynamics, and metal linkages), it nevertheless provides a useful stepping stone to explore future metal flows and stocks in line with Earth's carrying capacity. Detailed system boundaries, equations, data sources, and limitation descriptions can be found in the Supporting Information.

**2.3. Scenario.** **2.3.1. Metal Cycle Solution.** We explore two scenarios for metal cycles in the 2 °C pathway: business as usual (BAU) and a CE. The BAU scenario assumes that all model parameters regarding the metal cycle are constant during the analysis period. The CE scenario, on the other hand, expects that the end-of-life recycling rate and product lifetime will rise to their theoretical maximum values from 2011 to 2100 by following a gradual saturation curve. Tables giving a detailed scenario parameter overview for the six metals are provided in Tables S2–S7 in the Supporting Information.

**2.3.2. Innovative Technology Solution.** We examine the implications of innovative technology developments such as CCS and hydrogen reduction, targeting iron and aluminum, for which a long-term roadmap<sup>35–38</sup> has already been established. Metals other than iron and aluminum are excluded here as there are few roadmaps for innovative technologies, which makes it difficult to create scenarios. The detailed assumptions are as follows:

- Best available technology (BAT) for steel and aluminum making: The International Energy Agency estimated that the global emission reduction potential of BAT implementation for primary steel and aluminum production is 21 and 10%, respectively.<sup>39</sup> We assume that these are achieved from 2011 to 2050 by following the saturation curve.
- CCS and hydrogen reduction for steel making: the emission reduction target is set based on the long-term roadmap of the Japan Iron and Steel Federation for climate change mitigation.<sup>35</sup> Accordingly, the CCS reduction is 20% and the hydrogen reduction is 10%. As these technologies are expected to be implemented after 2030, we assume that the abovementioned reduction targets for primary production are achieved gradually from 2030 to 2060 for CCS and from 2050 to 2080 for hydrogen reduction.
- Superinnovative technologies for steel making (e.g., top gas recycling, bath smelting, direct reduction, and electrolysis): The European Steel Association (EUROFER) announced a more ambitious roadmap<sup>36</sup> that aims for a 90% reduction by 2050 in the European Union by combining a series of technologies such as HIsarna (smelting reduction) and ULCORED (direct reduction), both connected to CCS or CO<sub>2</sub>-free hydrogen production. We assume that a 90% reduction for primary steel production is accomplished by 2100 on a global scale after obtaining the reduction effects of all the BAT, CCS, and hydrogen reduction solutions mentioned above.
- CCS and inert anodes for aluminum making: European Aluminum created a scenario for lower carbon direct emission reductions through CCS and inert anodes<sup>38</sup> in the aluminum sector. The association projected that the



**Figure 1.** Per capita in-use stock for six major metals, 1960–2100. The ranges in the 2 °C scenario are due to differences in assumptions regarding the end-of-life recycling rate and product lifetime. The upper limit of the range (CE scenario) assumes that the end-of-life recycling rate and product lifetime increase to the theoretical maximum by 2100 according to the saturation curve. The lower limit of the range (BAU scenario) represents the assumption that all model parameters are constant throughout the scenario period.

implementation of these innovative technologies could reduce 23% of direct carbon emissions for primary aluminum production by 2050 in the European Union. We thus assume that a 23% reduction is achieved by 2100 on a global basis by following the saturation curve after 2030.

Note that the potential for emission reductions by switching to renewable biofuels and charcoal instead of fossil fuels<sup>40</sup> in thermal applications is not considered here because of the lack of a roadmap.

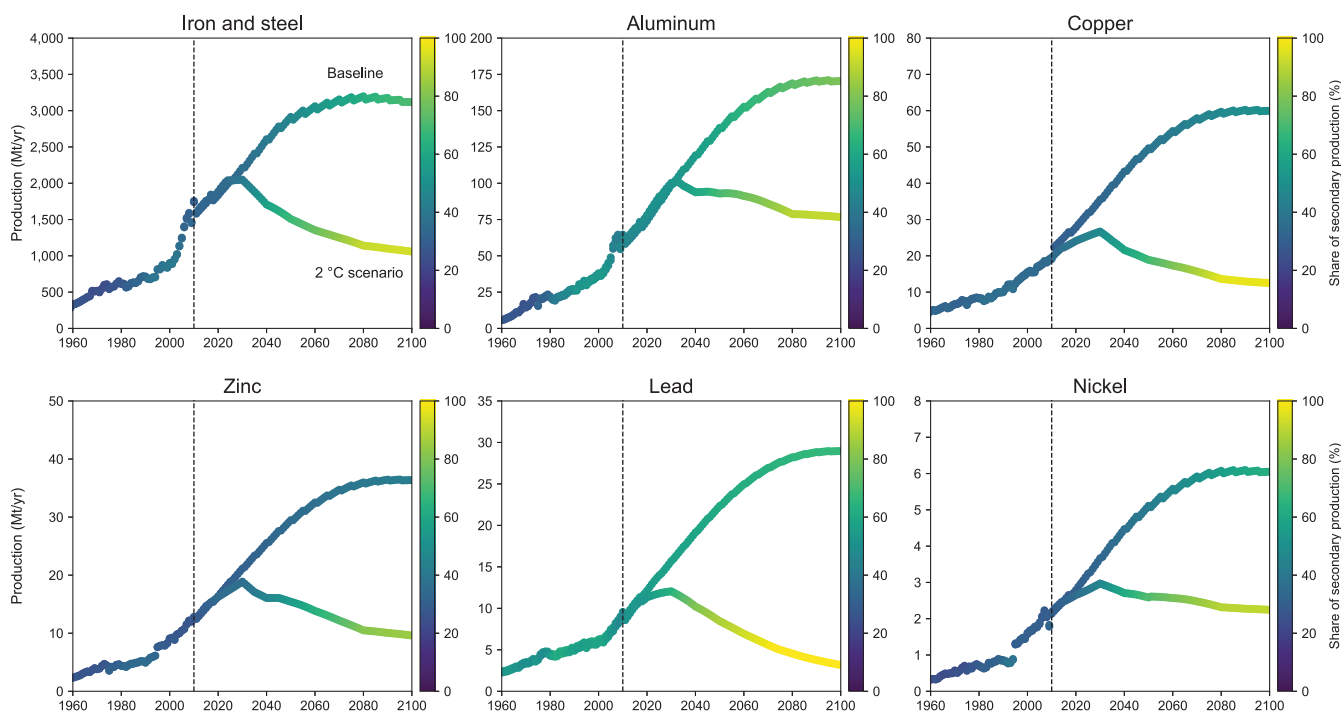
### 3. RESULTS AND DISCUSSION

**3.1. In-Use Stock.** Historically, in-use stocks of all major metals have been unevenly distributed across countries, based on the income level (Figure 1). Per capita stocks in high-income countries have shown a gradual growth or near-plateauing trend in recent years, reaching approximately 11,370 kg/cap for iron, 360 kg/cap for aluminum, 150 kg/cap for copper, 57 kg/cap for zinc, 23 kg/cap for lead, and 19 kg/cap for nickel in 2010. These levels are three to four times higher than the world average. On the other hand, the figures for upper-middle-income countries have remained at 20–40% of those in the high-income countries despite a sharp increase from around 2000. Most remarkably, lower-middle- and low-income countries have reached only 1–8% of the high-income country levels, suggesting a strong correlation between the major metal stock and economic level. These historical trends clearly illustrate a key challenge in the metal sector: how to achieve an absolute reduction in GHG emissions associated with major metal production while satisfying the increasing demand for metal services needed for

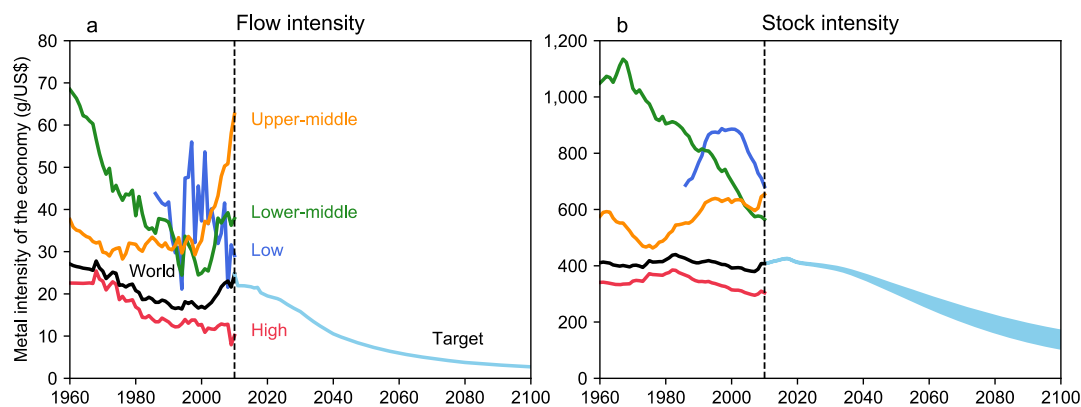
purposes such as power generation, water sanitation, and basic infrastructure in low- and middle-income countries.

Our analysis shows that this fundamental challenge cannot be sufficiently addressed solely through aggressive scrap recycling and product lifetime extension. Figure 1 shows that the global average of per capita metal stocks cannot follow the historical evolution patterns of high-income countries because of carbon constraints in the 2 °C scenario. More specifically, per capita stocks of all major metals in the world average, except lead, need to saturate at levels 2–3 times lower than those that are currently the case in high-income countries: 6500 kg/cap for iron, 230 kg/cap for aluminum, 58 kg/cap for copper, 34 kg/cap for zinc, 4 kg/cap for lead, and 8 kg/cap for nickel in 2100. If the CE transition fails along with innovative production technologies, these values can be expected to be 40–75% lower (absolute stock dynamics can be seen in Figure S4). The variation in per capita stock dynamics by each metal is primarily due to the difference in average lifetime and potential for improved end-of-life recycling rate and emission intensity. For example, as aluminum has more room to reduce emission intensity by decarbonizing electricity systems and improving energy efficiency (Figure S3), its per capita stock dynamics under the 2 °C pathway are closer to the baseline than is the case for the other metals. Lead, in contrast, has a shorter average lifetime and has limited room for improving its end-of-life recycling rate and emission intensity, thus creating a downward trend rather than plateauing.

Overall, findings here indicate that metal cycle solutions limited to end-of-life recycling and product lifetime extension are unlikely to be sufficient for meeting the 2 °C climate goal in the metal sector. Satisfying the metal service demand of 10



**Figure 2.** Production activities for six major metals, 1960–2100. The shade of the line color represents the ratio of secondary production to total production. The 2 °C scenario shows a case assuming increased end-of-life recycling rate and product lifetime (CE scenario).



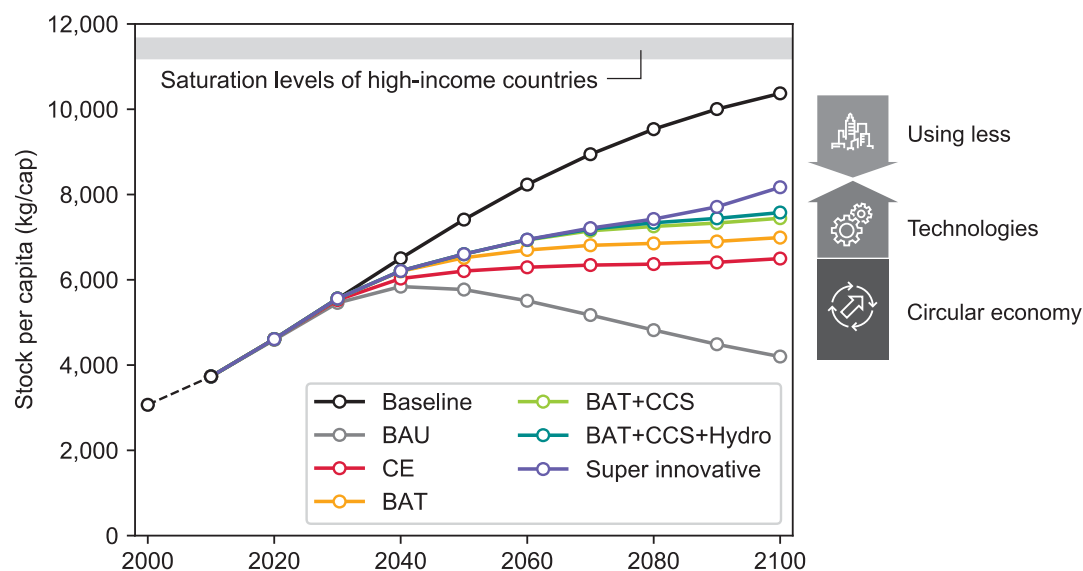
**Figure 3.** Metal use intensity in the global economy, 2010–2100: (a) metal flow intensity of the economy (metal inflows/GDP) and (b) metal stock intensity of the economy (metal stock/GDP). The ranges of the target are generated by the CE and BAU scenarios. Future GDP is based on SSP2,<sup>58</sup> which represents a middle-of-the-road scenario.

billion people within the carbon budget will require a transformative system change to meet society's needs with less metal. One benchmark can be stabilizing the growth of global major metal in-use stock at around 7 t/cap, which is approximately half the current level of high-income countries.

**3.2. Primary and Secondary Production.** For the world average to follow stock growth patterns similar to those of high-income countries, production activities will need to be increased by a factor of 2–3 from 2010 to 2100, depending on the metal (Figure 2). These estimates are consistent with those of a previous study<sup>41</sup> (Figure S7). However, the carbon budget in line with the 2 °C goal significantly constrains production activities. Figure 2 clearly shows that the 2 °C scenario requires a production peak for all six major metals by around 2030. That is, an absolute decoupling of economic growth and metal production should be accomplished by no later than 2030 if we cannot rely on innovative technology solutions. The role of secondary production (production from scrap) is increasing

over time, with approximately 54–87% of production coming from secondary production in 2050 and 84–100% in 2100, with an increased end-of-life recycling rate. Primary production (production from ore), on the other hand, peaks around 2020–2030 and continues to decline thereafter. These results suggest that metal demand needs to be substantially curtailed if large-scale implementation of the innovative technology solutions fails to scale. Realistically speaking, it is difficult to meet all of the demand with 100% secondary production because of quality issues<sup>42</sup> and thermodynamic reasons.<sup>43</sup> Thus, production activities will be more restricted if we fail to develop an advanced recycling technology that enhances the quality of secondary production or product design harmonized with scrap utilization.

Potential per capita targets in this domain include stabilization at roughly 115.8 kg/cap for iron, 8.4 kg/cap for aluminum, 1.4 kg/cap for copper, 1.1 kg/cap for zinc, 0.3 kg/cap for lead, and 0.2 kg/cap for nickel until 2100 (Figure S6). These values are 2–



**Figure 4.** Per capita in-use stock of iron and steel with the various innovative technology solutions, 2000–2100. The horizontal grey area indicates the current saturation levels in high-income countries. The baseline represents the stock growth pattern without carbon constraints. CE assumes increased end-of-life recycling rate and product lifetime, while BAU assumes a constant value of these parameters in the 2 °C scenario. Abbreviations for innovative production technologies are as follows: best available technology (BAT), carbon capture and storage (CCS), and hydrogen reduction (Hydro). Superinnovative technologies include top gas recycling, bath smelting, direct reduction, and electrolysis.

9 times lower than those in current high-income countries, underscoring the urgent need to break the coupling of economic growth and metal demand.<sup>44</sup>

**3.3. Metal Use Intensity.** To what extent should we promote decoupling in the coming decades? This question is addressed by linking the metal flows and stock dynamics identified above to the shared socioeconomic pathways (SSPs).<sup>45</sup> Here, we define the metal use intensity of the economy (g-metals/GDP)—that is, the physical metal flow or in-use stock per unit of economic activity—as an indicator of decoupling.<sup>46</sup>

Figure 3 illustrates the urgent need for a significant decrease in the metal use intensity of the global economy over the 21st century and the difficulty of achieving this decrease. The historical metal flow intensity of the global economy shows gradual improvements before 2000 but deteriorates after this period because of a drastic increase in upper-middle-income countries, mainly China. Intensity targets in line with the 2 °C goal call for an immediate change in this situation. Figure 3 shows that the metal flow intensity needs to be reduced by 36% by 2030, 70% by 2050, and 90% by 2100 relative to 2010, meaning a strong decoupling of global metal production from economic activities.

We also confirm the importance of improving metal stock intensity in parallel with flow intensity. Stock intensity provides better insights into the nexus of service provision and metal use, as metal services are delivered in the form of stocks such as buildings and vehicles.<sup>4</sup> Historically, the metal stock intensity of the global economy has not improved significantly, remaining at roughly 400 g/US \$. This observation is consistent with trends observed in previous studies<sup>47</sup> involving comprehensive materials such as cement and biomass. This tight coupling, however, needs to be severely broken in the 21st century. The identified targets for metal stock intensity are to reduce it by 3–4% by 2030, 20–25% by 2050, and 60–75% by 2100 relative to 2010 levels, depending on whether we assume an increased end-of-life recycling rate and an extended product lifetime.

These targets intrinsically depend on the assumed socioeconomic future and vary widely among SSP scenarios (Figure S8). However, given the significant uncertainties, our results consistently support the hypothesis that the 2 °C pathway requires continuous and substantial decoupling during the 21st century. Importantly, achieving the specified targets will allow us to align the GHG emissions in the metal sector with the 2 °C pathway without relying on technologies, whose applicability on a global scale is still unclear and may involve serious socio-environmental trade-offs.<sup>22</sup>

**3.4. Potential of Innovative Technology Solutions.** Despite the large uncertainty, innovative technology solutions such as CCS and hydrogen reduction are currently considered central options for climate change mitigation.<sup>14,48</sup> Thus, it is worth investigating the potential impacts of these technologies on the future metal use scenario, specifically targeting iron and aluminum, for which a long-term roadmap<sup>35–38</sup> is already established. Figure 4 shows that the various innovative technologies are not likely to be sufficient to maintain the available amount of iron stock at the current level of high-income countries within the carbon budget corresponding to the 2 °C goal (see Figure S9 for aluminum). The combination of BAT, CCS, and hydrogen reduction can contribute to raising the iron stock to 7600 kg/cap in 2100. Implementing superinnovative technologies, which are currently only in the laboratory stage, such as CO<sub>2</sub>-free hydrogen and electrolysis, has further promise of increasing the iron stock to 8200 kg/cap. Still, none of these scenarios match the baseline scenario that follows a similar stock growth pattern as that of the high-income countries. Similarly, the implementation of BAT, CCS, and inert anodes in aluminum making has a limited effect on the stock available under carbon constraints (Figure S9). This indicates that climate policy making for the metal sector that focuses only on innovative technology solutions may be highly problematic. The remaining gap needs to be filled by transitioning to a society in which the same services are delivered with less metal.

**3.5. Identified Target is Theoretically Achievable.** Lack of international consensus on the sustainable level of resource use is currently preventing agreement on global resource use targets.<sup>49</sup> The present study bridges this important knowledge gap. Our analysis, which is based on the explicit link between MFA and the carbon budget, provides a benchmark indicating the extent to which metal use intensity in the global economy needs to be curtailed by decoupling both metal flows and stocks from economic activities.

Specifically, we find that global metal stock should be saturated at around 7 t/cap (6500 kg/cap for iron, 230 kg/cap for aluminum, 58 kg/cap for copper, 34 kg/cap for zinc, 4 kg/cap for lead, and 8 kg/cap for nickel), which is approximately half the current level of high-income countries. Can this level of metal use meet the basic needs of future generations? What strategic options exist? Our simplified estimation, based on a literature review,<sup>4,18,50</sup> suggests that the 7 t/cap metal stock could deliver sufficient services for the expanding global population by implementing cross-cutting material efficiency strategies over the entire metal/product life-cycle. This includes more intensive use of metal stocks and more efficient design (Figure S10), facilitated through well-coordinated policy packages such as virgin material taxes, green public procurement, and a material-efficient design certification scheme.<sup>51</sup> Obviously, the difficulty of implementing these strategies will differ greatly depending on the metal, and future market trends will affect the ease with which demand reduction can be achieved (e.g., the demand for lead may suffer given its dominant use in lead-acid car batteries,<sup>52</sup> while the demand for copper and nickel may increase through lithium-battery technology in electric vehicles or offshore wind<sup>53,54</sup>). In any case, urgent action is critical, as the time required for designing and implementing effective policies is likely to be extensive. If such urgency is absent, the metal sector may well contribute to the overshooting of annual emission targets, leading to more stringent reduction requirements in the second half of the 21st century.<sup>55</sup> In this context, it is important to link the metal use targets identified in this study with urban development planning in middle- and low-income countries in the 21st century, as major metals are deeply connected to basic urban components such as buildings and infrastructures.<sup>56</sup> With the per capita stocks in these countries still well below the target, we now have an important opportunity to meet the needs of future generations with much less metal by a careful urban design that can stimulate a deep decoupling.

**3.6. Climate Policy Should Cover Material Efficiency.** Despite the key role of decoupling metal use from economic growth in climate change mitigation, much about material efficiency strategies<sup>57</sup> remains unknown or ill defined, including their full potential, barriers to their implementation, and the trade-offs involved. Scientific knowledge regarding policy instruments and their costs also remains unclear. Notably, the latest International Resource Panel report<sup>51</sup> points out that commitments to material efficiency have been scarcely incorporated into the nationally determined contributions of the Paris Agreement. An important step would be to include material efficiency strategies in the list of climate change mitigation options, taking into account specific policy alternatives and their costs. Broadening the horizons of policy makers, business leaders, and consumers is an essential challenge if they are to see and understand the full range of opportunities across the entire life cycle and value chain. If science-based policy instruments work properly, the metal sector can

potentially provide sufficient emission abatement while meeting the basic needs of an expanding global population. The fundamental question is whether we can act fast enough before today's middle- and low-income countries complete full-scale urbanization.

## ■ ASSOCIATED CONTENT

### Supporting Information

The Supporting Information is available free of charge at <https://pubs.acs.org/doi/10.1021/acs.est.0c02471>.

Modeling framework; data and parameter overview; material efficiency strategies; additional results; limitations; and other data (PDF)

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<https://pubs.acs.org/doi/10.1021/acs.est.0c02471>

### Author Contributions

T.W. coordinated the research, performed the analysis, created the figures, and led the writing of the paper. Keisuke Nansai, Kenichi Nakajima, and C.H. contributed to the model and scenario design. Keisuke Nansai, B.M., and D.G. aided in interpreting the results and worked on the manuscript. All authors provided critical feedback and helped shape the research, analysis, and manuscript.

### Notes

The authors declare no competing financial interest.

## ■ ACKNOWLEDGMENTS

This research was supported in part by Grants-in-Aid for Research (nos. 19K24391, 18KT0056 and 18KT0010) from the Japanese Ministry of Education, Culture, Sports, Science and Technology and by the Environment Research and Technology

Development Fund (JPMEERF20182001 and 20S20620) of the Environmental Restoration and Conservation Agency of Japan. We thank Dr. Yasuaki Hijioka, Dr. Minoru Fujii, and Wataru Takayanagi for providing helpful comments.

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