Electronic supplementary information 'Planetary metrics for the absolute environmental sustainability assessment of chemicals'

1. Ecoinvent database filtering criteria

All the inventory data were retrieved from ecoinvent v3.5¹—using the 'Allocation at the point of substitution' (APOS) version of the database—by downloading the individual ecoSpold2 files. Each ecoSpold2 file (XML type file) contains the inventory of one specific activity with a unique reference product and metadata displayed in a standardised form, e.g., the estimated price of the product and its production volume are some of the compulsory and optional fields available in the ecoSpold2, respectively.

Another compulsory field of the ecoSpold2 is the United Nations Central Product Classification (CPC) v2.1², information used as filtering criteria, i.e., we only consider products belonging to the divisions 33 to 36 of the CPC (**Table S-1**). For convenience, the products from these four divisions were reorganised, as shown in **Table S-2**.

Table S-1. Reference products from ecoinvent v3.5 (APOS), selected for the study according to the United Nations Central Product Classification v2.1.

ts; nuclear fuel 331-337
341-348
351-355
361-364, 369
fibres

 Table S-2. Reorganisation of products from CPC divisions 33-36.

Category	Organic chemical	Inorganic chemical	Other chemical
CPC groups	331-335, 341, 343, 347, 352, 361-364, 369	342, 344	groups not elsewhere attributed

The second filtering step aims to identify reference products (chemicals) with a functional unit (FU) of the type '1 kg of chemical X generated in a market-type activity with any geographical location'. To this end, keywords 'market' and 'kg' (as unit) were used.

2. Aggregation into a global production market

Next, the duplicated chemicals from the resulting dataset of section 1—note that duplicates appear due to local markets, i.e., geographical locations other than global (GLO)—were aggregated into one pseudo-GLO market following the mass allocation principle. The impact scores of the duplicated chemicals were allocated according to their contribution to the overall production volume (individual production volumes were gathered from the ecoSpold2 files). This procedure assumes no additional losses and exchanges associated with the transportation, storage, infrastructure, and handling of the chemical product.

The activities containing the keyword 'market group for' were removed from the dataset since they present similarly aggregated markets of chemicals generated for convenience in the ecoinvent database, e.g., 'market group for diesel'.

3. Impact assessment methods

We applied two life-cycle impact assessment (LCIA) methods. The main method, used to quantify the absolute environmental sustainability performance, is based on the Planetary Boundaries (PBs) framework.^{3,4} This PB-LCIA method quantifies seven out of nine originally defined PBs. We quantified six PBs—climate change, stratospheric ozone depletion, ocean acidification, biogeochemical flows, land-system change, and freshwater use —, using the characterisation factors (CFs) provided by Ryberg *et al.*⁵ To calculate the impacts on the change in biosphere integrity, omitted in Ryberg's approach, we implemented the CFs proposed by Galán-Martín et al.^{6,7} We also applied the IPCC 2013 method to estimate the global warming potential (GWP) in a timeframe of 100 years. These methods were implemented in SimaPro 9.1.⁸

4. Data for the calculation of transgression levels

We calculated the transgression levels (TLs) of chemicals using two alternative sharing principles: equal per capita (EPC) and grandfathering (GF). The latter sharing principle requires information about the total current impact of the anthropogenic activities (IMP_b^{TOT}) and the available safe operating space (SOS_b). Both pieces of information are taken from Galán-Martín *et al.*^{6,7}

The EPC sharing principle requires the total world gross value added ($GVA^{\tau o \tau}$), the individual basic prices of each chemical c ($price_c$) and the SOS_b . The global GVA was retrieved from The World Bank database⁹ for 2018: 7.38×10¹³ USD₂₀₁₈. On the other hand, the

basic prices of chemicals—expressed in EUR₂₀₀₅—were retrieved from ecoSpold2 files as part of the ecoinvent v3.5 database.¹ The currency was consequently transformed to USD₂₀₁₈ accounting for the inflation rate—adjusted with the Producer Price Index (PPI) from Eurostat¹⁰, PPI=104.5 in 2018 for EU28—and the average exchange rate in 2018¹¹, i.e., 1.1811 USD₂₀₁₈/EUR₂₀₁₈. Note, however, that in some cases, the ecoinvent prices refer to the cost of raw materials, so they provide a lower bound on the real price.

5. Detection of outliers

To identify the possible outliers, we implemented a robust Mahalanobis-type distance technique following Hubert *et al.*¹² This multivariate detection method employs a highly robust estimator of location, i.e., the minimum covariance determinant (MCD), for which a fast algorithm is implemented in Scikit-learn.¹³ In mathematical terms, the robust Mahalanobis-type distances (*rMD*) are estimated as follows:

$$rMD(x) = d(x, \hat{\mu}_{MCD}, \hat{\Sigma}_{MCD}) = \sqrt{(x - \hat{\mu}_{MCD})^T \hat{\Sigma}_{MCD}^{-1} (x - \hat{\mu}_{MCD})}$$
(1)

Where x is an observation (in our case, a chemical), $\hat{\mu}_{MCD}$ is the MCD estimate of location (a robust mean), and $\hat{\Sigma}_{MCD}$ is the MCD covariance estimate. The estimation of rMDs is performed in the nine dimensions of the control variables (CVs) of the PBs.

The square of rMD is assumed to follow a chi-squared distribution with nine degrees of freedom (k=9) and a significance level of 5%. Consequently, each chemical with rMD above the critical value was labelled as an outlier and removed from the dataset. The list of 26 removed activities (outliers) with their scores in the nine dimensions (the TLs of the nine CVs of PBs) is provided in **Table S-3** as reference.

Table S-3. Activities, detected as outliers using the robust Mahalanobis distance method with nine degrees of freedom (k=9) and a significance level of 5%. (α=5%). The degrees of freedom correspond to the transgression levels of the nine control variables of the PBs calculated using the equal per capita (EPC) sharing approach.

Activity name	CC - CO2 conc.	CC - Energy imb.	SOD	OA	BGC flows - P	BGC flows - N	LSC	FWU	CBI - BII loss
Ethanol, without water, in 95% solution state, from fermentation {GLO} market for APOS, S	4.7×10 ¹	4.6×10 ¹	8.1×10 ⁻¹	1.5×10 ¹	8.2×10 ⁻¹	1.5	4.7×10 ⁻²	5.0	1.6×10 ¹
Ethanol, without water, in 99.7% solution state, from fermentation {GLO} market for APOS, S	7.5×10 ¹	7.1×10 ¹	9.0×10 ⁻¹	2.4×10 ¹	1.1	1.2	1.4×10 ⁻¹	7.1	1.8×10 ¹
Magnetite {GLO} market for APOS, S	5.5×10 ²	5.4×10 ²	8.1×10 ⁻¹	1.7×10 ²	2.7×10 ⁻¹	1.2×10 ¹	9.4×10 ⁻³	9.2×10 ⁻¹	3.9×10 ¹
Adipic acid {GLO} market for APOS, S	7.8×10 ¹	1.5×10 ²	1.5×10 ¹	2.5×10 ¹	5.7×10 ⁻³	1.9×10 ⁻¹	1.1×10 ⁻³	1.2×10 ⁻¹	1.5×10 ¹
Ammonium nitrate, as N {GLO} market for APOS, S	1.3×10 ²	2.4×10 ²	2.3×10 ¹	4.3×10 ¹	2.7×10 ⁻²	7.0×10 ⁻¹	5.1×10 ⁻³	9.4×10 ⁻²	2.3×10 ¹
Charcoal {GLO} market for APOS, S	4.9×10 ¹	4.1×10 ¹	2.1×10 ⁻²	1.6×10 ¹	2.8×10 ⁻³	3.7×10 ⁻²	9.7×10 ⁻⁴	2.4×10 ⁻²	5.6×10 ¹
Citric acid {GLO} market for APOS, S	1.3×10 ²	1.3×10 ²	6.9×10 ⁻¹	4.3×10 ¹	1.4	2.0×10 ¹	5.7×10 ⁻³	6.1	1.6×10 ¹
Dimethyldichlorosilane {GLO} market for dimethyldichlorosilane APOS, S	5.4×10 ¹	5.2×10 ¹	3.4×10 ¹	1.7×10 ¹	3.5×10 ⁻³	6.7×10 ⁻²	3.1×10 ⁻⁴	5.4×10 ⁻²	4.8
Fluorescent whitening agent, distyrylbiphenyl type {GLO} market for APOS, S	2.6×10 ²	2.5×10 ²	2.7×10 ⁻¹	8.3×10 ¹	2.2	3.2×10 ¹	2.3×10 ⁻⁵	7.1×10 ⁻³	1.6×10 ¹
Heavy water {GLO} market for APOS, S	4.7×10 ¹	4.5×10 ¹	3.3×10 ⁻²	1.5×10 ¹	4.5×10 ⁻³	1.7×10 ⁻¹	1.0×10 ⁻³	8.0	3.0
Lithium brine, 6.7 % Li {GLO} market for APOS, S	3.1×10 ²	3.0×10 ²	3.0×10 ⁻¹	1.0×10 ²	1.4×10 ⁻²	3.7×10 ⁻¹	1.5×10 ⁻²	1.8×10 ⁻¹	4.3×10 ¹
Phosphane {GLO} market for APOS, S	8.9×10 ¹	8.6×10 ¹	1.0×10 ⁻¹	2.8×10 ¹	9.9×10 ¹	1.0	3.4×10 ⁻³	4.5×10 ⁻¹	6.6
Phosphate rock, as P2O5, beneficiated, wet {GLO} market for APOS, S	1.2×10 ²	1.2×10 ²	1.7×10 ⁻¹	3.8×10 ¹	8.2	5.8	3.0×10 ⁻²	2.9	1.3×10 ¹
Sodium aluminate, powder {GLO} market for APOS, S	6.5×10 ¹	6.2×10 ¹	5.7×10 ⁻²	2.1×10 ¹	1.5×10 ⁻²	5.8×10 ⁻¹	8.9×10 ⁻⁴	-6.4	4.2
Sodium nitrate {GLO} market for APOS, S	2.3×10 ²	2.9×10 ²	1.4×10 ¹	7.4×10 ¹	1.4×10 ⁻¹	7.7×10 ²	5.1×10 ⁻³	3.5×10 ⁻¹	2.5×10 ¹
Titanium tetrachloride {GLO} market for APOS, S	1.2×10 ²	1.1×10 ²	1.2×10 ⁻¹	3.9×10 ¹	4.5×10 ⁻²	2.1	6.1×10 ⁻³	9.4×10 ⁻¹	8.0
Ethanol, without water, in 99.7% solution state, from fermentation, at service station, combined to GLO market	7.0×10 ¹	6.5×10 ¹	8.2×10 ⁻¹	2.2×10 ¹	9.9×10 ⁻¹	1.1	1.3×10 ⁻¹	6.4	1.7×10 ¹
Ammonium carbonate, combined to GLO market	7.8×10 ¹	7.5×10 ¹	6.5×10 ⁻²	2.5×10 ¹	1.0×10 ⁻²	1.8×10 ²	2.4×10 ⁻³	1.1×10 ⁻¹	5.6
Chlorodifluoromethane, combined to GLO market	4.7×10 ¹	1.1×10 ²	3.9×10 ¹	1.5×10 ¹	1.7×10 ⁻²	7.3×10 ⁻¹	1.2×10 ⁻³	9.1×10 ⁻²	5.1×10 ¹
Glycerine, combined to GLO market	6.5×10 ¹	6.7×10 ¹	1.1	2.1×10 ¹	1.1	1.3	8.6×10 ⁻²	8.6×10 ⁻¹	2.3×10 ¹
Methanol, from biomass, combined to GLO market	5.2×10 ¹	5.1×10 ¹	7.4×10 ⁻²	1.7×10 ¹	3.3×10 ⁻¹	6.4	1.8×10 ⁻³	2.1×10 ⁻¹	7.4×10 ¹
Methyl methacrylate, combined to GLO market	5.9×10 ²	5.7×10 ²	3.4×10 ⁻³	1.9×10 ²	5.3	3.5×10 ⁻¹	-3.9×10 ⁻⁵	5.9×10 ⁻²	4.1×10 ¹
Phosphoryl chloride, combined to GLO market	7.1×10 ¹	6.9×10 ¹	8.7×10 ⁻²	2.3×10 ¹	4.6×10 ¹	9.3×10 ⁻¹	2.1×10 ⁻³	3.0×10 ⁻¹	5.2
Sulfur hexafluoride, liquid, combined to GLO market	5.0×10 ¹	5.1×10 ³	5.3×10 ⁻²	1.6×10 ¹	4.0×10 ⁻³	1.7×10 ⁻¹	8.0×10 ⁻⁴	9.6×10 ⁻²	4.5×10 ¹
Trichloromethane, combined to GLO market	5.1×10 ¹	5.0×10 ¹	3.7×10 ¹	1.6×10 ¹	2.3×10 ⁻²	1.0	9.5×10 ⁻⁴	8.9×10 ⁻²	7.9
Sodium formate, combined to GLO market	4.4×10 ¹	4.4×10 ¹	5.8×10 ⁻²	1.4×10 ¹	-3.4×10 ⁻¹	5.3×10 ⁻¹	1.8×10 ⁻³	1.3×10 ⁻¹	-7.9×10 ¹

The notation for the PBs is as follows: climate change (CC) with control variables of CO₂ concentration (CO₂ conc.) and energy imbalance (Energy imb.), stratospheric ozone depletion (SOD), ocean acidification (OA), biogeochemical (BGC) flows with control variables of phosphorus (P) and nitrogen (N), land-system change (LSC), freshwater use (FWU), change in biosphere integrity (CBI) with control variables of biodiversity intactness index (BII loss).

6. Supplementary results

This section includes additional results supporting the discussions and conclusions drawn in the main manuscript. **Figure S-1** presents the distributions of the chemicals according to the GWP and the seven PBs —climate change and biogeochemical flows PBs are shown with two control variables each—on a series of histogram subplots. Additionally, the correlations between the GWP and the PBs are displayed on scatter plots and complemented with their respective values of Spearman's rank correlation coefficients (r_s). As expected, GWP shows a good correlation with the GHG-related PBs, i.e., climate change (CO₂ concentration and energy imbalance), ocean acidification and biosphere integrity (r_s of 0.99, 0.99 and 0.98, respectively). In contrast, a weaker correlation is observed with the other PBs (at most r_s =0.79 for the stratospheric ozone depletion PB).



Figure S-1. Global warming potential (GWP) of chemicals versus their impact on the control variables of the PBs. The chemicals, represented by bubbles, are grouped into three categories, 'inorganic' (orange), 'organic' (blue) and 'other' (green). We indicate the Spearman's rank correlation coefficient (r_s) of the impact in a specific PB and GWP scores. Histograms and rug plots on the sides of each scatter plot show the overall and individual distributions of chemicals, respectively. The notation for the PBs is as follows: climate change (CC) with control variables of CO₂ concentration (CO₂ conc.) and energy imbalance (Energy imb.), stratospheric ozone depletion (SOD), ocean acidification (OA), biogeochemical (BGC) flows with control variables of phosphorus (P) and nitrogen (N), land-system change (LSC), freshwater use (FWU), change in biosphere integrity (CBI) with control variable of loss of biodiversity intactness index (BII loss). Note that 21 chemicals with GWP scores ranging from 48 to 3907 kg CO₂eq/kg of chemical are omitted here (for visualisation purposes) but are shown in **Table S-4** for completeness.

Figure S-2 depicts the correlations between the unitary prices and the impact scores in GWP and the PBs, where low Spearman's rank correlation coefficients indicate very weak monotonic relationships between the different variables.



Figure S-2. Unitary prices of chemicals versus their impact scores in global warming potential (GWP) and the PBs. The chemicals, represented by bubbles, are grouped into three categories, 'inorganic' (orange), 'organic' (blue) and 'other' (green). We indicate the Spearman's rank correlation coefficient (r_s) of the prices and the respective impact scores in GWP or PBs on the top right of the scatter plot. The notation for the PBs is as follows: climate change (CC) with control variables of CO₂ concentration (CO₂ conc.) and energy imbalance (Energy imb.), stratospheric ozone depletion (SOD), ocean acidification (OA), biogeochemical (BGC) flows with control variables of phosphorus (P) and nitrogen (N), land-system change (LSC), freshwater use (FWU), change in biosphere integrity (CBI) with control variable of loss of biodiversity intactness index (BII loss). Note that 23 chemicals with unitary prices ranging from 32.9 to 1421 USD₂₀₁₈/kg of chemical are omitted here (for visualisation purposes) but are shown in **Table S-5** for reference.

Table S-4 and **Table S-5** show the activities omitted in **Figure 3** of the main manuscript and **Figure S-1** and **Figure S-2** of the ESI. The prices and/or GWP scores of these activities are very high relative to most of the chemicals studied. Yet, they were considered in the calculations as they were not detected as outliers, e.g., they were accounted for when determining the Spearman's rank correlation coefficients.

Table S-4. Activities, omitted in Figure 3 and Figure S-1 for visualisation purposes due to high global warming potential (GWP) scores (ranging from 48 to 3907 kg CO₂eq/kg of chemical), together with their transgression levels in the PBs according to the equal per capita (EPC) sharing approach.

	CIMP	Transgression levels in								
Activity name	(kg CO ₂ /kg)	CC - CO ₂	CC - Energy			BGC	BGC			CBI - BII
	(88)	conc.	imb.	SOD	OA	flows - P	flows - N	LSC	FWU	loss
Lithium {GLO} market for APOS, S	4.8×10 ¹	1.8×10 ¹	1.7×10 ¹	1.7×10 ⁻²	5.6	2.7×10 ⁻²	2.5	9.1×10 ⁻⁵	2.6×10 ⁻²	1.3
Silicon, solar grade {GLO} market for APOS, S	5.2×10 ¹	4.9×10 ¹	4.8×10 ¹	4.7×10 ⁻²	1.6×10 ¹	2.3×10 ⁻³	1.3×10 ⁻¹	6.6×10 ⁻⁴	8.0×10 ⁻²	3.6
Silicon, multi-si, casted, combined to GLO market	7.9×10 ¹	4.4×10 ¹	4.3×10 ¹	4.6×10 ⁻²	1.4×10 ¹	2.2×10 ⁻³	1.3×10 ⁻¹	5.3×10 ⁻⁴	8.4×10 ⁻²	3.2
Aminopyridine, combined to GLO market	9.3×10 ¹	2.7×10 ¹	2.6×10 ¹	1.6×10 ⁻²	8.7	4.7×10 ⁻³	2.0×10 ⁻¹	4.4×10 ⁻⁴	3.3×10 ⁻²	1.9
Silicon, electronics grade {GLO} market for APOS, S	9.5×10 ¹	2.5×10 ¹	2.4×10 ¹	3.1×10 ⁻²	7.8	1.8×10 ⁻³	9.2×10 ⁻²	2.2×10 ⁻⁴	6.4×10 ⁻²	1.7
2-pyridinol {GLO} market for APOS, S	1.0×10 ²	2.8×10 ¹	2.7×10 ¹	6.7×10 ⁻²	8.9	5.2×10 ⁻³	5.4	4.6×10 ⁻⁴	3.5×10 ⁻²	1.9
Tetrafluoroethylene {GLO} market for APOS, S	1.2×10 ²	1.2×10 ¹	2.7×10 ¹	9.7	3.7	4.4×10 ⁻³	1.8×10 ⁻¹	2.8×10 ⁻⁴	2.2×10 ⁻²	1.3×10 ¹
Tetrafluoroethylene film, on glass {GLO} market for APOS, S	1.3×10 ²	1.2×10 ¹	2.7×10 ¹	9.5	3.8	4.4×10 ⁻³	1.8×10 ⁻¹	2.9×10 ⁻⁴	2.2×10 ⁻²	1.2×10 ¹
Gallium, semiconductor-grade {GLO} market for APOS, S	1.5×10 ²	8.1	7.8	1.3×10 ⁻²	2.6	2.3×10 ⁻²	7.6	1.5×10 ⁻⁴	1.4×10 ⁻²	5.8×10 ⁻¹
Uranium hexafluoride, combined to GLO market	1.5×10 ²	1.2×10 ²	1.1×10 ²	3.5×10 ⁻¹	3.7×10 ¹	2.6×10 ⁻²	5.8	4.0×10 ⁻³	2.3	8.1
Silicon, single crystal, czochralski process, photovoltaics, combined to GLO market	1.5×10 ²	6.7×10 ¹	6.5×10 ¹	7.7×10 ⁻²	2.1×10 ¹	2.7×10 ⁻³	1.5×10 ⁻¹	7.8×10 ⁻⁴	8.1×10 ⁻¹	4.6
Krypton, gaseous {GLO} market for APOS, S	1.6×10 ²	2.2×10 ²	2.2×10 ²	2.3×10 ⁻¹	7.0×10 ¹	5.4×10 ⁻³	4.6×10 ⁻¹	2.4×10 ⁻³	4.0×10 ⁻¹	1.5×10 ¹
Indium {GLO} market for APOS, S	2.2×10 ²	4.4	4.3	6.8×10 ⁻³	1.4	2.1×10 ⁻⁴	1.6×10 ⁻²	4.3×10 ⁻⁵	4.0×10 ⁻²	3.1×10 ⁻¹
Tantalum, powder, capacitor-grade {GLO} market for APOS, S	3.0×10 ²	1.8×10 ¹	1.8×10 ¹	2.1×10 ⁻²	5.8	2.2×10 ⁻³	1.3×10 ⁻¹	5.1×10 ⁻⁴	3.2×10 ⁻¹	2.1
Silicon, single crystal, czochralski process, electronics, combined to GLO market	3.0×10 ²	4.2×10 ¹	4.1×10 ¹	5.1×10 ⁻²	1.4×10 ¹	2.2×10 ⁻³	1.2×10 ⁻¹	4.4×10 ⁻⁴	3.2×10 ⁻¹	2.9
Xenon, gaseous, combined to GLO market	1.0×10 ³	2.2×10 ²	2.2×10 ²	2.3×10 ⁻¹	7.0×10 ¹	5.4×10 ⁻³	4.6×10 ⁻¹	2.4×10 ⁻³	4.0×10 ⁻¹	1.5×10 ¹
Uranium, enriched 3.0%, in fuel element for light water reactor {GLO} market for APOS, S	2.5×10 ³	7.0×10 ¹	7.2×10 ¹	7.8×10 ⁻¹	2.2×10 ¹	1.4×10 ⁻²	1.6	1.3×10 ⁻³	9.3×10 ⁻¹	5.2
Uranium, enriched 3.8%, in fuel element for light water reactor {GLO} market for APOS, S	3.5×10 ³	9.5×10 ¹	9.8×10 ¹	1.1	3.0×10 ¹	1.8×10 ⁻²	2.1	1.8×10 ⁻³	1.2	7.2
Uranium, enriched 3.9%, in fuel element for light water reactor {GLO} market for APOS, S	3.6×10 ³	9.8×10 ¹	1.0×10 ²	1.1	3.1×10 ¹	1.8×10 ⁻²	2.2	1.8×10 ⁻³	1.3	7.4
Uranium, enriched 4%, in fuel element for light water reactor {GLO} market for APOS, S	3.7×10 ³	1.0×10 ²	1.0×10 ²	1.2	3.2×10 ¹	1.9×10 ⁻²	2.3	1.9×10 ⁻³	1.3	7.6
Uranium, enriched 4.2%, in fuel element for light water reactor {GLO} market for APOS, S	3.9×10 ³	1.1×10 ²	1.1×10 ²	1.3	3.4×10 ¹	2.0×10 ⁻²	2.4	2.0×10 ⁻³	1.4	8.1

The notation for the PBs is as follows: climate change (CC) with control variables of CO₂ concentration (CO₂ conc.) and energy imbalance (Energy imb.), stratospheric ozone depletion (SOD), ocean acidification (OA), biogeochemical (BGC) flows with control variables of phosphorus (P) and nitrogen (N), land-system change (LSC), freshwater use (FWU), change in biosphere integrity (CBI) with control variable of loss of biodiversity intactness index (BII loss).

Table S-5. Activities, omitted in Figure S-2 for visualisation purposes due to high unitary prices (ranging from 32.9 to 1421 USD₂₀₁₈/kg of chemical), together with their impact scores in the global warming potential (GWP) and the PBs.

Activity name	Price (USD ₂₀₁₈ kg ⁻¹)	GWP (kg CO ₂ kg ⁻¹)	CC - CO2 conc. (ppm kg ⁻¹)	CC - Energy imb. (W m ⁻² kg ⁻¹)	SOD (DU kg ⁻¹)	OA (mol kg ⁻¹)	BGC flows – P (TgP yr ⁻¹ kg ⁻¹)	BGC flows – N (TgN yr ⁻¹ kg ⁻¹)	LSC (% kg ⁻¹)	FWU (km ³ yr ⁻¹ kg ⁻¹)	CBI - BII loss (% kg ⁻¹)
Uranium hexafluoride, combined to GLO market	3.3×10 ¹	1.5×10 ²	3.7×10 ⁻⁹	5.0×10 ⁻¹¹	2.3×10 ⁻¹²	1.1×10 ⁻¹¹	1.1×10 ⁻¹³	1.6×10 ⁻¹⁰	4.5×10 ⁻¹⁴	4.0×10 ⁻⁹	3.6×10 ⁻¹¹
Zirconium oxide {GLO} market for APOS, S	4.3×10 ¹	4.8	1.2×10 ⁻¹⁰	1.6×10 ⁻¹²	3.5×10 ⁻¹⁴	3.7×10 ⁻¹³	5.5×10 ⁻¹⁵	1.6×10 ⁻¹²	4.4×10 ⁻¹⁵	9.5×10 ⁻¹¹	1.3×10 ⁻¹²
Silicon, multi-si, casted, combined to GLO market	4.5×10 ¹	7.9×10 ¹	2.0×10 ⁻⁹	2.6×10 ⁻¹¹	4.1×10 ⁻¹³	6.0×10 ⁻¹²	1.3×10 ⁻¹⁴	4.9×10 ⁻¹²	8.2×10 ⁻¹⁵	2.1×10 ⁻¹⁰	2.0×10 ⁻¹¹
Hydrazine sulfate {GLO} market for hydrazine sulfate APOS, S	5.1×10 ¹	5.7	1.4×10 ⁻¹⁰	1.9×10 ⁻¹²	4.4×10 ⁻¹⁴	4.3×10 ⁻¹³	1.0×10 ⁻¹⁴	3.0×10 ⁻¹²	9.2×10 ⁻¹⁶	1.4×10 ⁻¹¹	1.4×10 ⁻¹²
Sodium tetrahydridoborate {GLO} market for APOS, S	5.4×10 ¹	3.0×10 ¹	7.4×10 ⁻¹⁰	1.0×10 ⁻¹¹	1.7×10 ⁻¹³	2.3×10 ⁻¹²	1.7×10 ⁻¹⁴	5.3×10 ⁻¹²	4.9×10 ⁻¹⁵	7.5×10 ⁻¹¹	7.0×10 ⁻¹²
Silicon, single crystal, czochralski process, photovoltaics, combined to GLO market	5.7×10 ¹	1.5×10 ²	3.7×10 ⁻⁹	5.0×10 ⁻¹¹	8.6×10 ⁻¹³	1.1×10 ⁻¹¹	2.0×10 ⁻¹⁴	7.4×10 ⁻¹²	1.5×10 ⁻¹⁴	2.5×10 ⁻⁹	3.5×10 ⁻¹¹
Lithium {GLO} market for APOS, S	7.0×10 ¹	4.8×10 ¹	1.2×10 ⁻⁹	1.6×10 ⁻¹¹	2.4×10 ⁻¹³	3.7×10 ⁻¹²	2.5×10 ⁻¹³	1.4×10 ⁻¹⁰	2.2×10 ⁻¹⁵	9.8×10 ⁻¹¹	1.2×10 ⁻¹¹
Selenium {GLO} market for APOS, S	7.6×10 ¹	2.6	6.4×10 ⁻¹¹	8.7×10 ⁻¹³	1.6×10 ⁻¹⁴	2.0×10 ⁻¹³	3.1×10 ⁻¹⁴	1.0×10 ⁻¹²	5.8×10 ⁻¹⁶	7.9×10 ⁻¹²	7.0×10 ⁻¹³
Aminopyridine, combined to GLO market	8.5×10 ¹	9.3×10 ¹	2.2×10 ⁻⁹	3.0×10 ⁻¹¹	2.7×10 ⁻¹³	6.9×10 ⁻¹²	5.3×10 ⁻¹⁴	1.4×10 ⁻¹¹	1.3×10 ⁻¹⁴	1.5×10 ⁻¹⁰	2.1×10 ⁻¹¹
2-pyridinol {GLO} market for APOS, S	8.9×10 ¹	1.0×10 ²	2.4×10 ⁻⁹	3.3×10 ⁻¹¹	1.2×10 ⁻¹²	7.4×10 ⁻¹²	6.2×10 ⁻¹⁴	4.1×10 ⁻¹⁰	1.4×10 ⁻¹⁴	1.7×10 ⁻¹⁰	2.3×10 ⁻¹¹
Silicon, electronics grade {GLO} market for APOS, S	9.9×10 ¹	9.5×10 ¹	2.4×10 ⁻⁹	3.2×10 ⁻¹¹	6.0×10 ⁻¹³	7.2×10 ⁻¹²	2.4×10 ⁻¹⁴	7.7×10 ⁻¹²	7.5×10 ⁻¹⁵	3.4×10 ⁻¹⁰	2.3×10 ⁻¹¹
Xenon, gaseous, combined to GLO market	1.2×10 ²	1.0×10 ³	2.5×10 ⁻⁸	3.4×10 ⁻¹⁰	5.2×10 ⁻¹²	7.6×10 ⁻¹¹	8.4×10 ⁻¹⁴	4.5×10 ⁻¹¹	9.6×10 ⁻¹⁴	2.5×10 ⁻⁹	2.3×10 ⁻¹⁰
Hexamethyldisilazane {GLO} market for APOS, S	1.5×10 ²	5.8	1.4×10 ⁻¹⁰	1.9×10 ⁻¹²	3.7×10 ⁻¹⁴	4.3×10 ⁻¹³	6.9×10 ⁻¹⁵	6.9×10 ⁻¹³	8.3×10 ⁻¹⁶	1.3×10 ⁻¹¹	1.4×10 ⁻¹²
Silicon, single crystal, czochralski process, electronics, combined to GLO market	1.8×10 ²	3.0×10 ²	7.4×10 ⁻⁹	1.0×10 ⁻¹⁰	1.8×10 ⁻¹²	2.3×10 ⁻¹¹	5.2×10 ⁻¹⁴	1.8×10 ⁻¹¹	2.6×10 ⁻¹⁴	3.1×10 ⁻⁹	7.1×10 ⁻¹¹
APOS, S Collium comiconductor grade [CLO]] market for LAPOS	4.2×10 ²	3.0×10 ²	7.4×10 ⁻⁹	1.0×10 ⁻¹⁰	1.7×10 ⁻¹²	2.3×10 ⁻¹¹	1.2×10 ⁻¹³	4.6×10 ⁻¹¹	7.2×10 ⁻¹⁴	7.3×10 ⁻⁹	1.2×10 ⁻¹⁰
Samular, semiconductor-grade (GLO); market for Japos, S	4.3×10 ²	1.5×10 ²	3.4×10 ⁻⁹	4.6×10 ⁻¹¹	1.1×10 ⁻¹²	1.0×10 ⁻¹¹	1.3×10 ⁻¹²	2.7×10 ⁻⁹	2.3×10 ⁻¹⁴	3.4×10 ⁻¹⁰	3.4×10 ⁻¹¹
reactor (GLO) market for APOS, S	8.4×10 ²	3.9×10 ³	8.8×10 ⁻⁸	1.3×10 ⁻⁹	2.1×10 ⁻¹⁰	2.7×10 ⁻¹⁰	2.2×10 ⁻¹²	1.7×10 ⁻⁹	5.6×10 ⁻¹³	6.4×10 ⁻⁸	9.2×10 ⁻¹⁰
reactor (GLO) market for APOS, S	8.4×10 ²	3.7×10 ³	8.3×10 ⁻⁸	1.2×10 ⁻⁹	2.0×10 ⁻¹⁰	2.5×10 ⁻¹⁰	2.1×10 ⁻¹²	1.6×10 ⁻⁹	5.3×10 ⁻¹³	6.0×10 ⁻⁸	8.6×10 ⁻¹⁰
reactor (GLO) market for APOS, S	8.4×10 ²	3.6×10 ³	8.0×10 ⁻⁸	1.2×10 ⁻⁹	1.9×10 ⁻¹⁰	2.5×10 ⁻¹⁰	2.1×10 ⁻¹²	1.6×10 ⁻⁹	5.2×10 ⁻¹³	5.9×10 ⁻⁸	8.4×10 ⁻¹⁰
reactor (GLO) market for APOS, S	8.4×10 ²	3.5×10 ³	7.8×10 ⁻⁸	1.1×10 ⁻⁹	1.8×10 ⁻¹⁰	2.4×10 ⁻¹⁰	2.0×10 ⁻¹²	1.5×10 ⁻⁹	5.0×10 ⁻¹³	5.7×10 ⁻⁸	8.2×10 ⁻¹⁰
reactor {GLO} market for APOS, S	8.4×10 ²	2.5×10 ³	5.7×10 ⁻⁸	8.2×10 ⁻¹⁰	1.3×10 ⁻¹⁰	1.8×10 ⁻¹⁰	1.5×10 ⁻¹²	1.1×10 ⁻⁹	3.8×10 ⁻¹³	4.2×10 ⁻⁸	6.0×10 ⁻¹⁰
Indium {GLO} market for APOS, S	1.2×10 ³	2.2×10 ²	5.2×10 ⁻⁹	7.2×10 ⁻¹¹	1.6×10 ⁻¹²	1.6×10 ⁻¹¹	3.5×10 ⁻¹⁴	1.7×10 ⁻¹¹	1.8×10 ⁻¹⁴	2.7×10 ⁻⁹	5.1×10 ⁻¹¹
Trimesoyl chloride {GLO} market for APOS, S	1 4×10 ³	83	1 7×10 ⁻¹⁰	2 4×10 ⁻¹²	6.5×10 ⁻¹³	5.3×10 ⁻¹³	1.4×10 ⁻¹⁴	4.3×10 ⁻¹²	6.0×10 ⁻¹⁶	9.0×10 ⁻¹²	1 9×10 ⁻¹²

The notation for the PBs is as follows: climate change (CC) with control variables of CO₂ concentration (CO₂ conc.) and energy imbalance (Energy imb.), stratospheric ozone depletion (SOD), ocean acidification (OA), biogeochemical (BGC) flows with control variables of phosphorus (P) and nitrogen (N), land-system change (LSC), freshwater use (FWU), change in biosphere integrity (CBI) with control variable of loss of biodiversity intactness index (BII loss).

7. Biogeochemical flow of nitrogen PB and cradle-to-gate scope

Following Ryberg *et al.*⁵, the characterisation factors (CFs) for nitrogen fixation were calculated via inverse modelling considering the emissions of N-compounds to freshwater. Due to the omission of the gate-to-grave LCA phase, some chemicals containing N may present lower BGC flow – N scores than expected. For example, the nitrate emissions due to ammonia application as fertiliser are not reflected in our results. However, some chemicals still lead to large transgression levels in the BGC flow – N, as nylon 6-6, which contains nitrogen. Indeed, even though we consistently evaluated all the chemicals of the dataset from cradle-to-gate, the amounts of fixated N for 27% of the chemicals exceed the associated share. This percentage would likely increase applying a cradle-to-grave scope. Likewise, considering a cradle-to-grave scope would also increase the impact on all the remaining control variables. Notably, this increment in impact would be more critical in the carbon-related PBs, as the fossil carbon chemically stored in the molecules would be released as CO_2 during their end-use phase due to degradation or incineration.

8. References

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