

Supporting Information

Resourcing the fairytale country with wind power: a dynamic material flow analysis

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1. Lifetime distribution

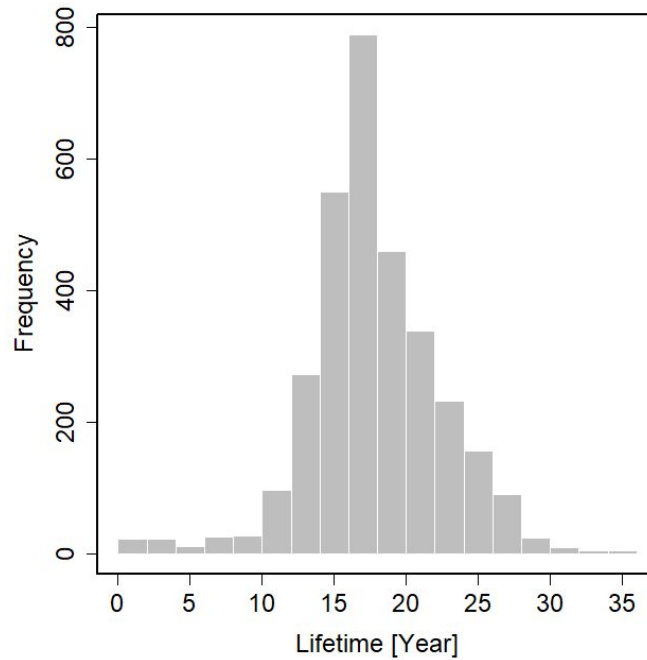


Figure S1. Lifetime distribution of wind turbines derived from the decommissioned wind turbines' lifetime.

2. Uncertainties in lifetime distribution and empirical regressions

Table S1. Statistical uncertainties in lifetime distribution.

	Parameter/ coefficient	Onshore estimate (std. error)	Offshore estimate (std. error)
Lifetime: $S_{t-t'} = \frac{\kappa}{\lambda} \left(\frac{t-t'}{\lambda} \right)^{\kappa-1} e^{-\left(\frac{t-t'}{\lambda} \right)^{\kappa}}$	Scale (λ)	19.48 (0.09)	19.48 (0.09)
	Shape (κ)	4.07 (0.05)	4.07 (0.05)

Table S2. Statistical uncertainties in empirical regressions.

Regression	Parameter/ coefficient	Onshore			Offshore		
		Estimate	Std. error	p-value	Estimate	Std. error	p-value
Capacity (C) versus Rotor Diameter (D): $D = aC^b$	Constant (a)	1.913743 6	0.0190893 36	0.000	0.9465624 67	0.0416878 67	0.000
	Exponent (b)	0.490830 9	0.0015171 53	0.000	0.5872416 81	0.0056681 81	0.000
Capacity (C) versus Hub Height (H): $D = aH^b$	Constant (a)	3.558202 6	0.0375506 05	0.000	5.0678762 1	0.5226345 1	0.000
	Exponent (b)	0.390678 2	0.0015965 08	0.000	0.3372751 8	0.0132725 8	0.000

Rotor Diameter (D) versus Rotor Weight (W_D): $W_D = a D^b$	Constant (a)	0.005103 532	0.0008179 673	0.000	0.0035013 29	0.0014561 35	0.024
	Exponent (b)	2.013795 269	0.0394237 953	0.000	2.1411691 96	0.0907274 87	0.000
Rotor Diameter (D) versus Nacelle Weight (W_N): $W_N = a D^b$	Constant (a)	0.035382 16	0.0053306 98	0.000	0.0090899 09	0.0069084 06	0.195
	Exponent (b)	1.690790 68	0.0376655 50	0.000	2.0455991 74	0.1648274 60	0.000
Product of Swept Area (D^2) and Hub Height (H) versus Tower Weight (W_T): $W_T = a (D^2 \times H)^b$	Constant (a)	0.017550 28	0.0039429 73	0.000	0.0175502 8	0.0039429 73	0.000
	Exponent (b)	0.683879 35	0.0193402 08	0.000	0.6838793 5	0.0193402 08	0.000

3. Mass intensities of wind turbine components

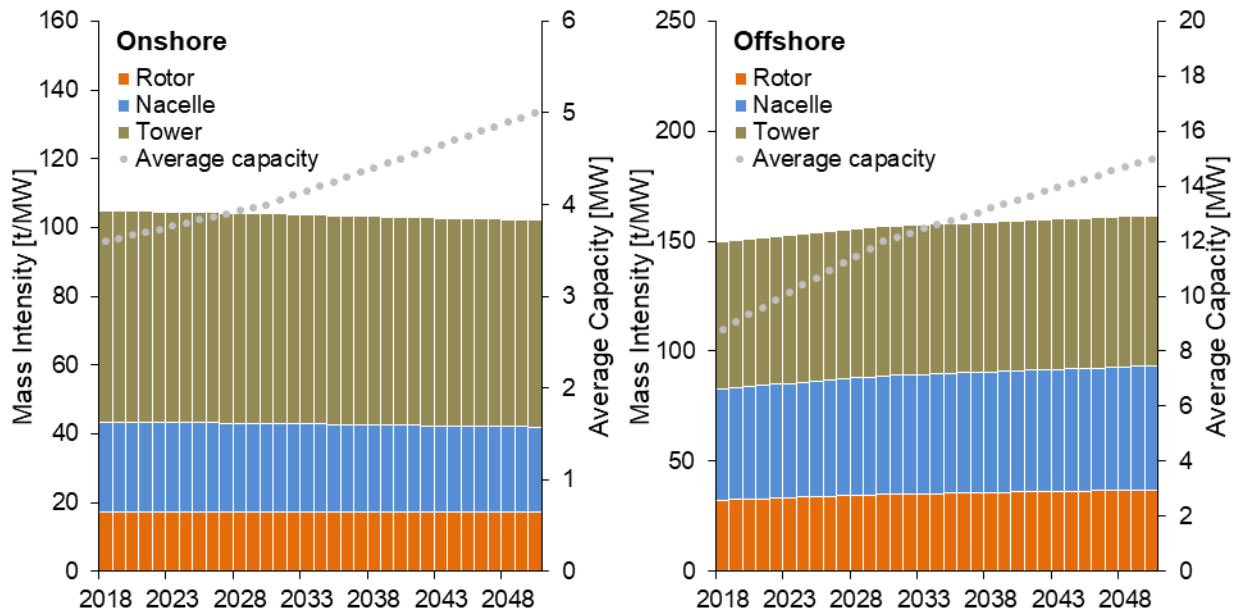


Figure S2. Mass intensities of wind turbine components corresponding to the average capacity of wind turbines over time. Note: mass presented here only includes three components, i.e., rotor, nacelle, and tower.

4. Material intensities of wind energy systems

We collected 20 LCA reports conducted by Vesta Sustainability, which can be accessed via the following link: <https://www.vestas.com/en/about/sustainability#!available-reports>.

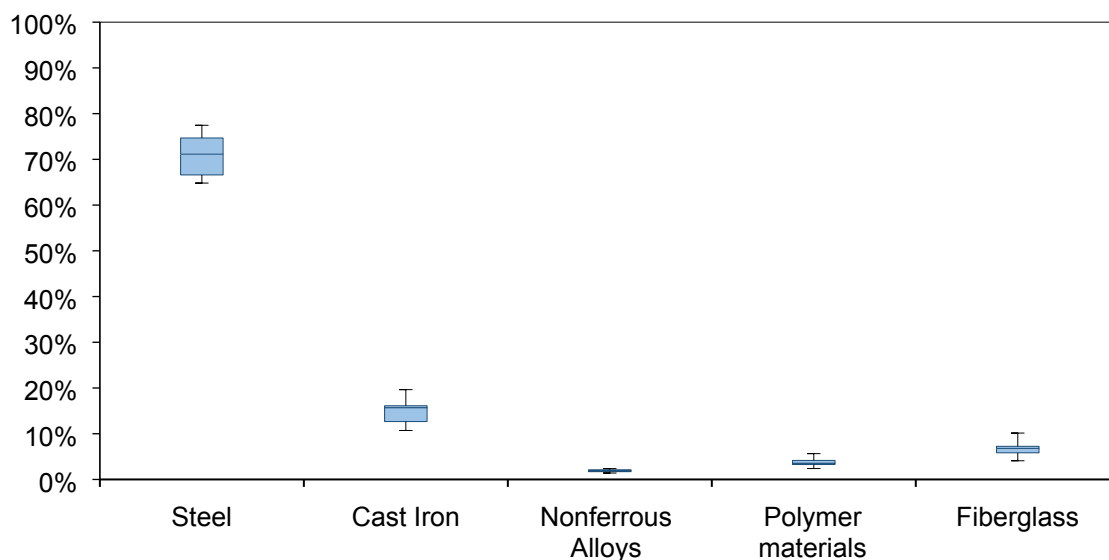


Figure S3. Material compositions of a wind turbine per se.

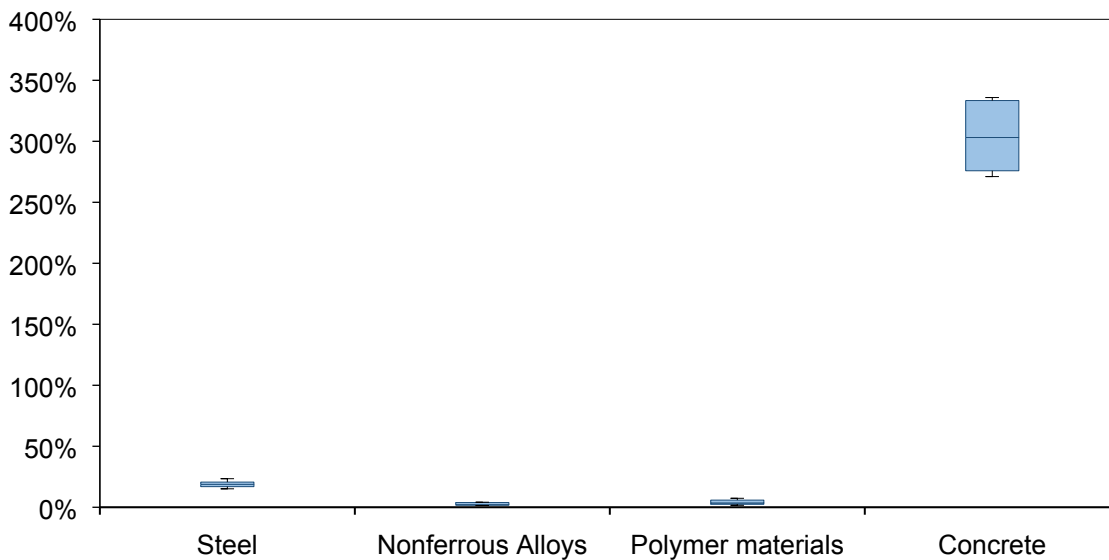


Figure S4. Material compositions of other parts of wind energy systems relative to the materials used in wind turbines.

Table S3. Neodymium intensity and dysprosium intensity used in previous studies.

kg/MW	Nd%	Dy%	kg/MW	kg/MW	Reference
650	27.0%	3.0%	0.176	0.020	An assessment of U.S. rare earth availability for supporting U.S. wind energy growth targets ¹
560	29.0%	2.0%	0.162	0.011	Material Flows Resulting from Large Scale Deployment of Wind Energy in Germany ²
571.4	29.0%	2.0%	0.166	0.011	
566.7	29.0%	2.0%	0.164	0.011	
400	31.0%	5.5%	0.124	0.022	Critical materials strategy 2010 ³
600	31.0%	5.5%	0.186	0.033	
800	27.0%		0.216		Wind Energy in the United States and Materials Required for the Land-Based Wind Turbine Industry From 2010 Through 2030 ⁴
642	30.8%	4.5%	0.198	0.029	Can a dysprosium shortage threaten green energy technologies? ⁵
600	30.0%	4.0%	0.180	0.024	
600	31.0%	5.0%	0.186	0.030	Byproduct metal requirements for U.S. wind and solar photovoltaic electricity generation up to the year 2040 under various Clean Power Plan scenarios ⁶
400	29%	3.0%	0.116	0.012	
			0.1704	0.0203	Average (used for material intensities in 2017)
			0.119	0.014	70% of the 2017 level ⁷ (used for material intensities in 2050)

5. Survival curves of lifetime extension

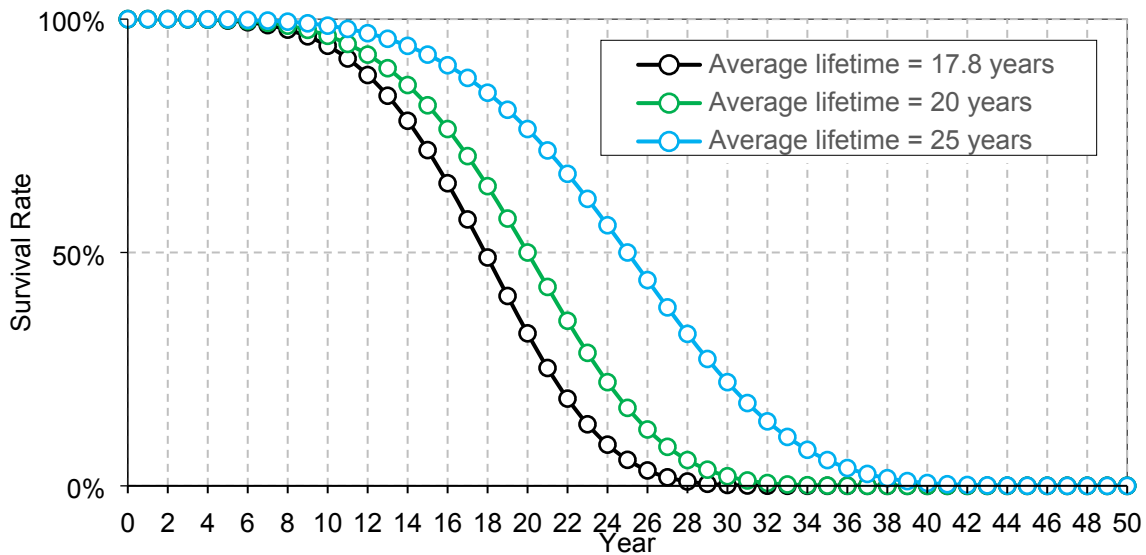


Figure S5. Survival curve of the lifetime function when average lifetime is 17.8 years, 20 years, or 25 years. Note: A survival curve presents the probability that previously installed turbines reach their lifetime, and thus average lifetime represents the duration between the time point when turbines were installed and the time point when half of them are still functioning. Based on the baseline lifetime

function (average lifetime = 17.8 years), we generated new curves for two lifetime extension scenarios (20 years and 25 years), by adjusting the scale parameter of lifetime function while keeping the shape parameter unchanged. In a nutshell, the longer average lifetime is, the slower decommission of turbines is.

6. Impacts of increasing market share on dysprosium flows

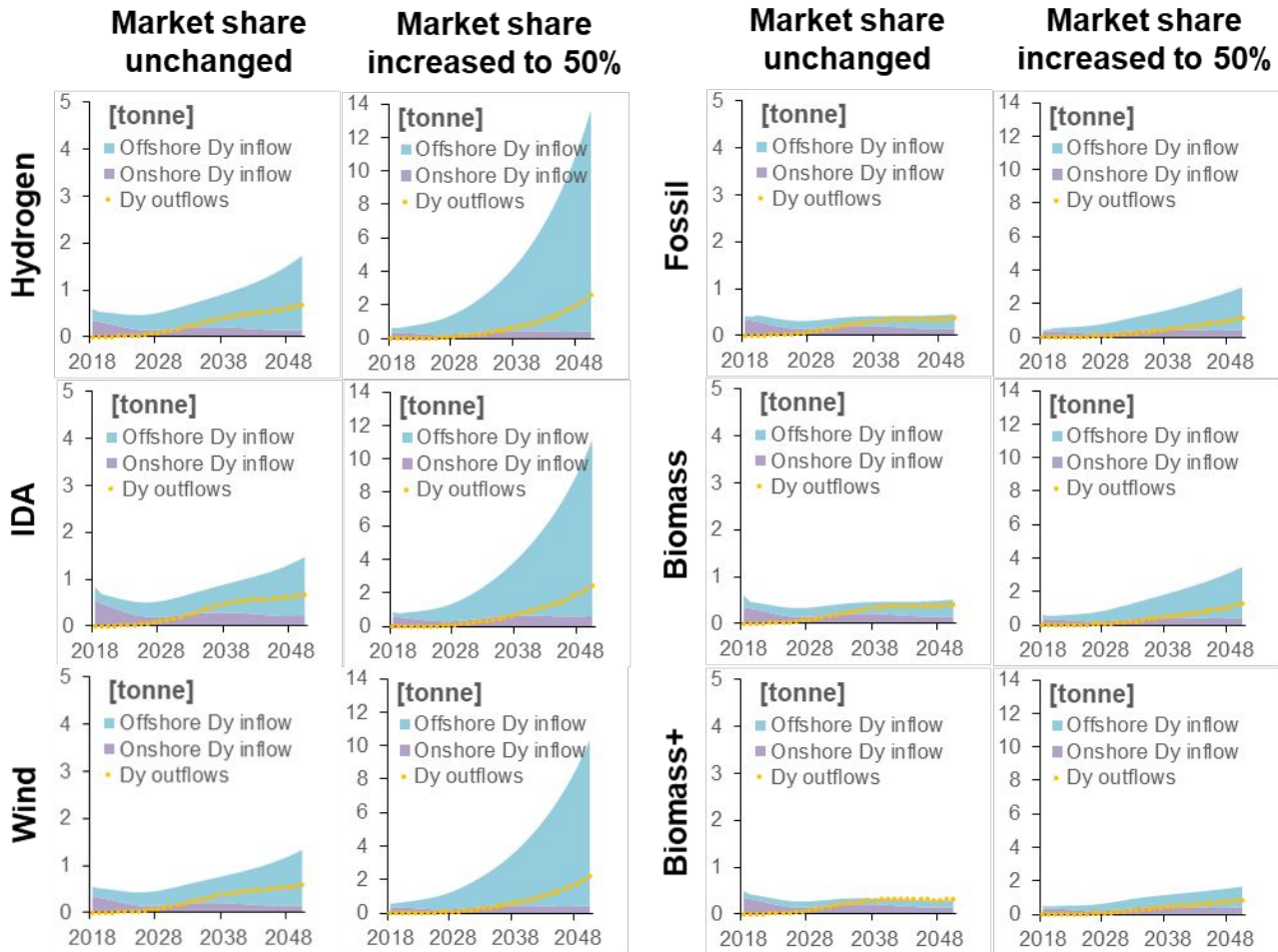
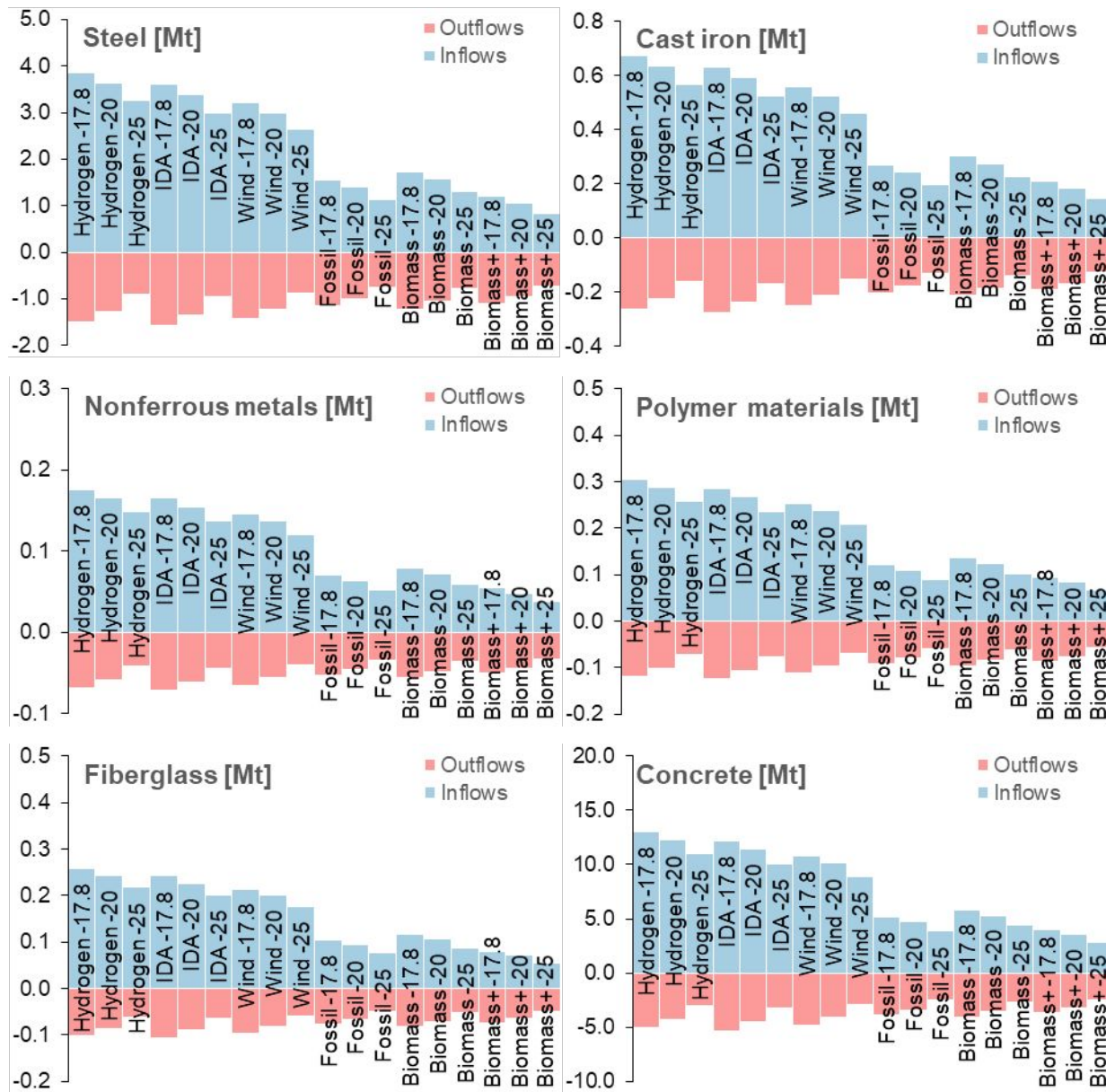


Figure S6. Impacts of increasing market share on annual dysprosium flows from 2018 to 2050.

7. Impacts of lifetime extension on material flows



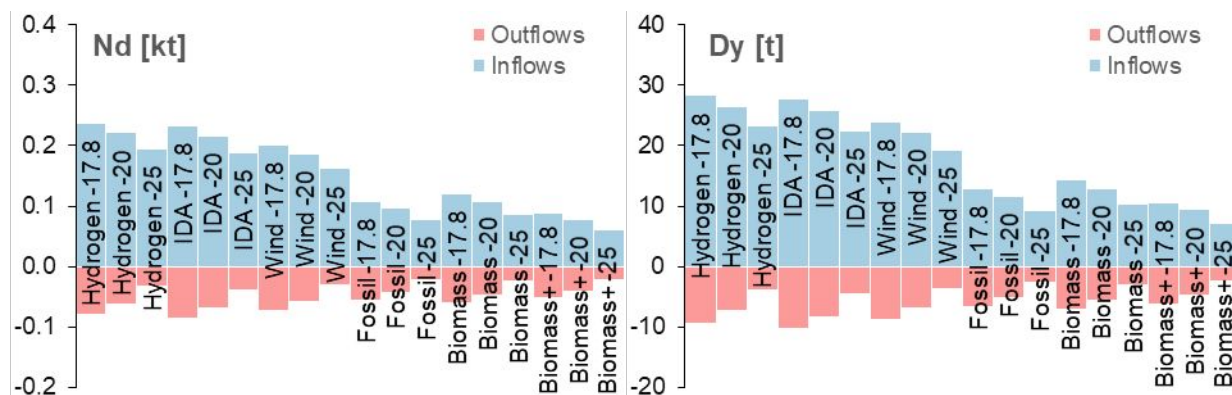


Figure S7. Impacts of lifetime extension on cumulative material flows during 2018-2050 in the *Hydrogen*, *IDA*, *Wind*, *Fossil*, *Biomass*, and *Biomass+* scenarios.

8. References cited in supporting information

- (1) Imholte, D. D.; Nguyen, R. T.; Vedantam, A.; Brown, M.; Iyer, A.; Smith, B. J.; Collins, J. W.; Anderson, C. G.; O'Kelley, B. An Assessment of U.S. Rare Earth Availability for Supporting U.S. Wind Energy Growth Targets. *Energy Policy* **2018**, *113*, 294–305. <https://doi.org/10.1016/j.enpol.2017.11.001>.
- (2) Zimmermann, T.; Rehberger, M.; Gößling-Reisemann, S. Material Flows Resulting from Large Scale Deployment of Wind Energy in Germany. *Resources* **2013**, *2* (3), 303–334. <https://doi.org/10.3390/resources2030303>.
- (3) Sandalow, D.; Bauer, D.; Diamond, D.; Li, J.; McKittrick, M.; Telleen, P. Critical Materials Strategy. *US Department of Energy, USA* **2010**.
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- (6) Nassar, N. T.; Wilburn, D. R.; Goonan, T. G. Byproduct Metal Requirements for U.S. Wind and Solar Photovoltaic Electricity Generation up to the Year 2040 under Various Clean Power Plan Scenarios. *Applied Energy* **2016**, *183*, 1209–1226. <https://doi.org/10.1016/j.apenergy.2016.08.062>.
- (7) Fishman, T.; Graedel, T. E. Impact of the Establishment of US Offshore Wind Power on Neodymium Flows. *Nature Sustainability* **2019**. <https://doi.org/10.1038/s41893-019-0252-z>.