

A Dynamic Function for the **E**nergy **R**eturn **o**n **I**nvestment (EROI) of Wind Energy

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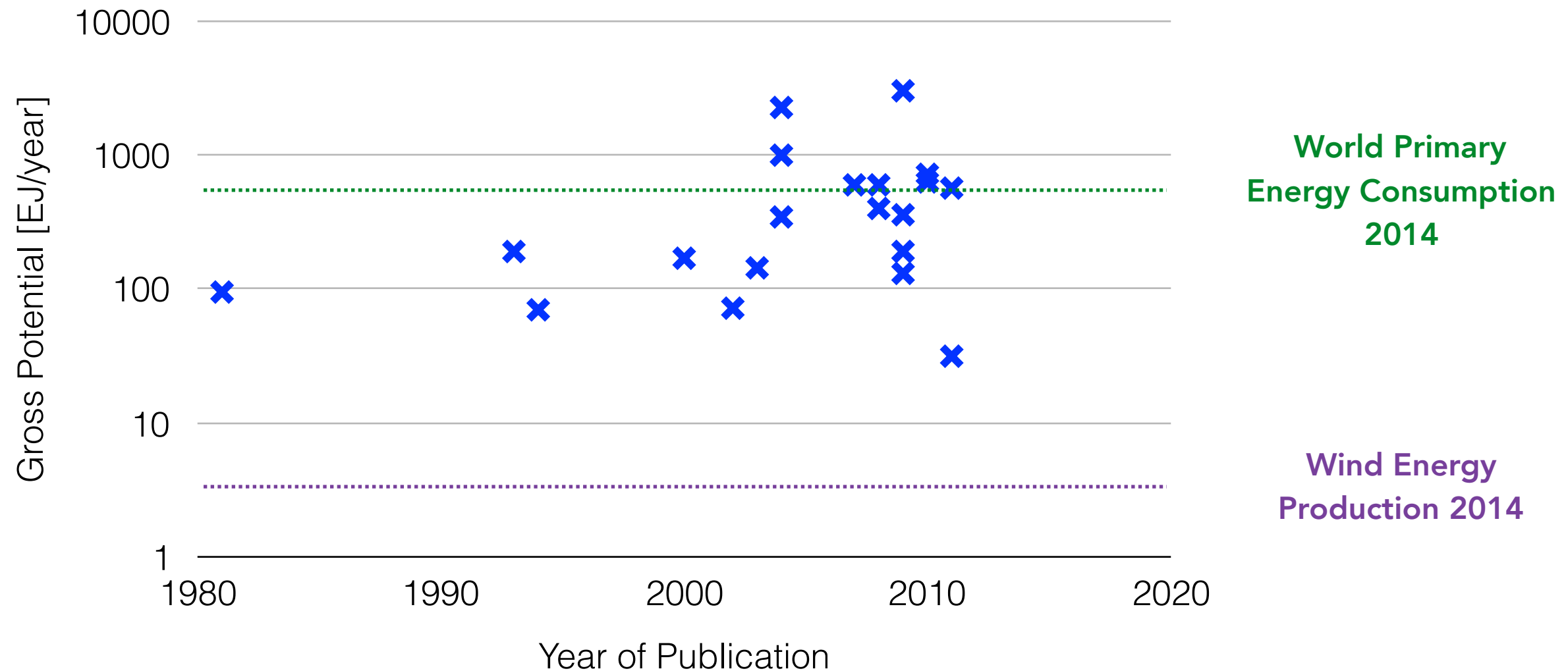
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2. Centre for Environmental Policy, Faculty of Natural Science, Imperial College London
3. Institute for Integrated Economic Research, London

Wind Energy Science Conference 2017, Copenhagen



What is the global potential of wind energy ?

Global wind potential estimates:

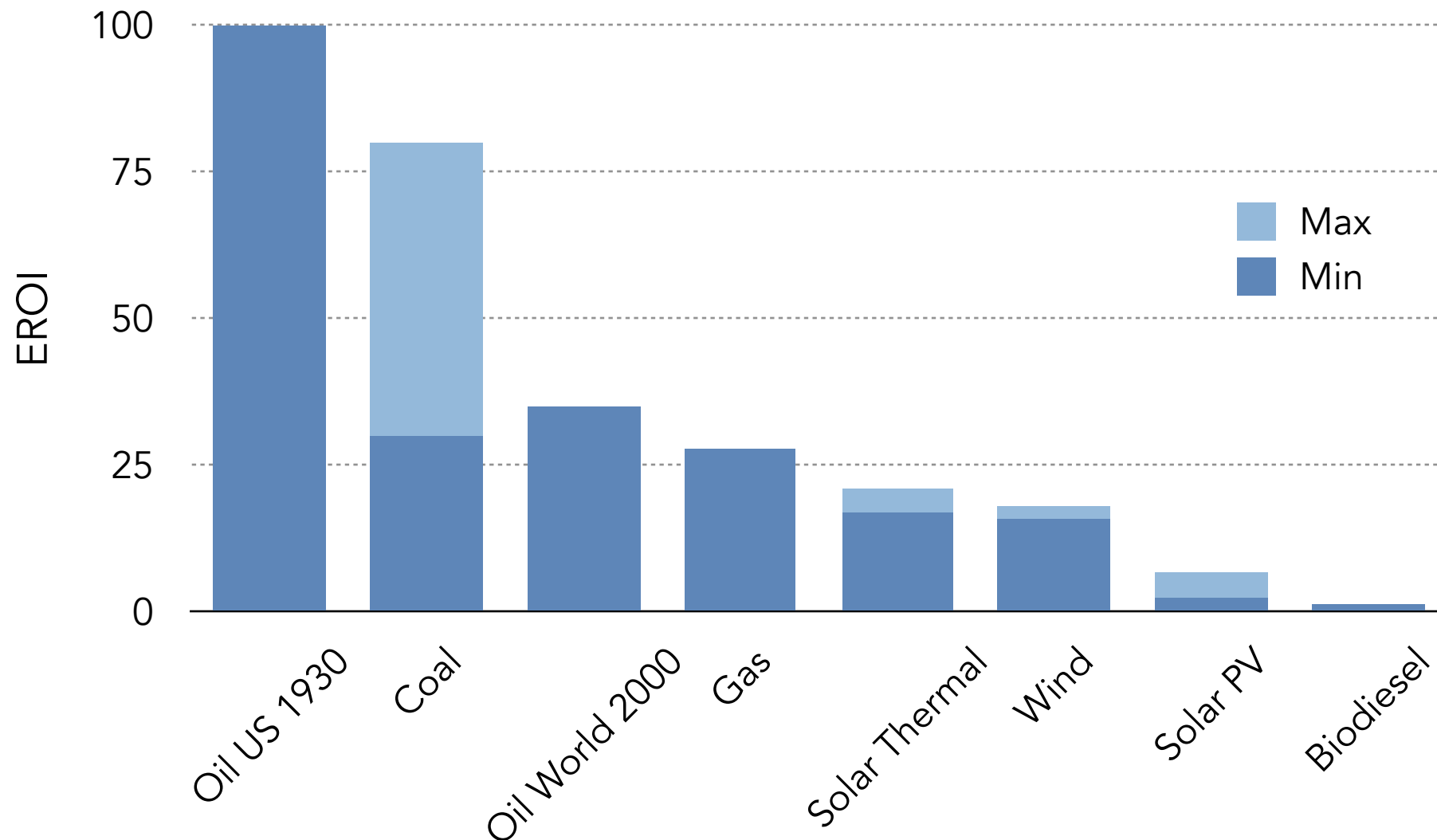


Physical limits are often overlooked !

Net Energy fuels society

Net Energy = Energy Produced - Energy Invested

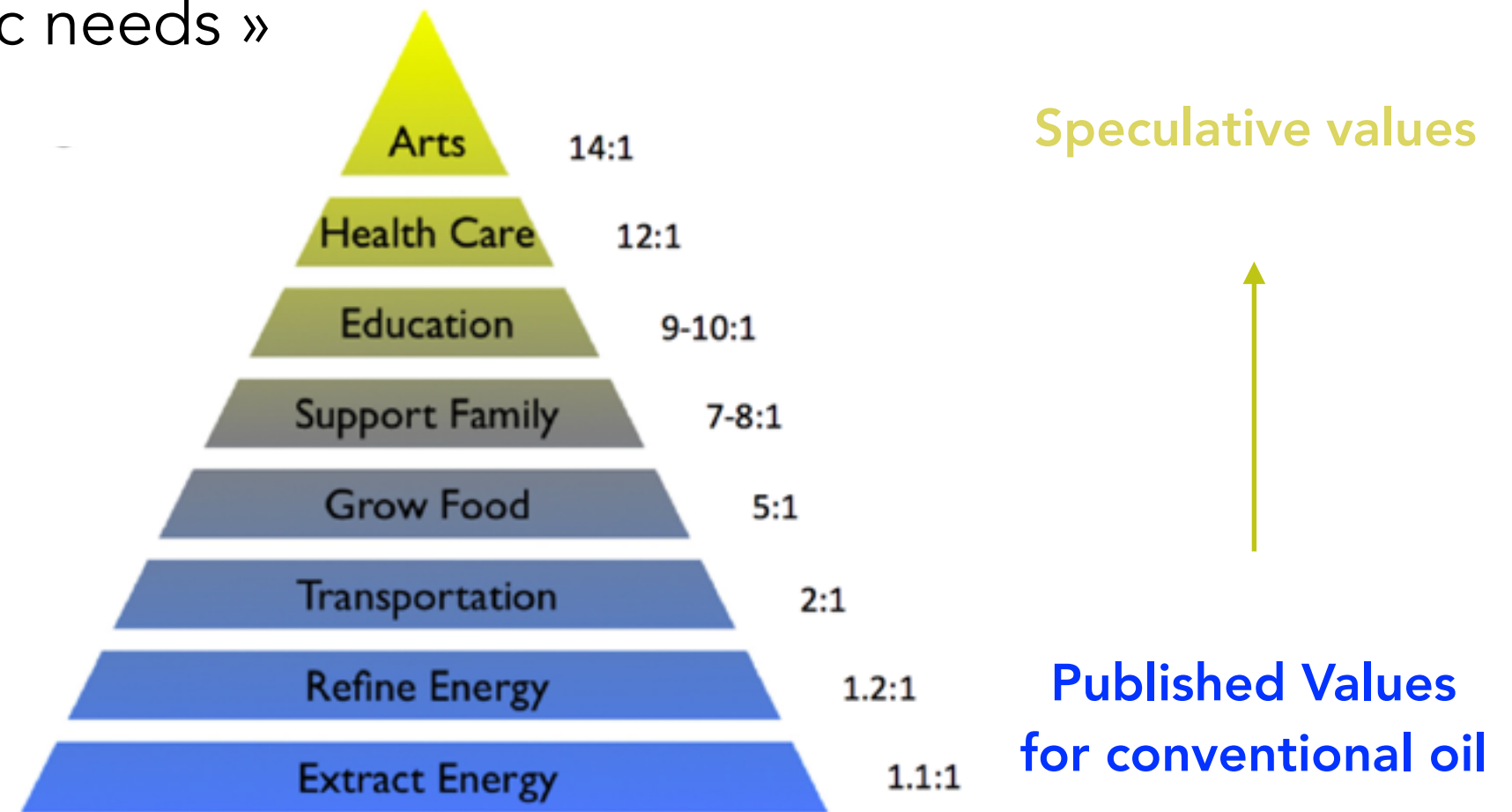
Energy Return on Investment: EROI = $\frac{\text{Energy Produced}}{\text{Energy Invested}}$



Data from: Year in review—EROI or energy return on (energy) invested, Murphy D. & Hall C.

Minimum EROI to sustain living standards

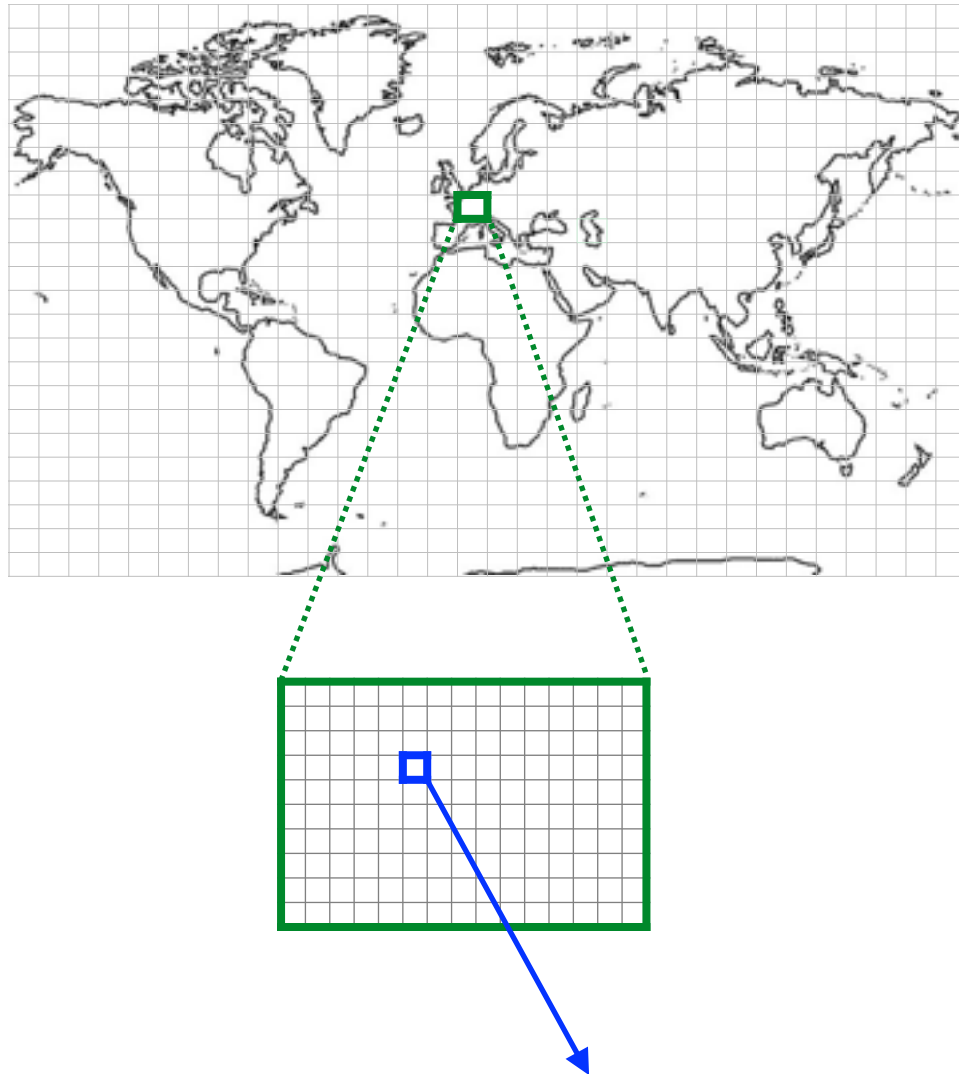
Society's Hierarchy
of « energetic needs »



Energy, EROI and quality of life, Lambert et al., 2014

Importance to assess the amount of net energy
and the associated EROI !

What is the EROI of wind energy and how will it evolve ?



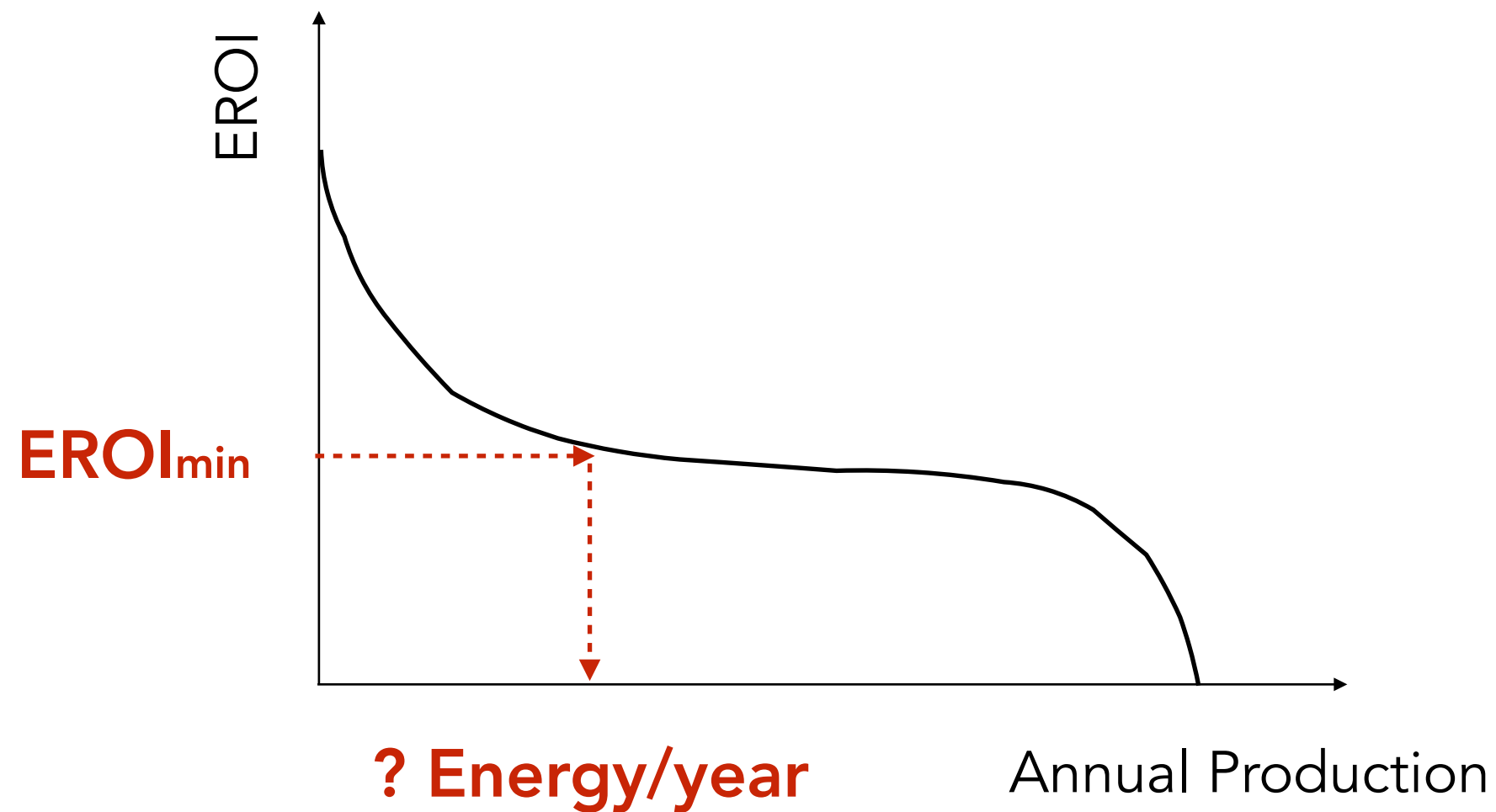
Grid-cell approach

Mesh resolution : $0.75^\circ \times 0.75^\circ = 115.200$ cells

Average cell size $\sim 4.000 \text{ km}^2$

- Calculate theoretical net potential and associated EROI in **each cell**
- Constraint the results with energy conservation in ABL

Dynamic Function: EROI vs Annual Production



Global wind potential calculation: Grid-cell approach

1. Energy Outputs

- *Land Use Constraints*
- *Capacity Factor Calculation*
- *Wind Farm Efficiency*

2. Energy Inputs

- *Life cycle analysis*

3. Exergy analysis

- *Energy Conservation in Atmospheric Boundary Layer*

4. Net Energy Maximisation

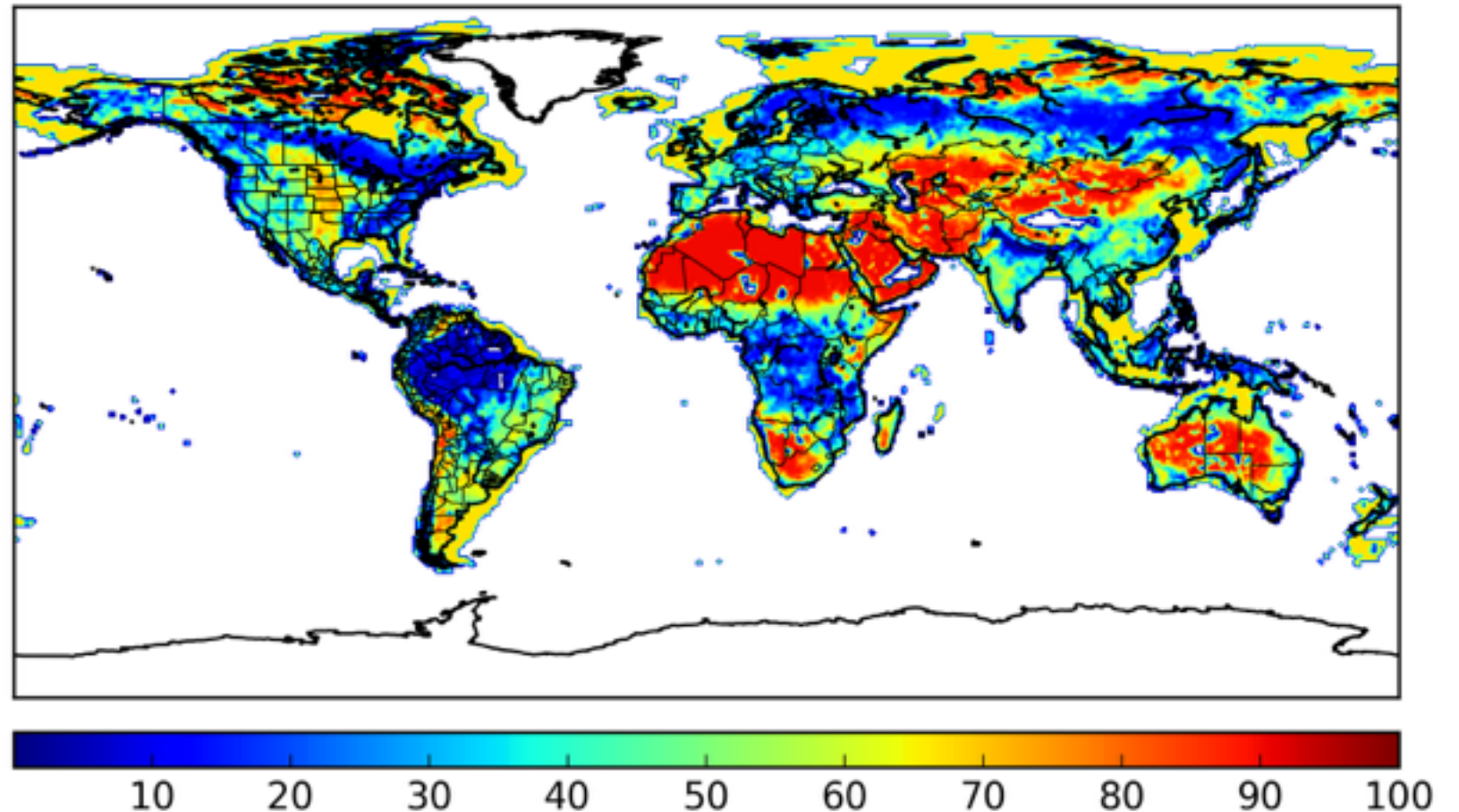
Land Use Constraints

To take into account technical and geographical constraints :
a **suitability factor** is associated to each cell

Land cover repartition
(% forests, agricultural
lands, etc)

% Protected areas

Water depth,
distance to shore



Suitability Factor = Proportion of the cell's area
available for wind turbine installation

Capacity Factor Calculation

$$C_F = \frac{\bar{P}_{\text{Generated}}}{P_{\text{Rated}}} = \frac{1}{P_R} \int_0^{\infty} f(v) P(v) dv$$

$f(v) \sim \text{Weibull}(k, c)$

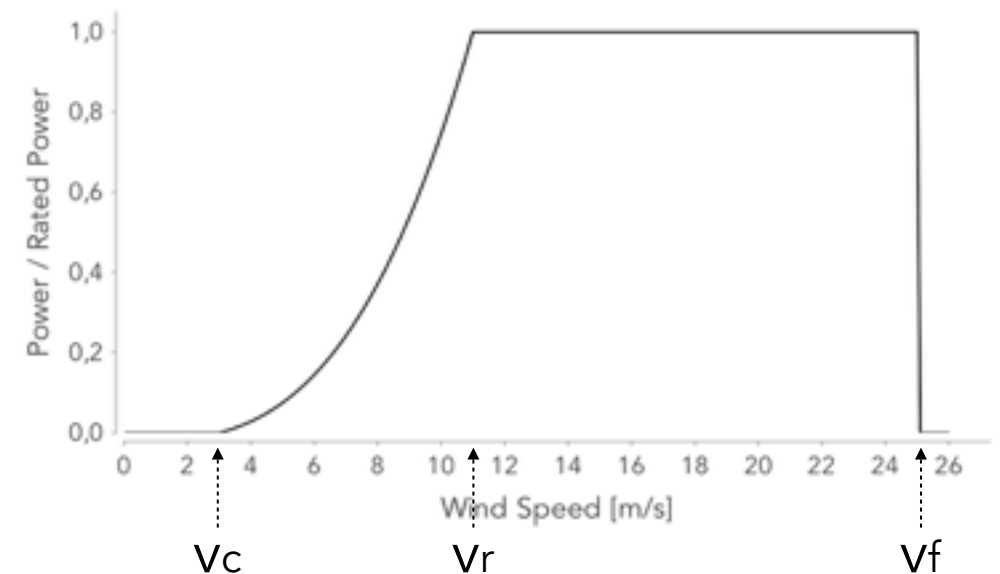
With:

$$k = \left(\frac{\sigma}{\bar{v}} \right)^{-1.086}$$

$$c = \frac{\bar{v}}{\Gamma(1 + 1/k)}$$

Mean $\bar{v}$ and standard deviation σ of wind speed estimated with 40 years of reanalysis data from ERA-Interim

Wind turbine power curve



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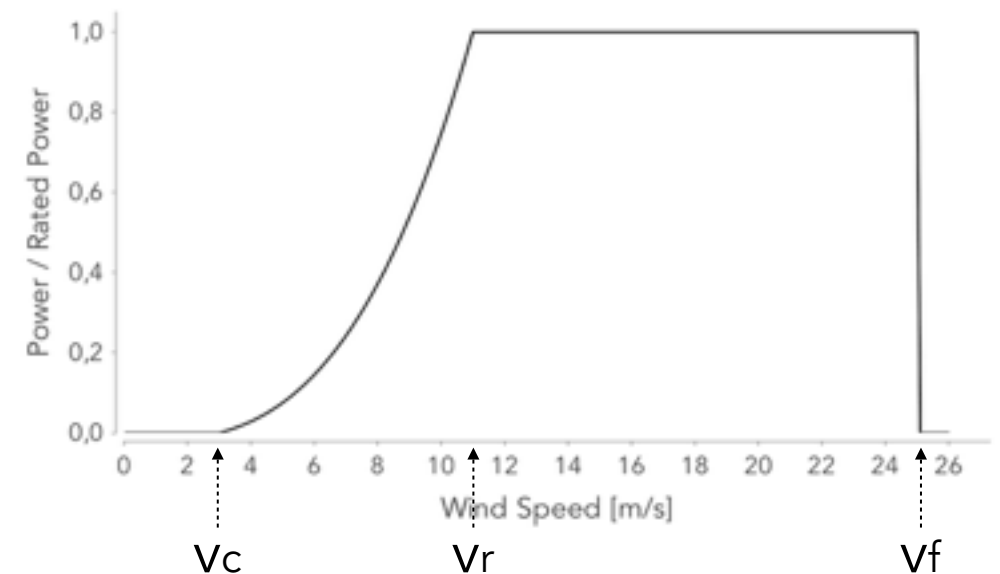
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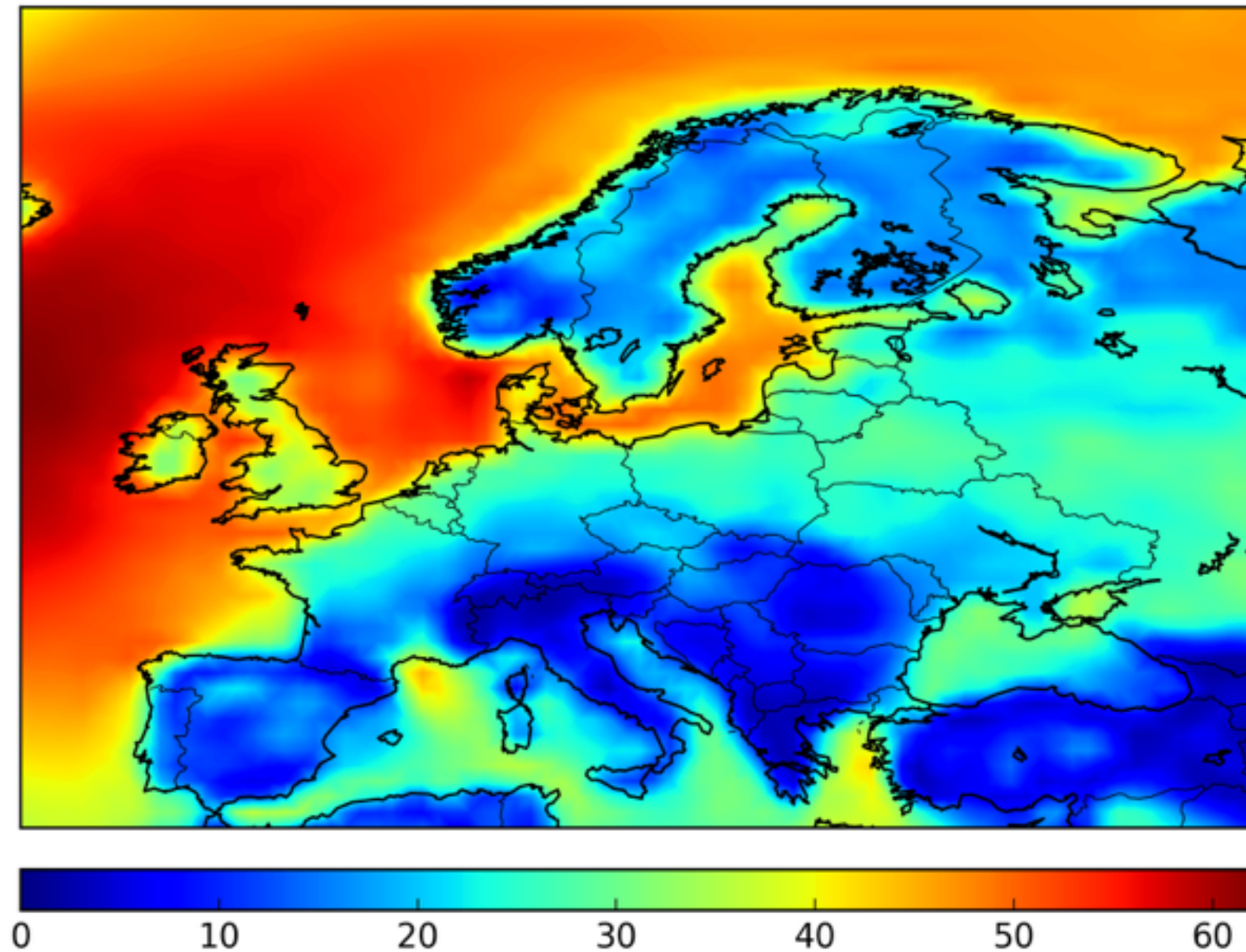
Wind turbine power curve



$$C_F = f(k, c, v_c, \mathbf{v_r}, v_f)$$

May be optimised !

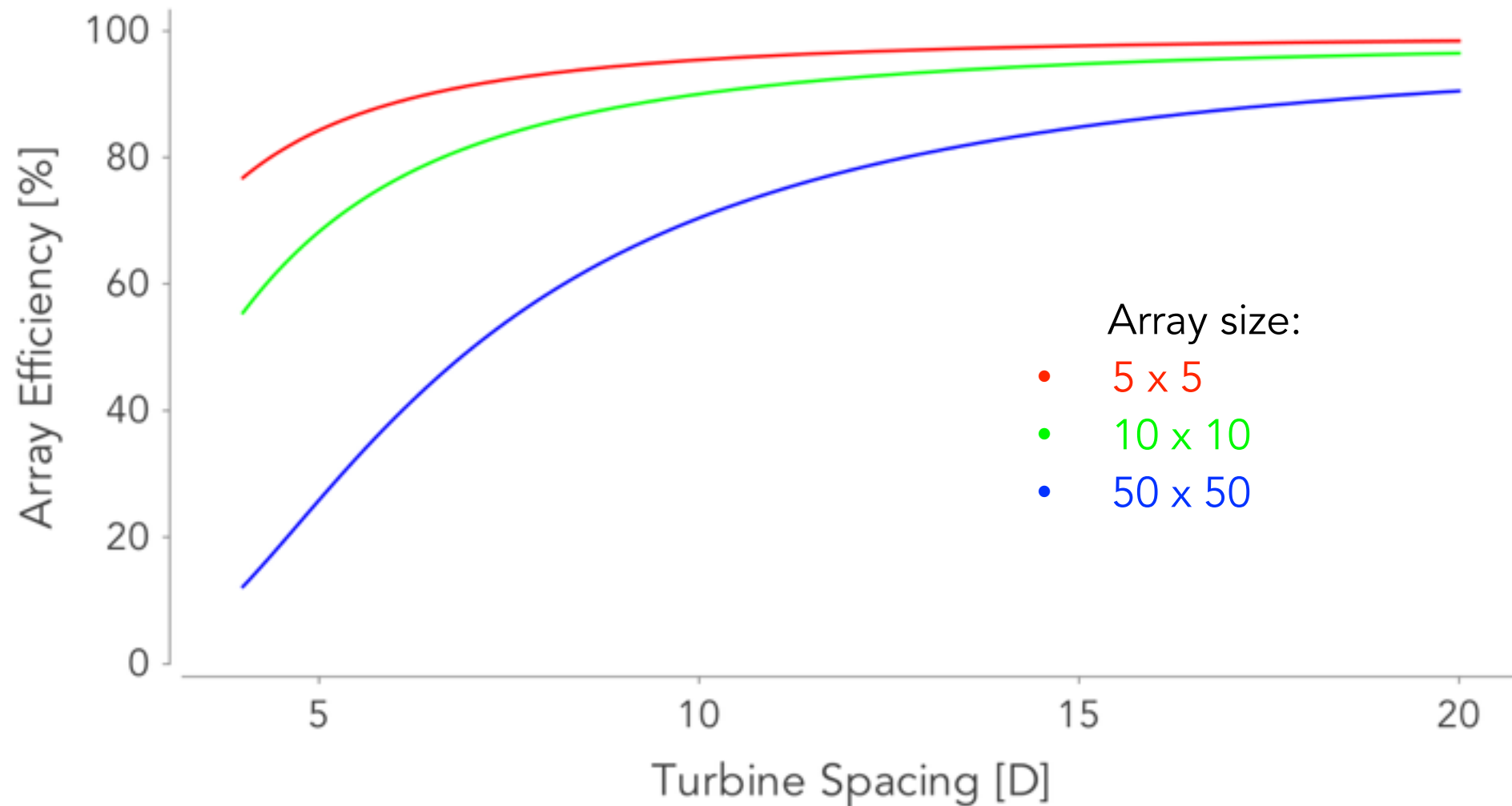
Capacity Factor Calculation



Capacity Factor [%]

Hub height = 125 m, $v_c = 3$ m/s, $v_r = 12$ m/s, $v_f = 25$ m/s

Wind Farm Efficiency



Extrapolation of data from : Limits To Wind Power Density, Gustavson, 1979

Global wind potential calculation: Grid-cell approach

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Average power generated for
a given installed capacity

2. Energy Inputs

- *Life cycle analysis*

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- *Energy Conservation in Atmospheric Boundary Layer*

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**Embodied Energy /
MW installed**

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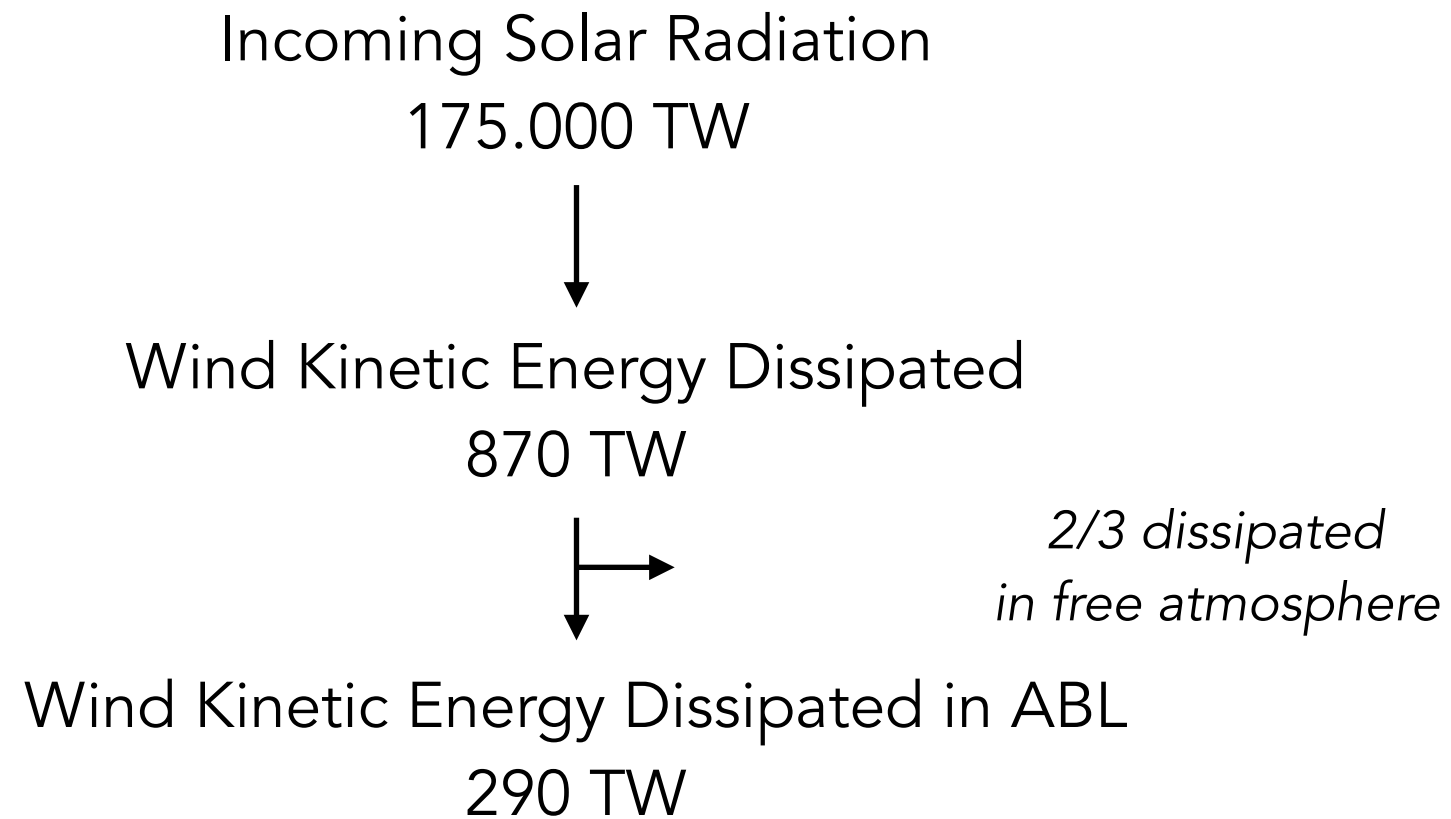
Embodied Energy /
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- ***Energy Conservation in Atmospheric Boundary Layer***

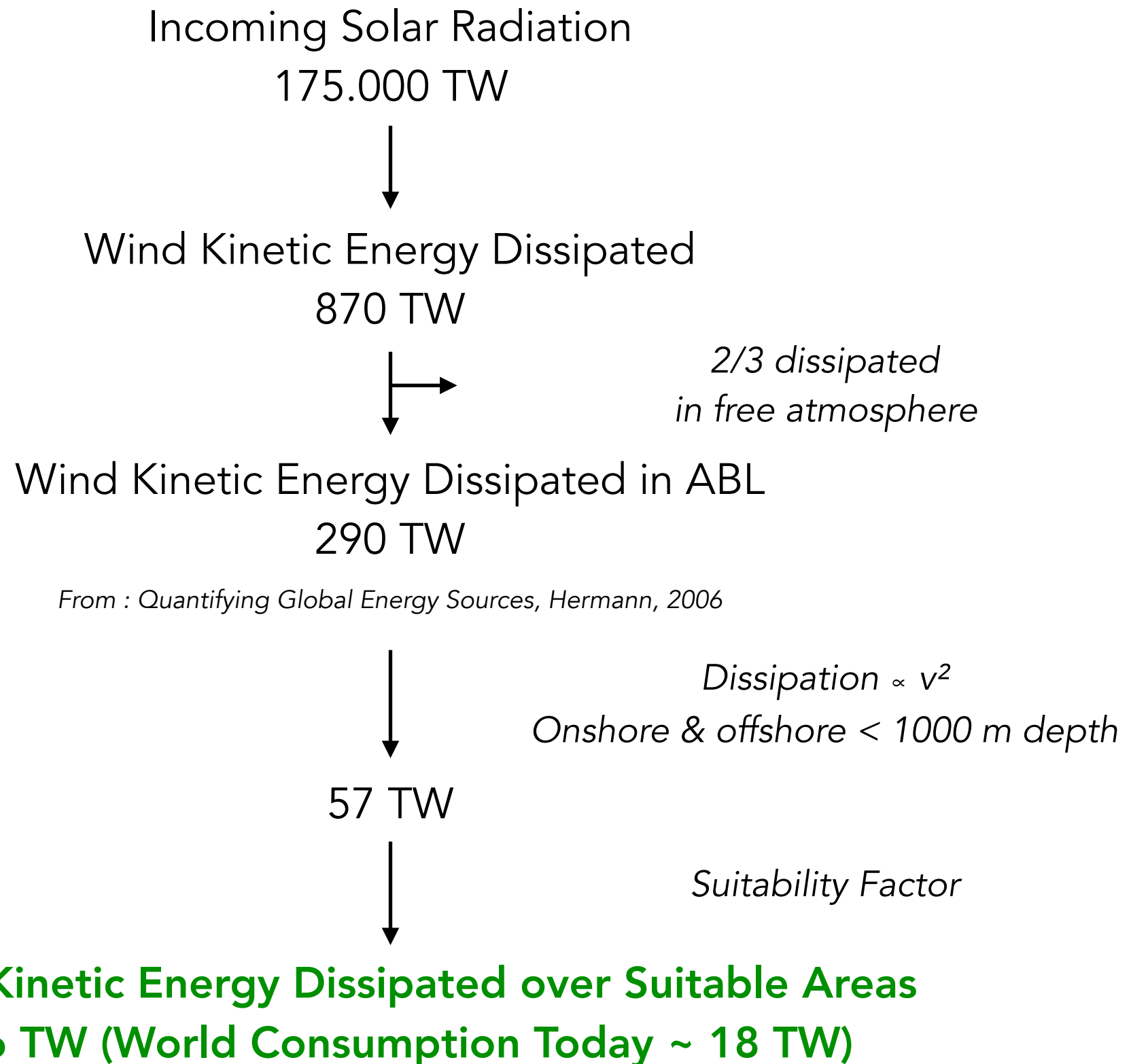
4. Net Energy Maximisation

Energy Conservation in ABL



From : Quantifying Global Energy Sources, Hermann, 2006

Energy Conservation in ABL



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Limit on Wind
Power Density

4. Net Energy Maximisation

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Limit on Wind
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4. Net Energy Maximisation

Net Energy Maximisation

In each cell find the optimal installed capacity, i.e. the optimal # of turbines, that satisfies:

Maximise Net Energy

$$= \text{Energy Outputs} - \text{Energy Inputs}$$

$\swarrow$
Installed Capacity * CF * η

$\searrow$
Embodied Energy(Installed Capacity)
+ Operational Energy(Energy Outputs)

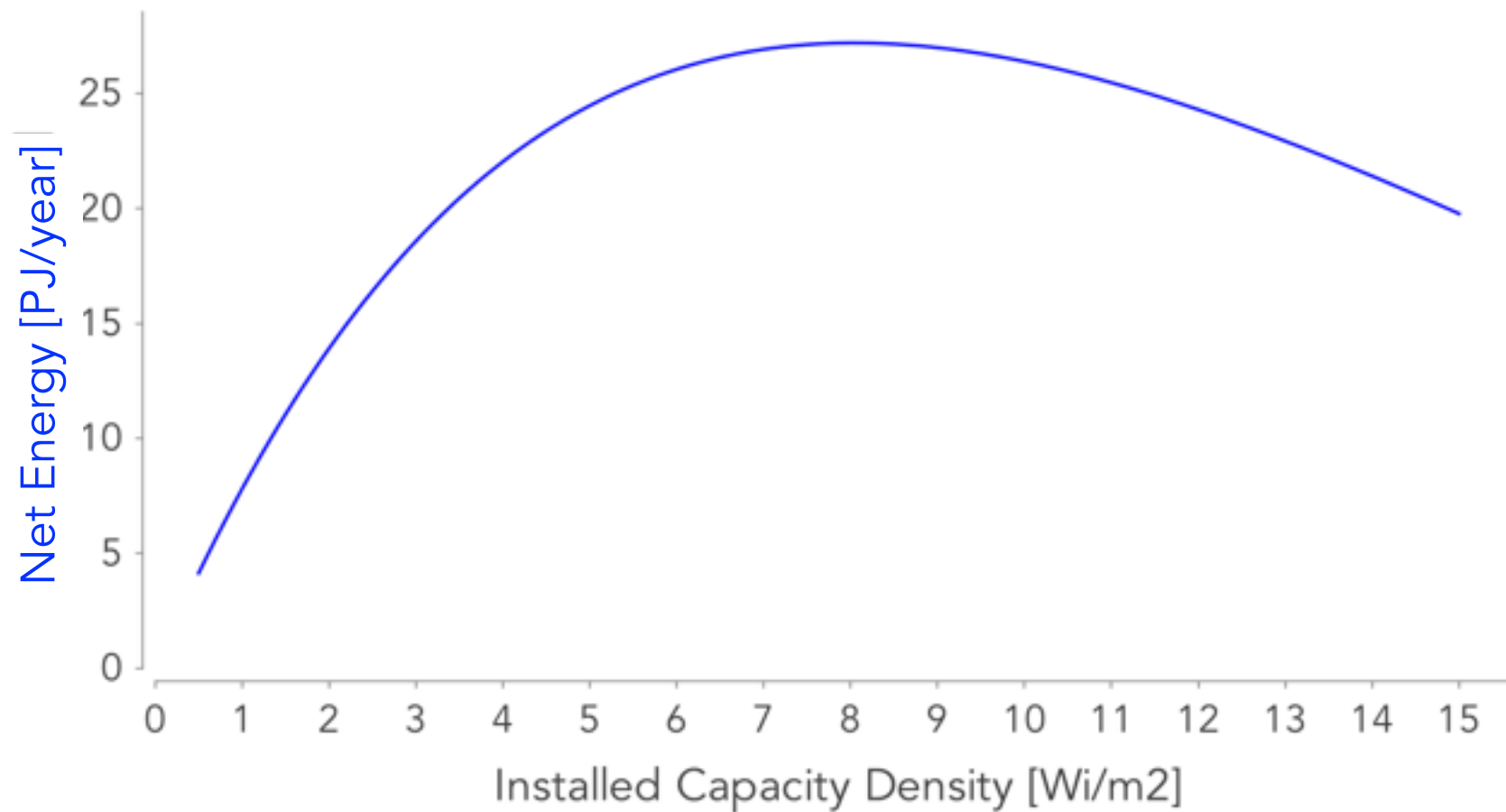
With constraints:

- Energy Outputs $\leq$ Available Kinetic Energy
- EROI $\geq$ EROI_{min}

Net Energy Maximisation

Example :

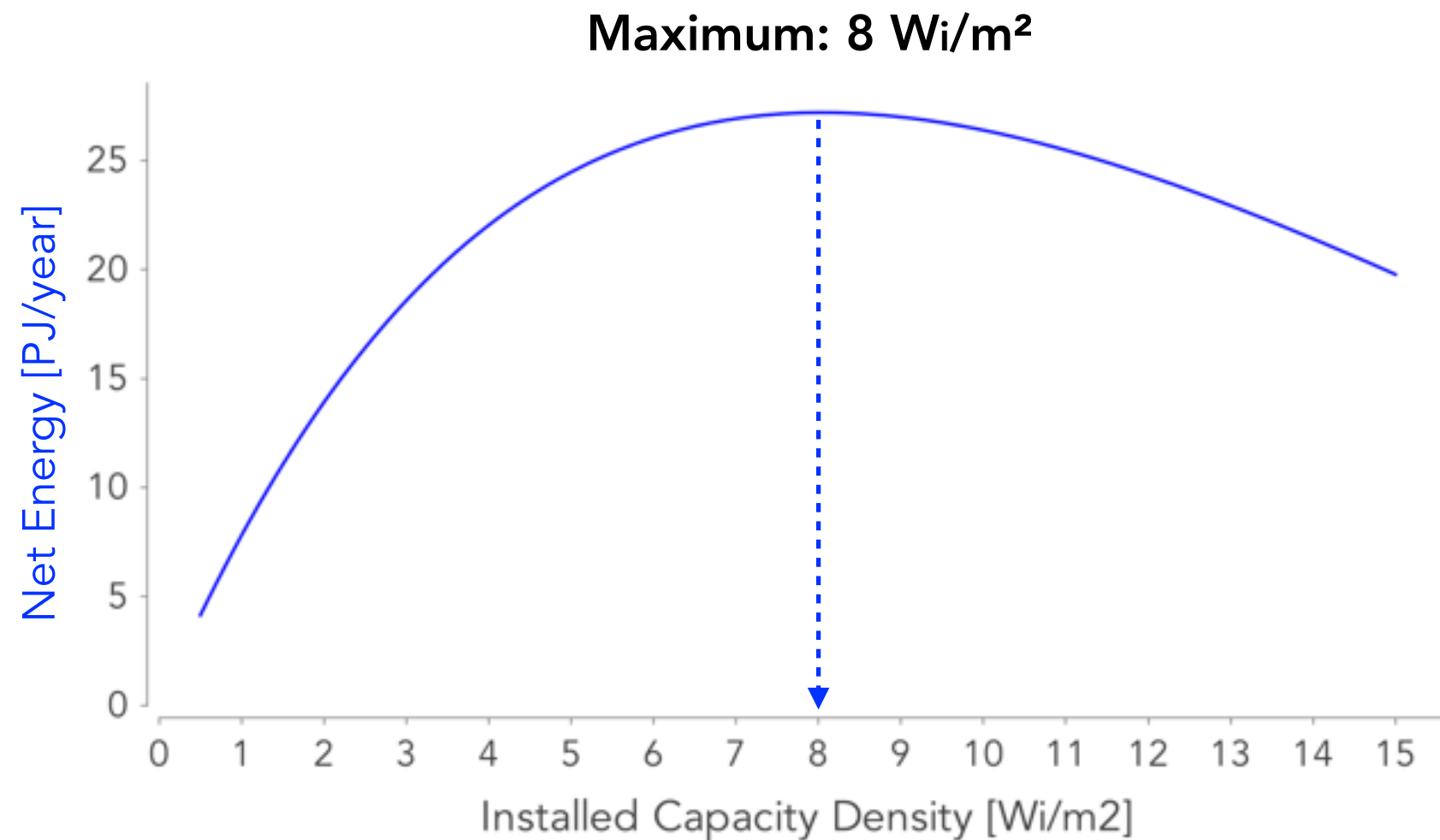
- Onshore cell of 1.000 km²
- Capacity factor: 30 %
- Embodied Energy: 14.000 GJ/MW



Net Energy Maximisation

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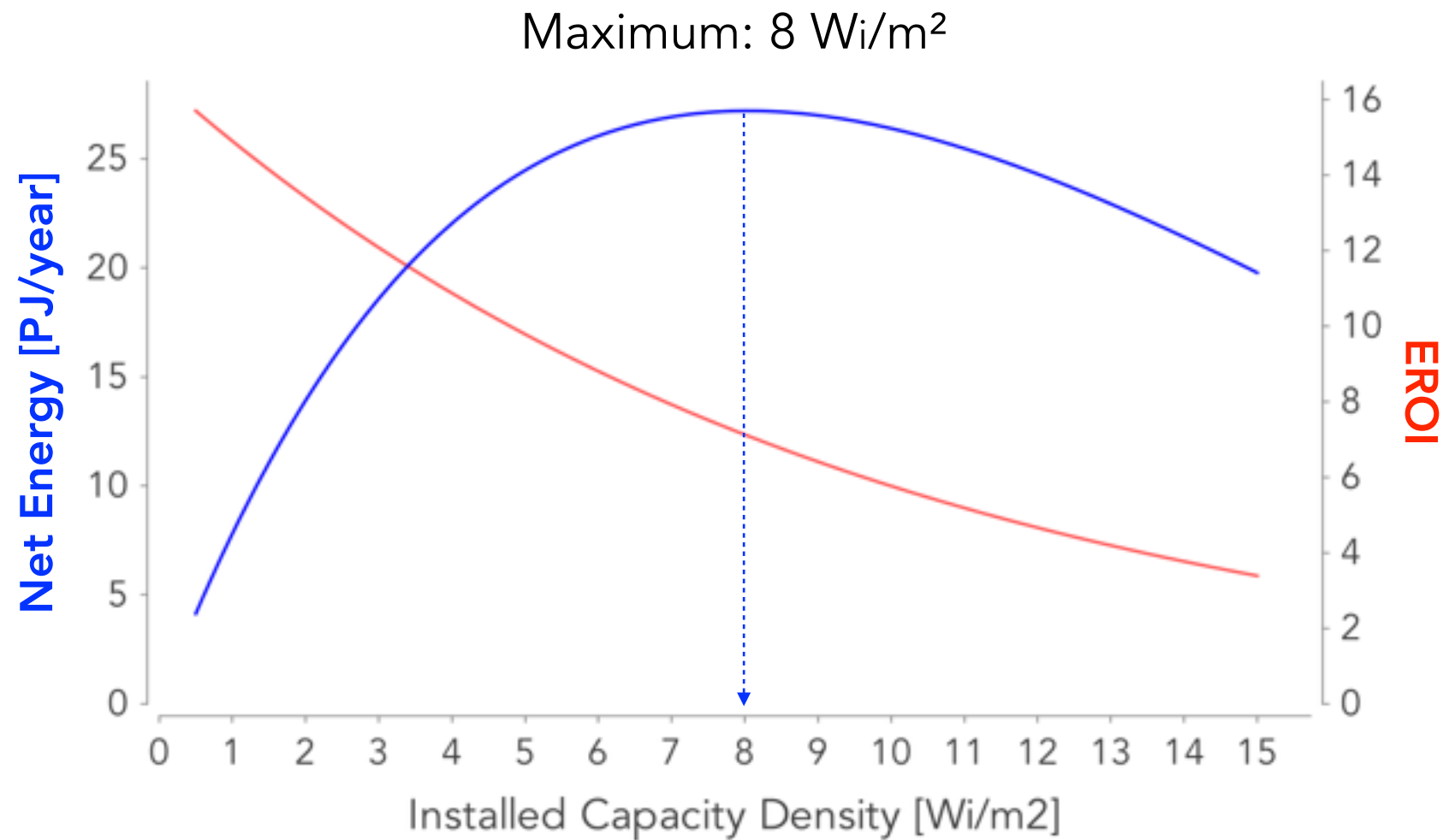
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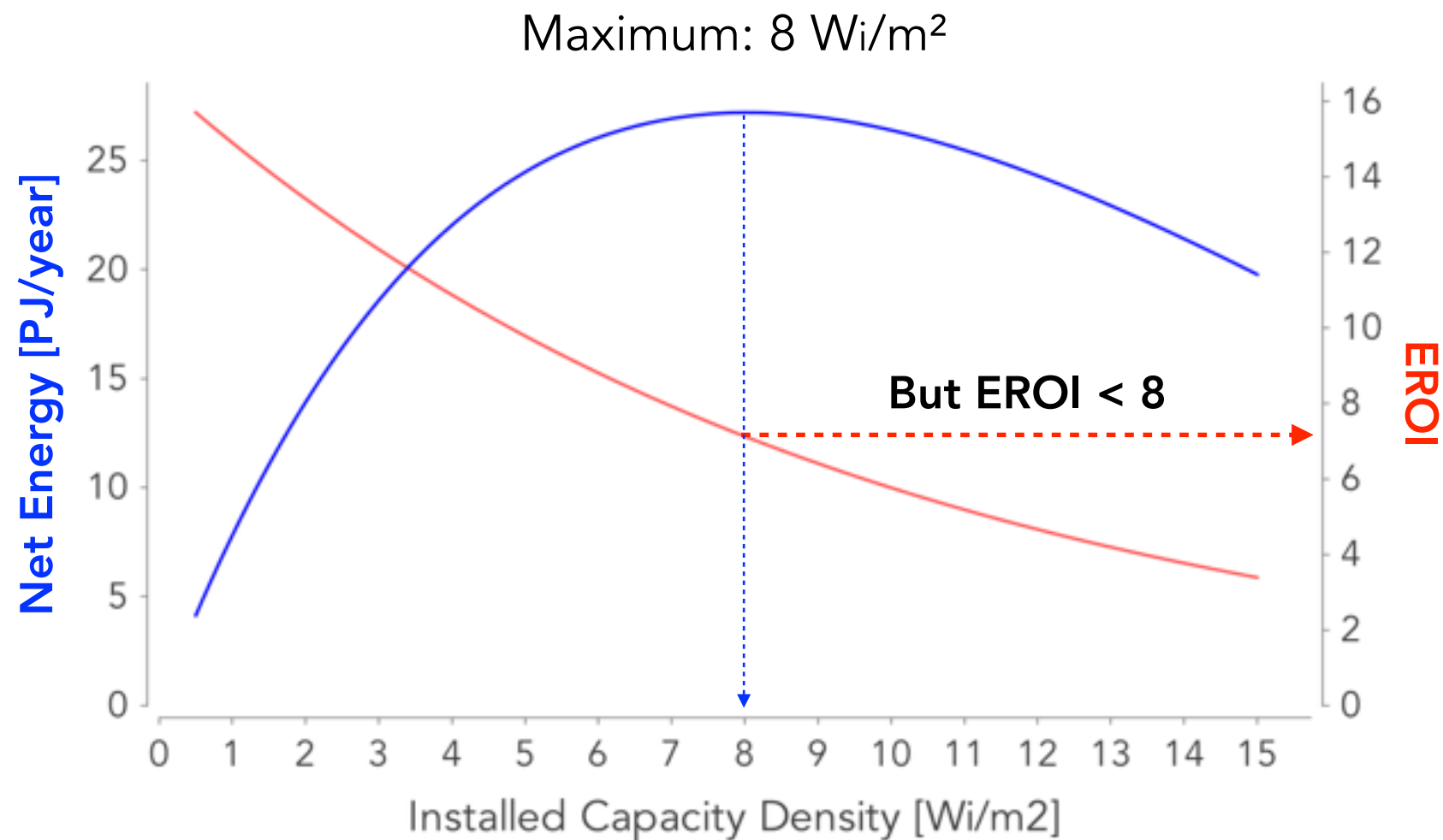
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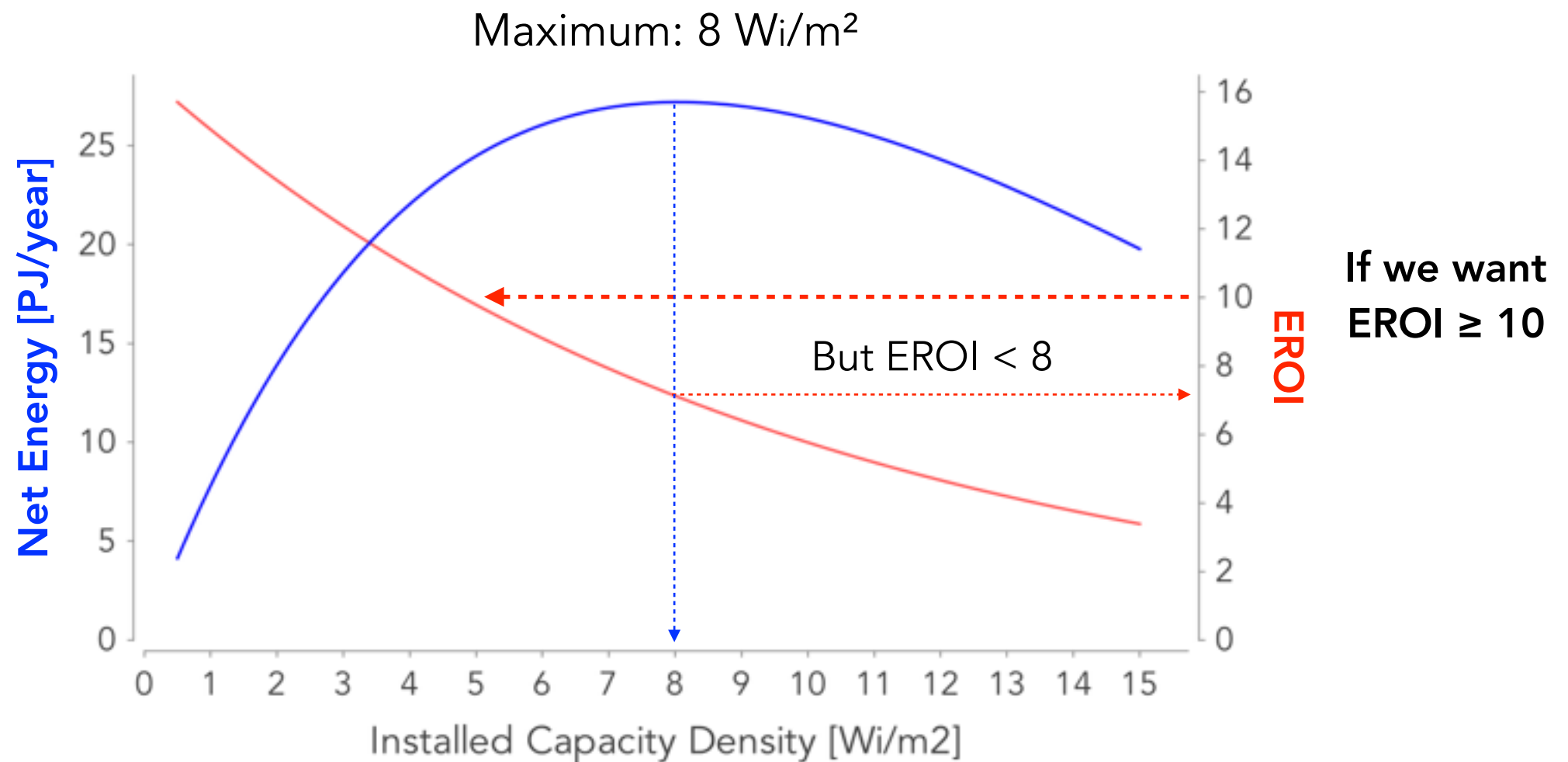
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Net Energy Maximisation

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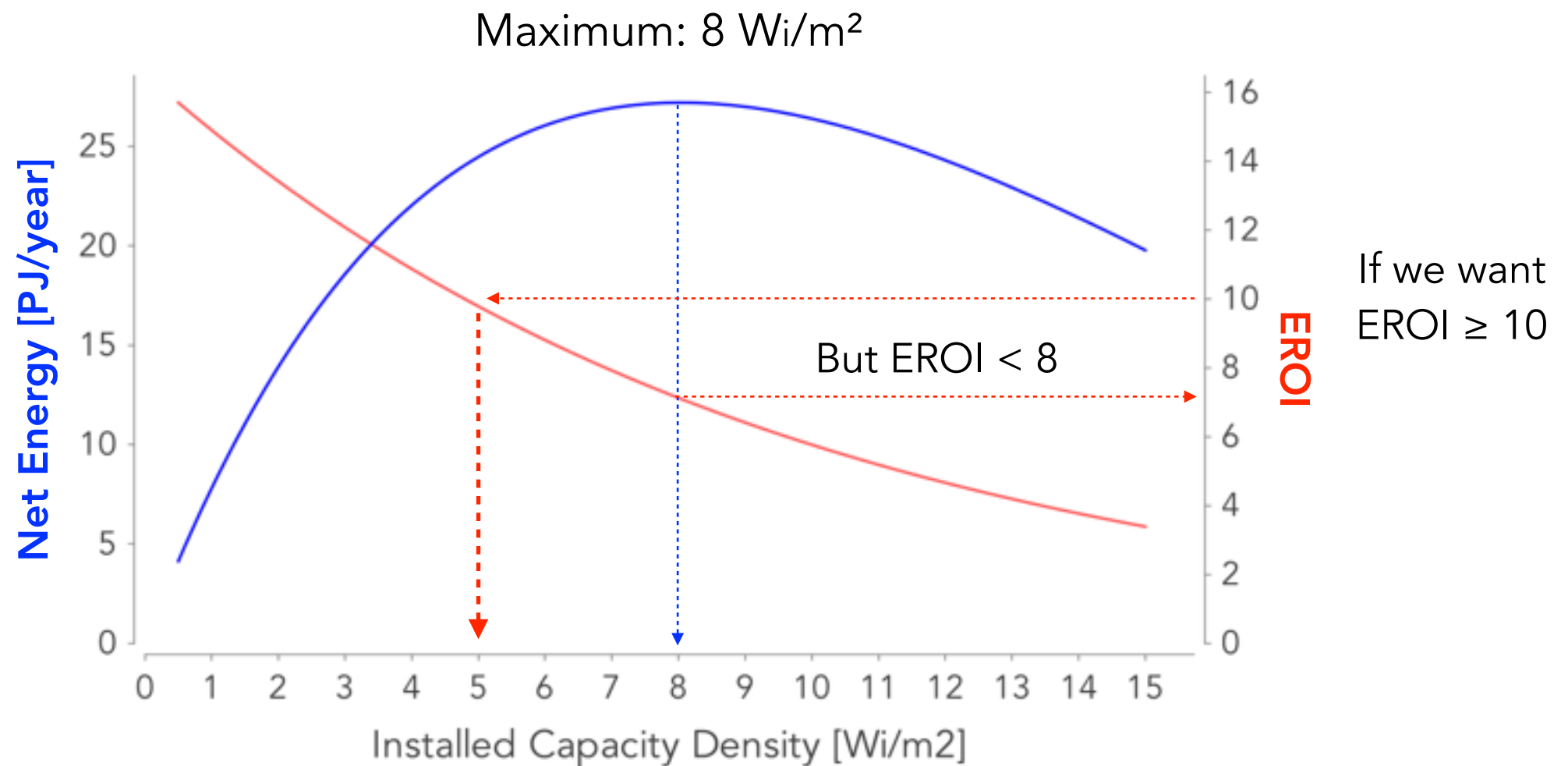
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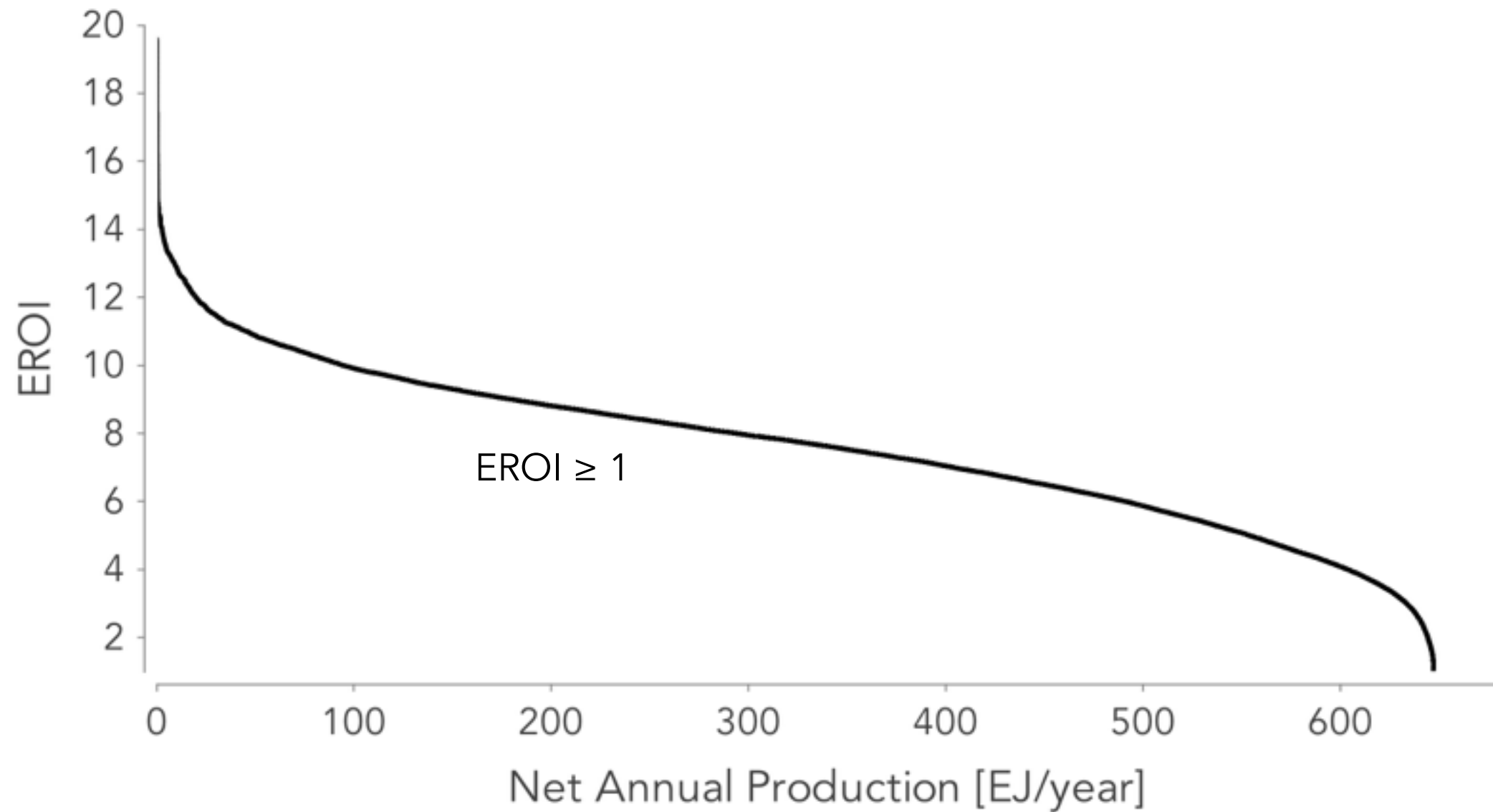
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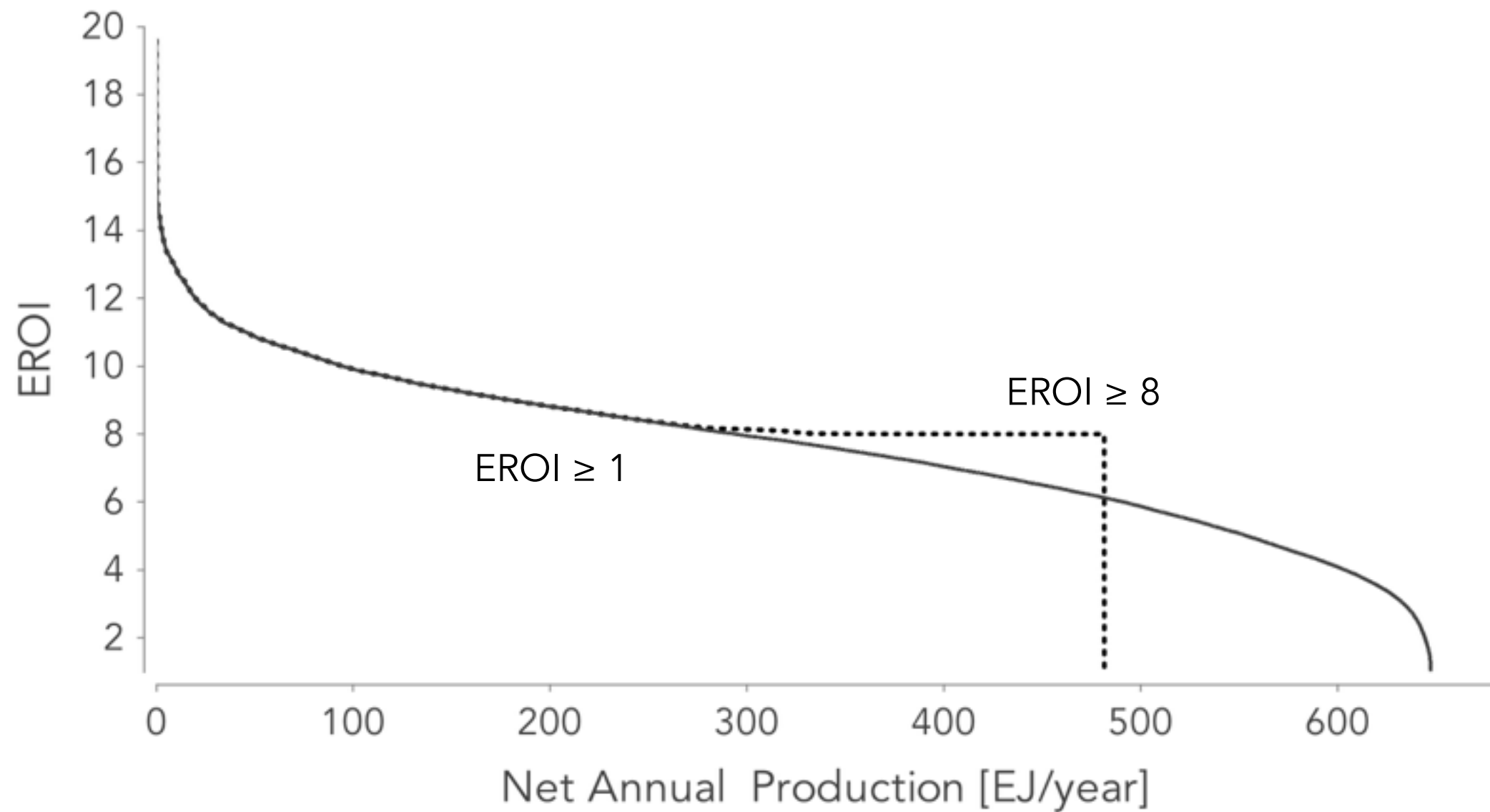


The optimal installed capacity is 5 Wi/m²

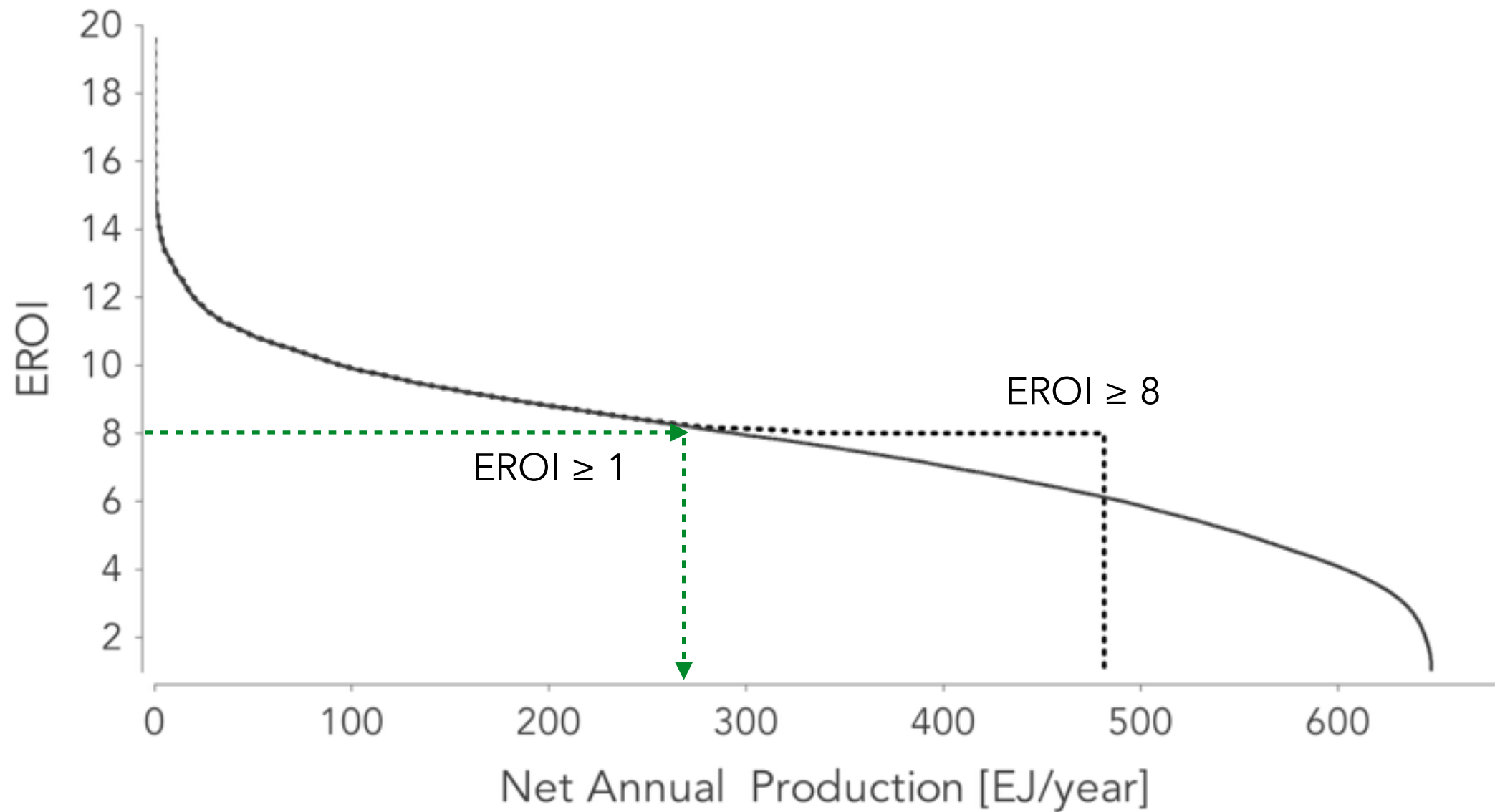
Net Energy Maximisation



Net Energy Maximisation

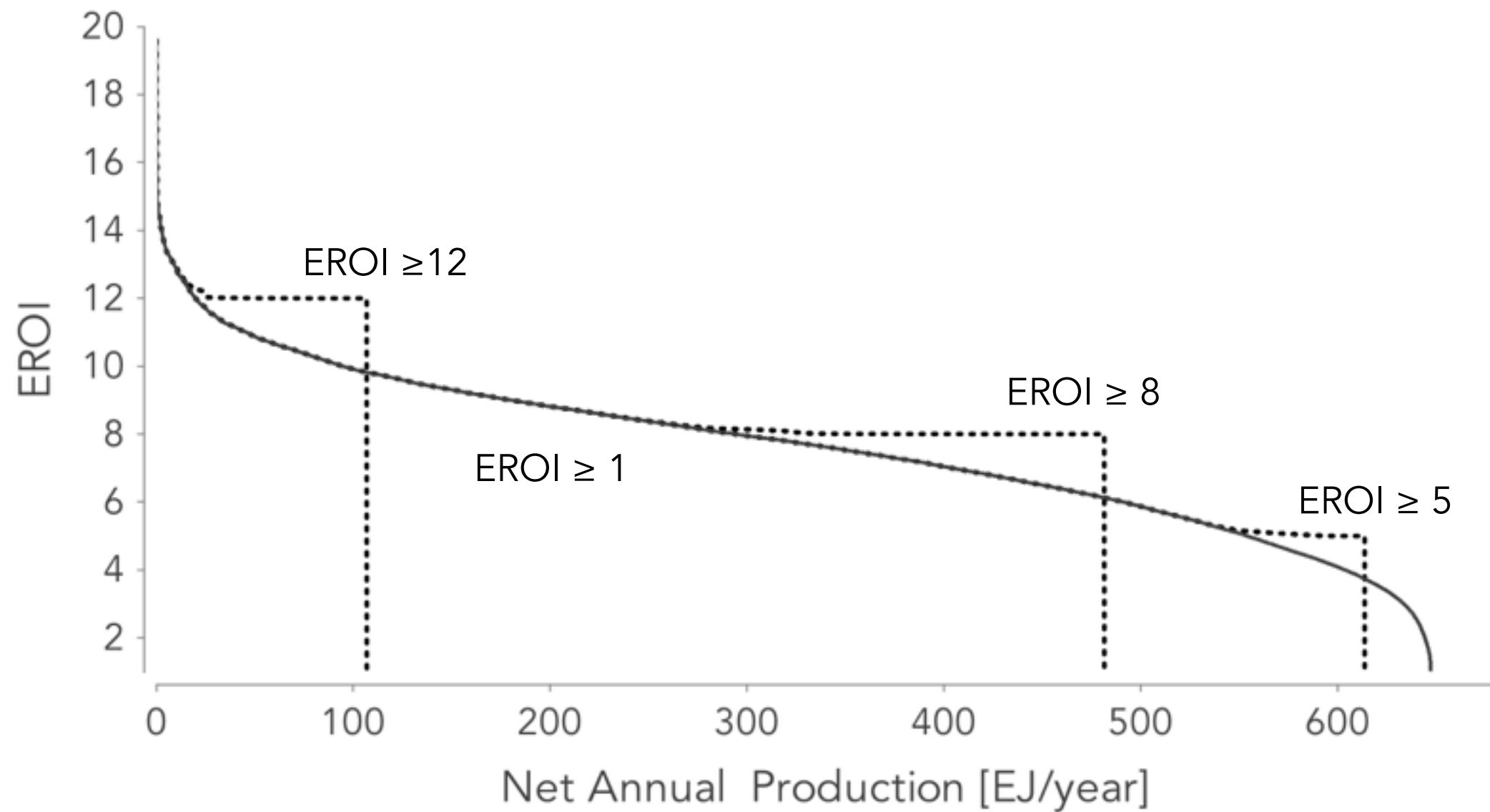


Net Energy Maximisation

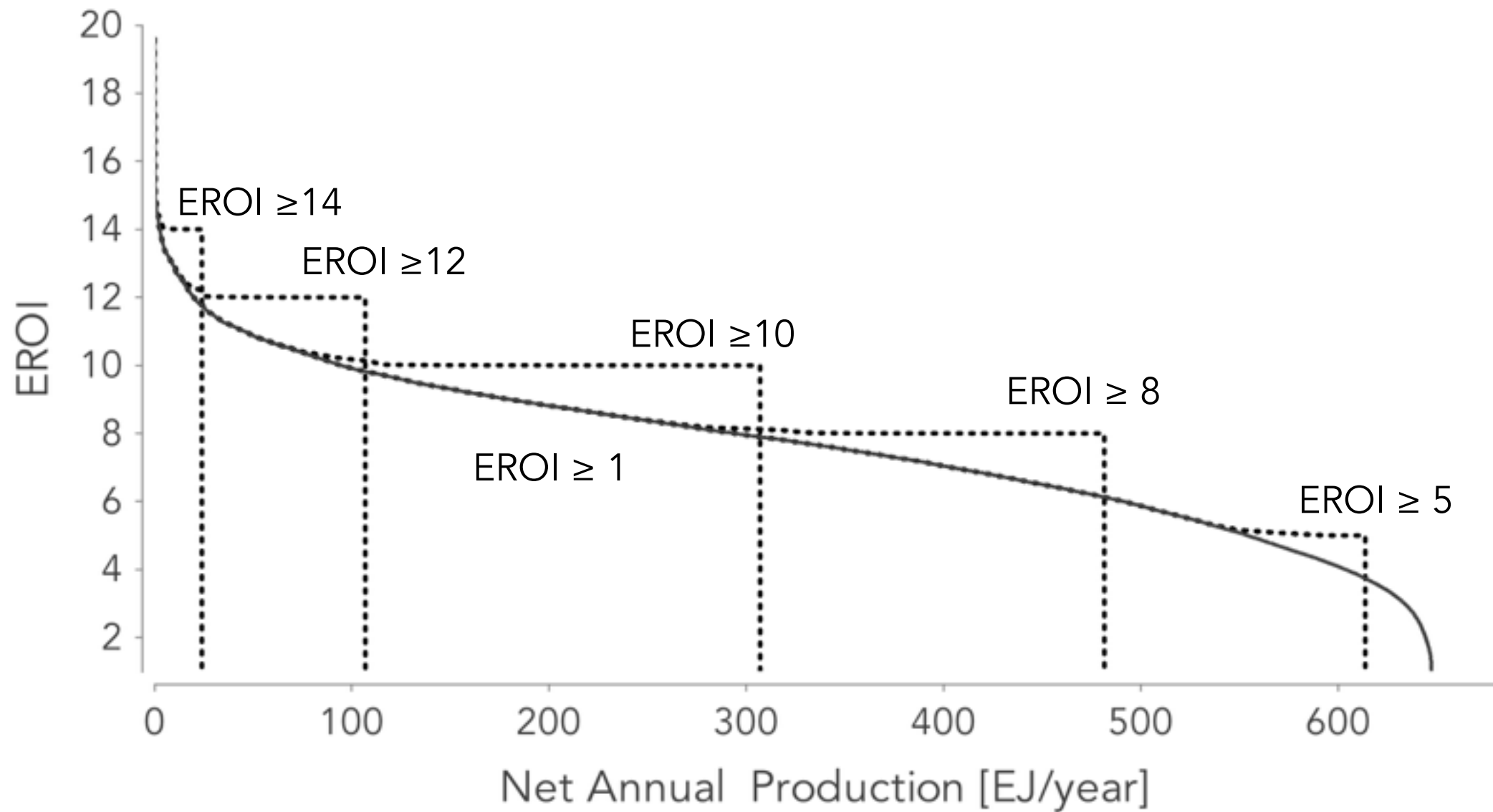


Increase in potential thanks to the constraint on the $EROI_{min}$!

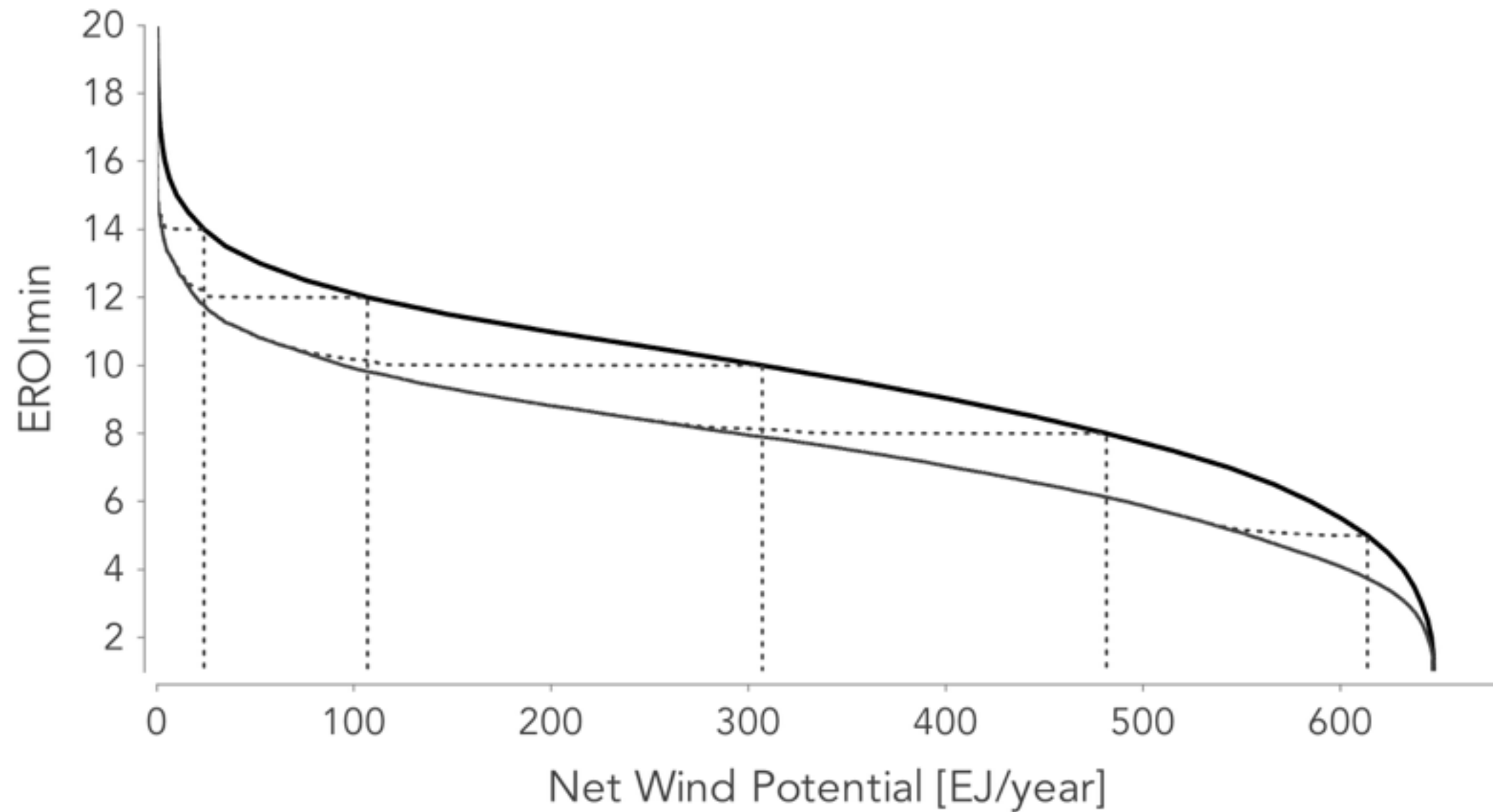
Net Energy Maximisation



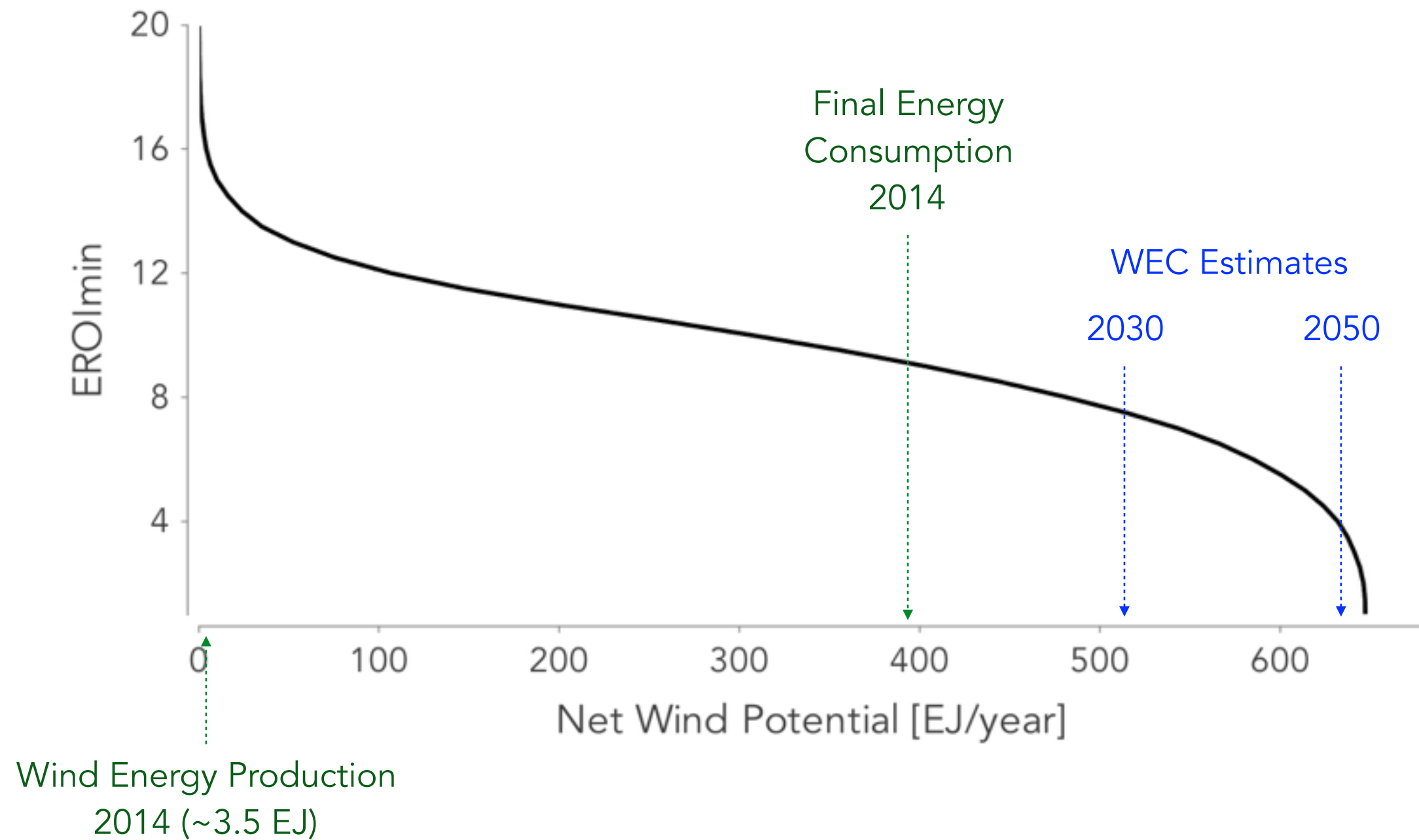
Net Energy Maximisation



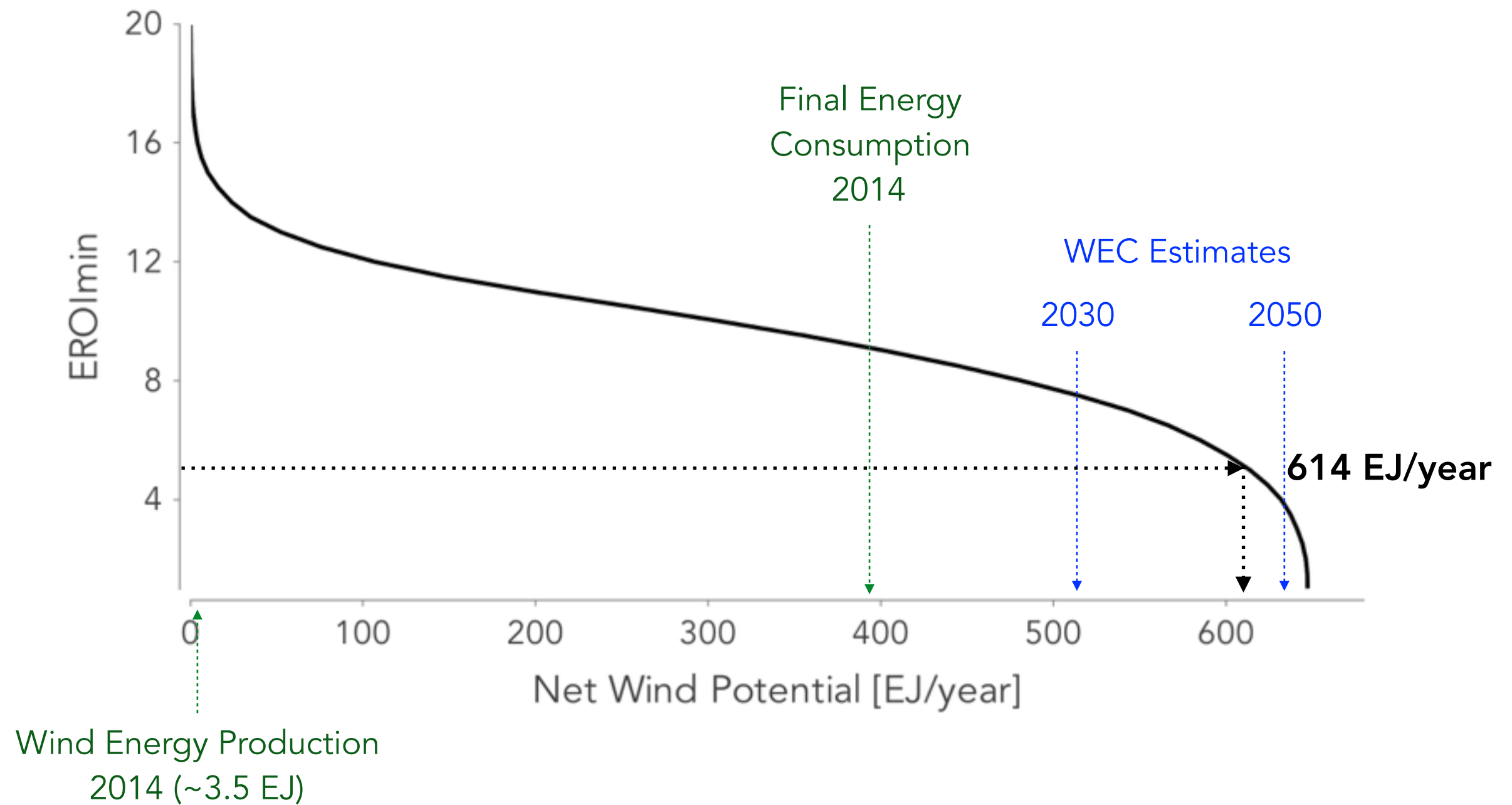
Enveloppe of the Global Wind Potential



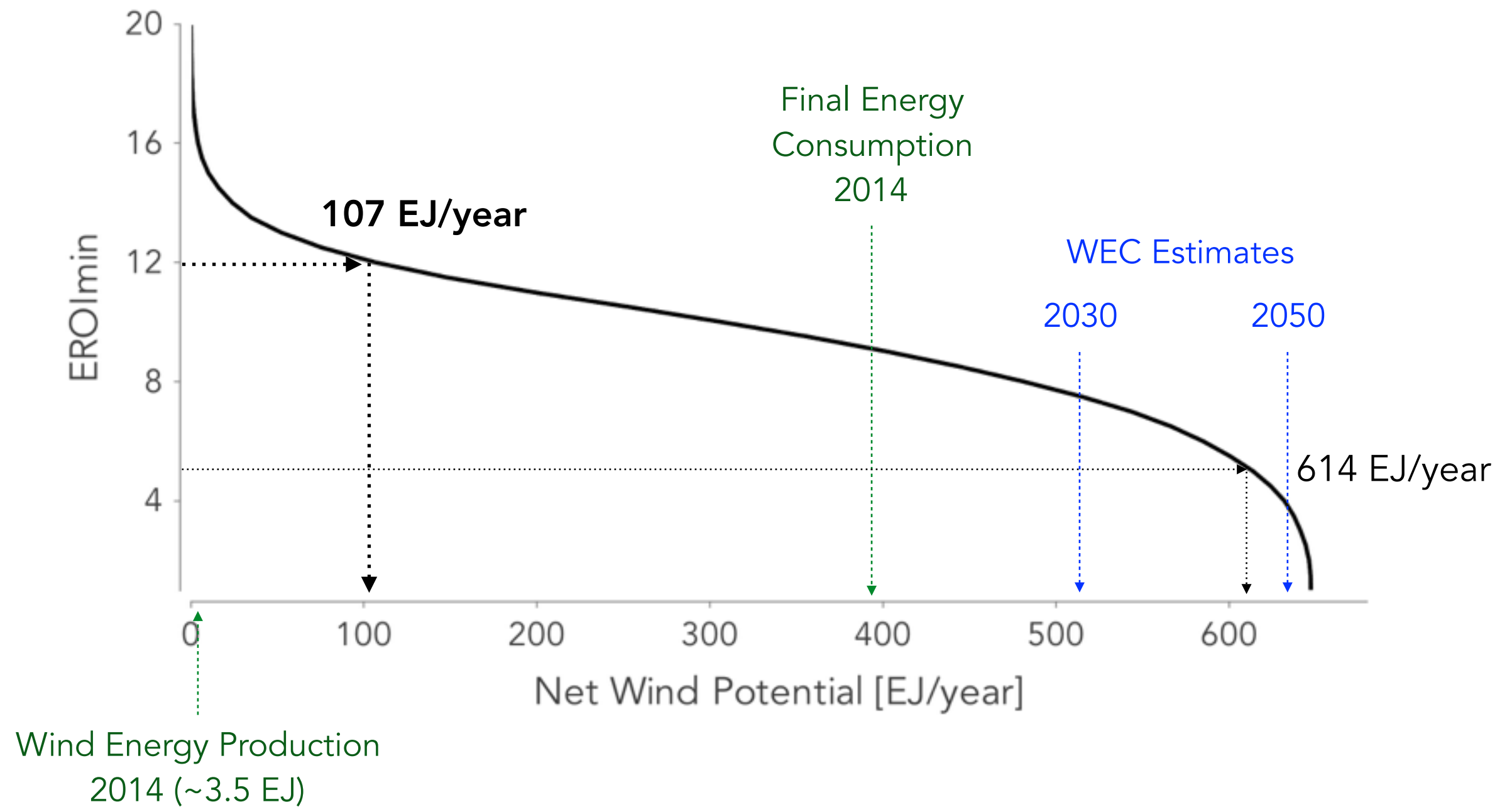
Global Wind Potential



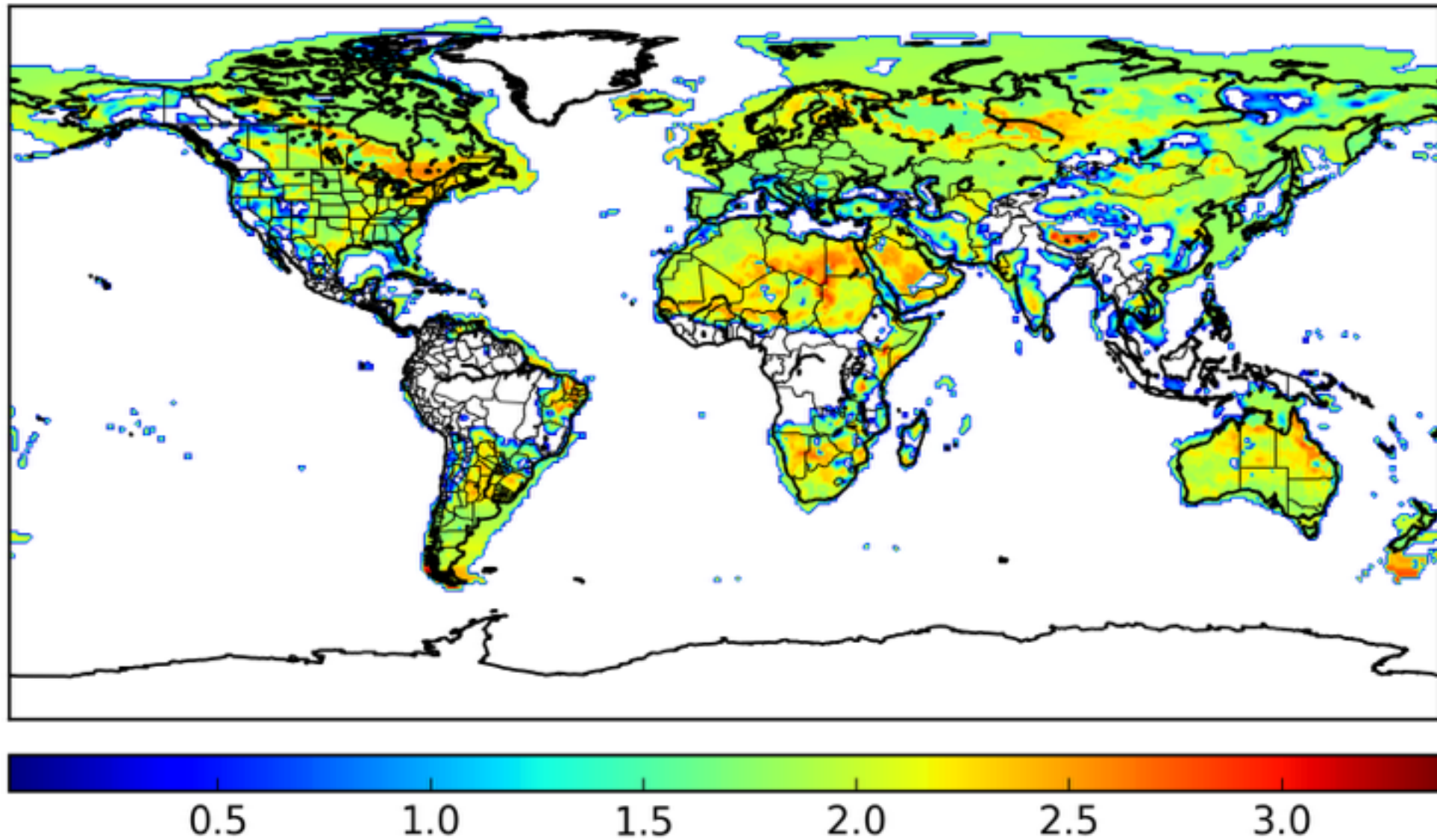
Global Wind Potential



Global Wind Potential



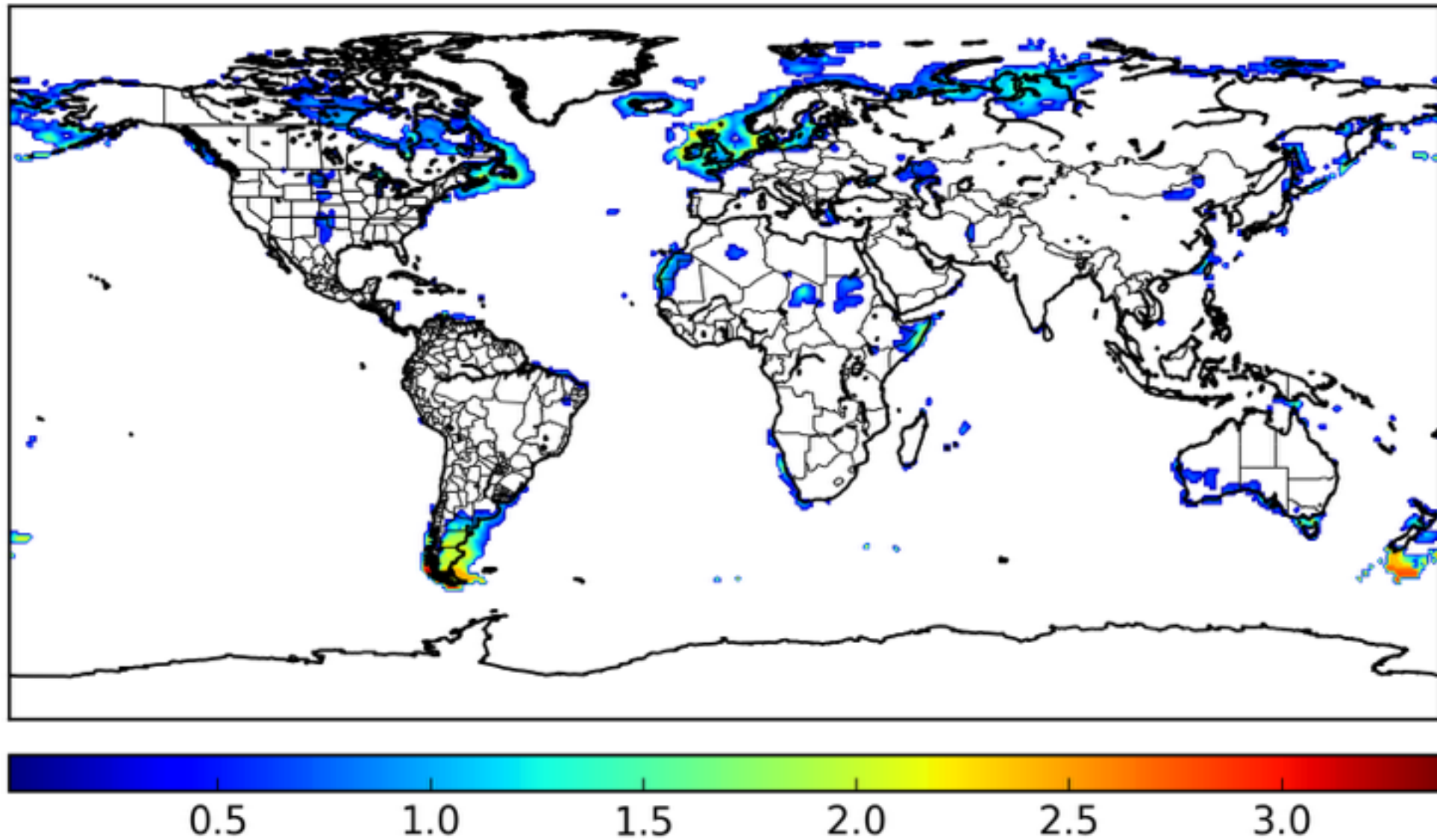
Spatial Distribution



Installed Capacity Density [$\text{MW}_{\text{installed}} / \text{km}^2$]

$\text{EROI} \geq 5$, Net potential = 614 EJ/year

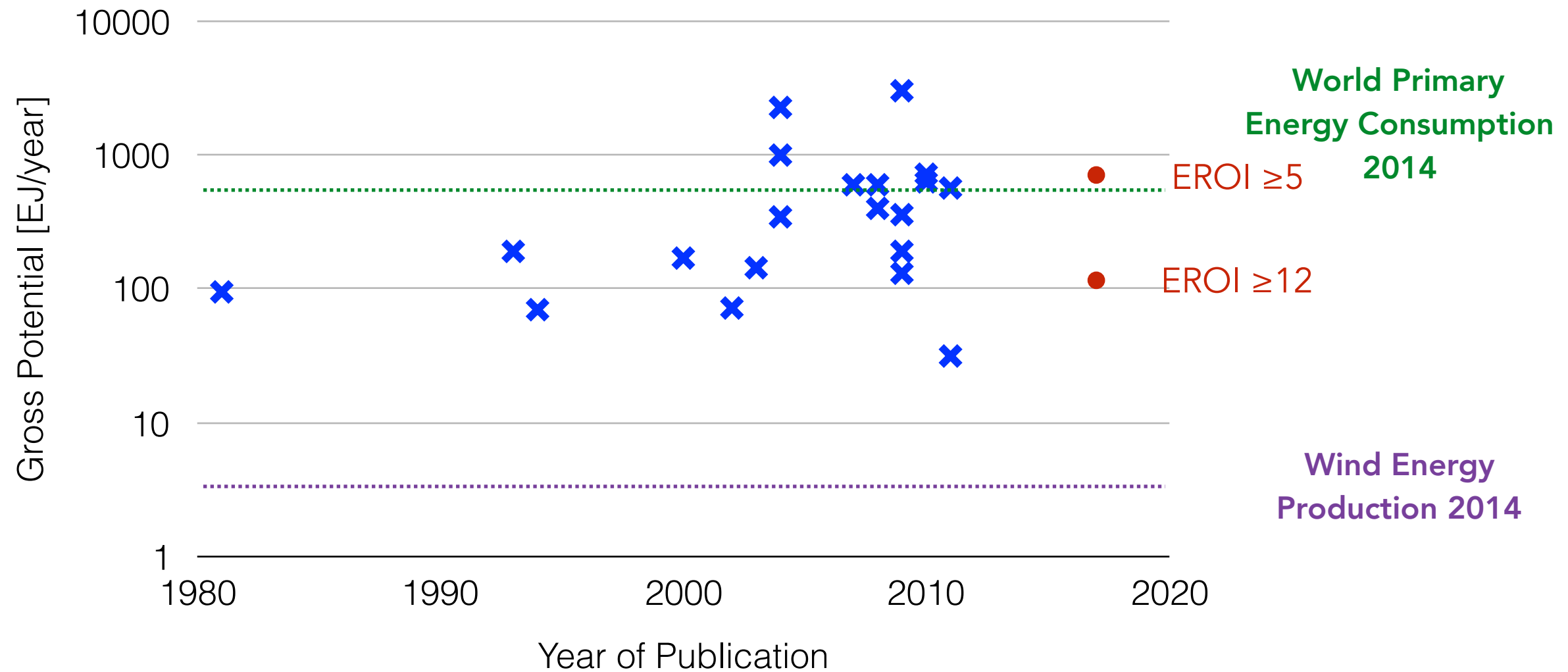
Spatial Distribution



Installed Capacity Density [MW_{installed} / km²]

EROI $\geq$ 12, Net potential = 107 EJ/year

Conclusion



Thank you !

Wind Energy Science Conference 2017, Copenhagen

