

Earth Observations to Value Ecosystem Services: A Series of Workshops

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Ecosystem Services: the benefits nature provides to human well-being

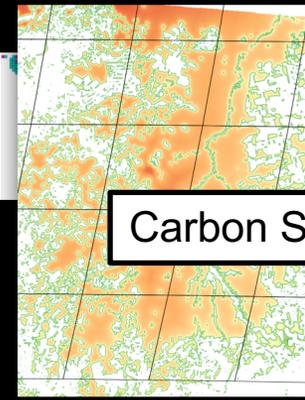


InVEST
integrated valuation of
ecosystem services
and tradeoffs

GLOBIO


WaterWorld

LUCI
LAND UTILISATION & CAPABILITY INDICATOR



Carbon Storage



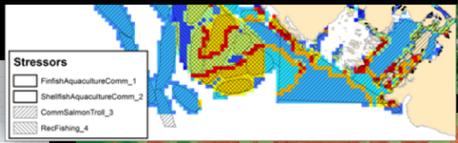
Habitat Risk Assessment



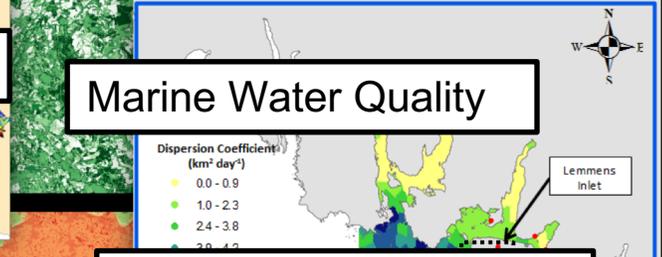
Water Yield



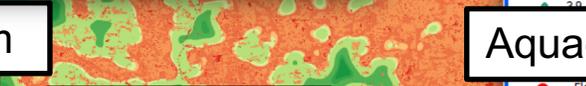
Visitation: Recreation & Tourism



Habitat Risk Assessment

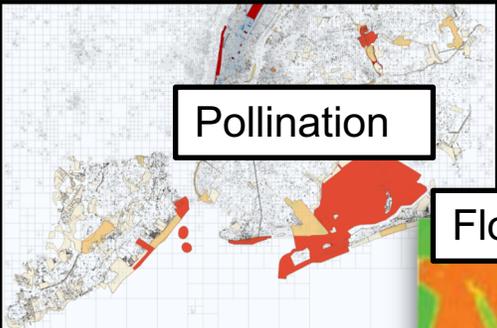


Marine Water Quality

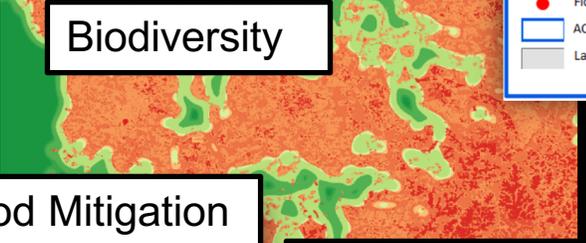


Biodiversity

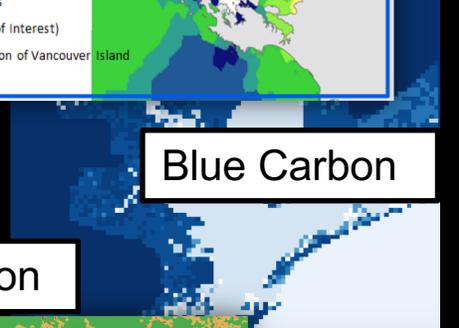
Aquaculture & Fisheries



Pollination



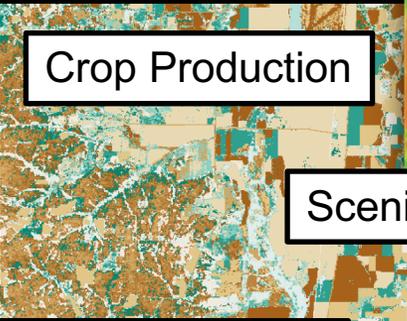
Flood Mitigation



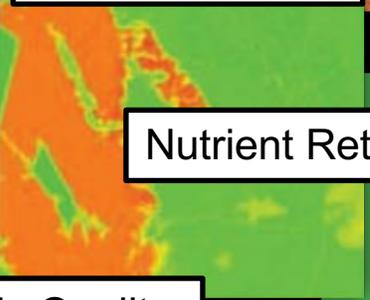
Blue Carbon

Flood Mitigation

Sediment Retention



Crop Production



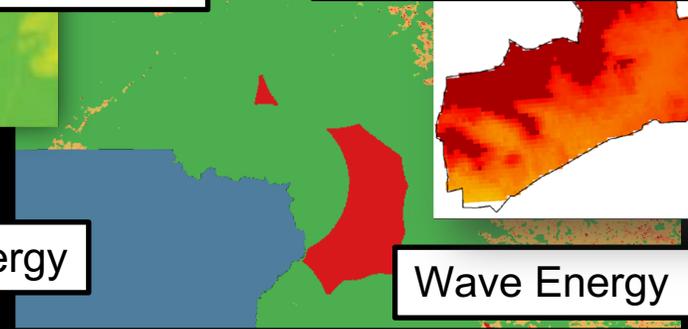
Nutrient Retention

Rangeland Production

Scenic Quality

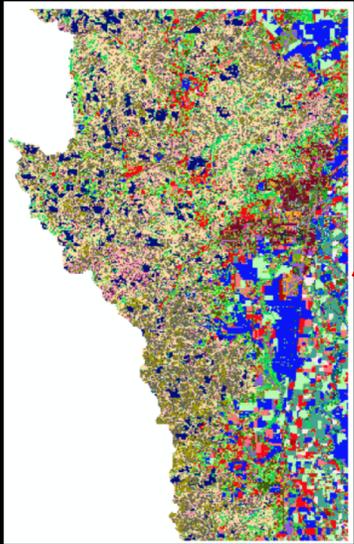
Coastal Protection

Wind Energy



Wave Energy

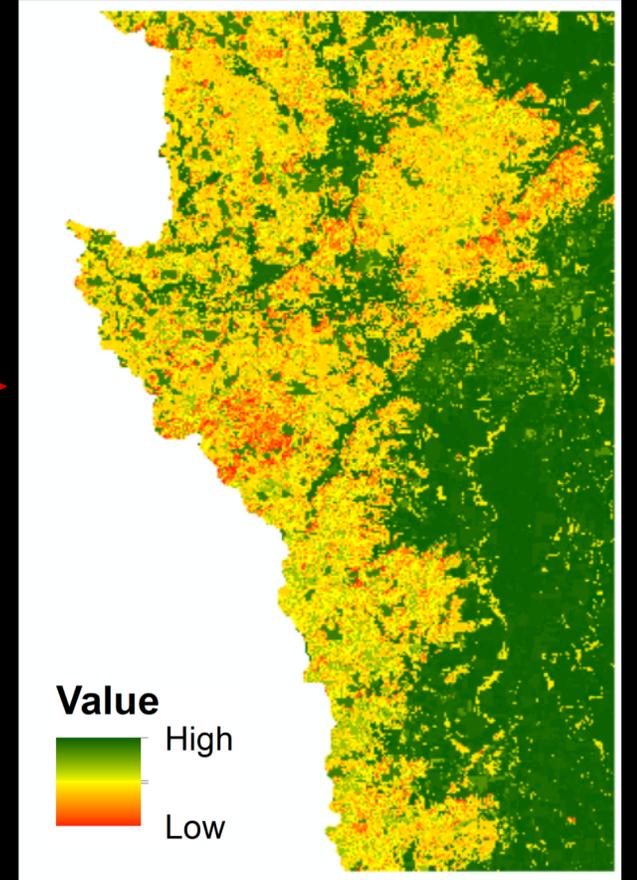
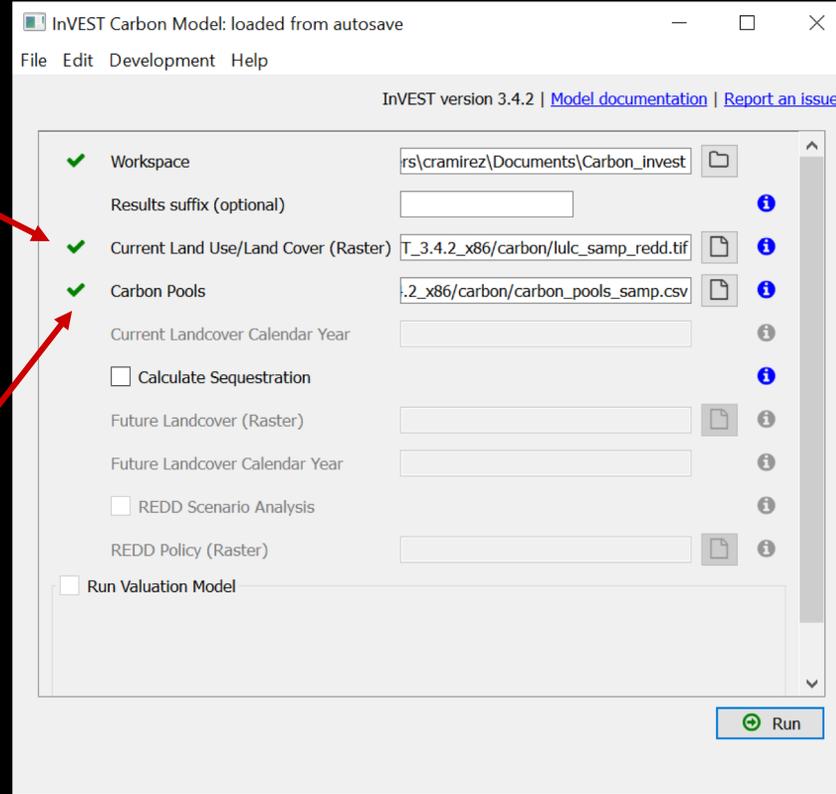
Example: ES - Climate mitigation Carbon storage model



LULC

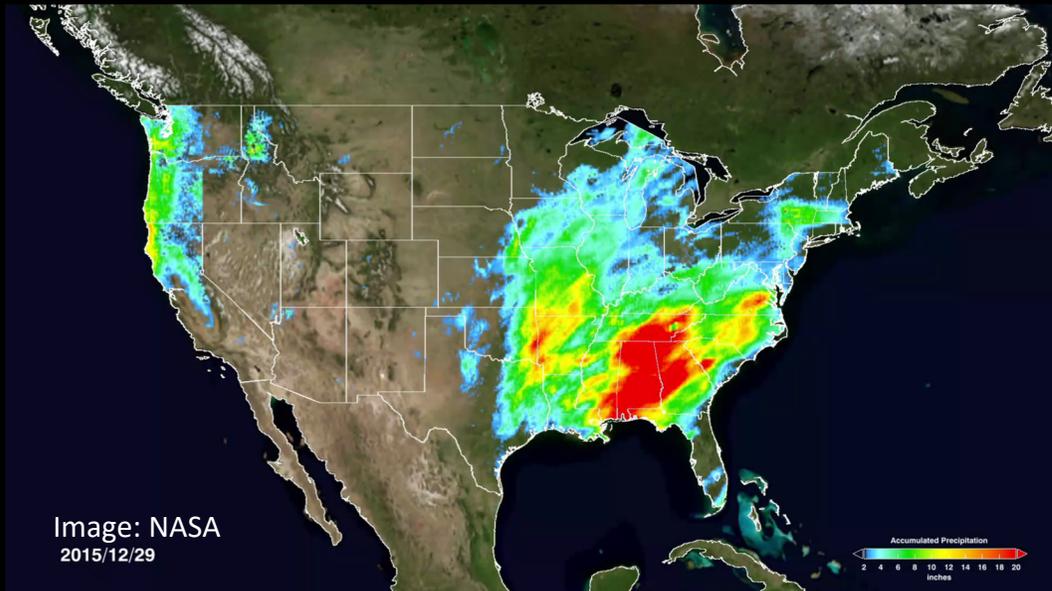
C Averages ex-situ

A	B	C	D	E	F	G	H
C_above	C_below	C_soil	C_dead	lucode	LULC_Name		
15	10	60	1	1	Residential 0-4 DU/ac		
5	3	20	0	2	Residential 4-9 DU/ac		
2	1	5	0	3	Residential 9-16 DU/ac		
0	0	0	0	4	Residential >16 DU/ac		
10	20	10	5	5	Vacant		
0	0	0	0	6	Commercial		
0	0	0	0	7	Comm/Industrial		
0	0	0	0	8	Industrial		
0	0	0	0	9	Industrial & Comm.		
0	0	0	0	10	Residential & Comm.		
0	0	10	0	11	Urban non-vegetated unknown		
0	0	50	0	16	Rural structures		
0	0	25	0	18	Railroad		
0	0	50	0	19	Primary roads		
0	0	25	0	20	Secondary roads		
0	0	35	0	21	Light duty roads		
0	0	0	0	24	Rural non-vegetated unknown		
0	0	0	0	29	Main channel non-vegetated		
0	0	0	0	32	Stream orders 5-7		
0	0	0	0	33	Permanent lentic water		
100	5	65	50	39	Topographic Shadow		



Biomass

- EO could DRIVE ES models



Parameterize or drive models



Determine or predict the provision of ES

- EO could DRIVE ES models



Image: NASA

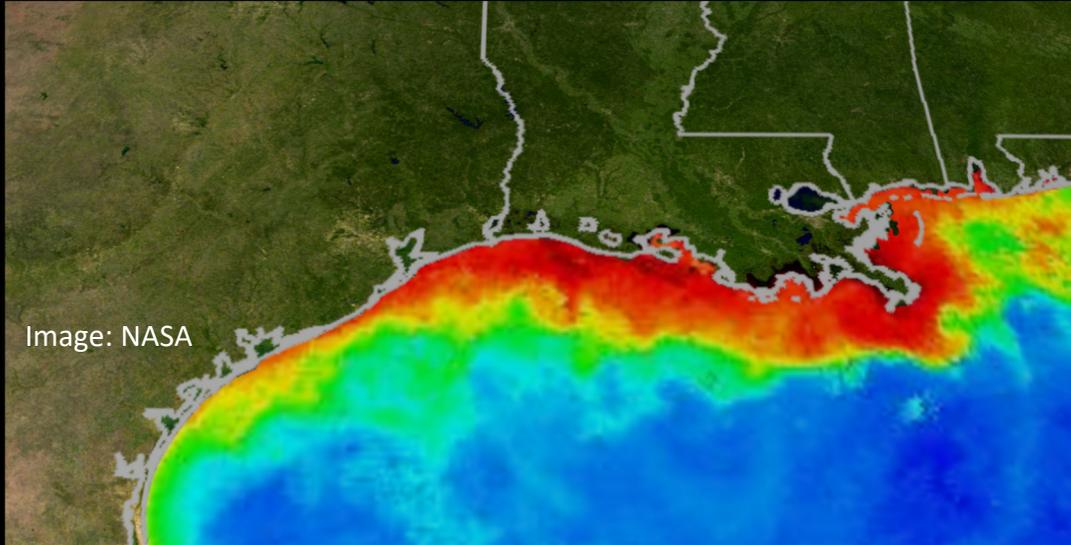
Parameterize or drive models



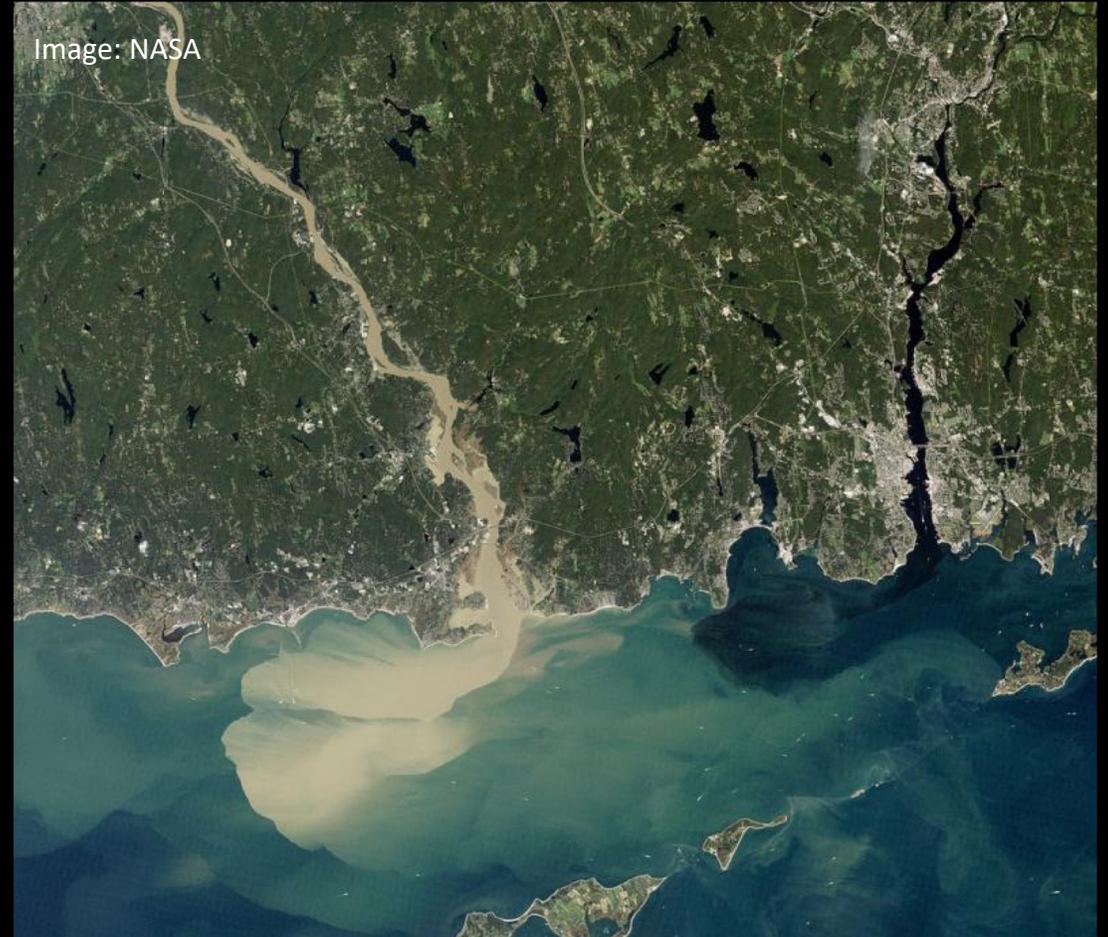
Image: USGS

Determine the demand for ES services

- EO could CREATE ES models



Observable indicators of ES production or demand



Calibration or accuracy assessments



Ecological Modelling 129 (2000) 169–186

ECOLOGICAL
MODELLING

www.elsevier.com/locate/ecolmodel

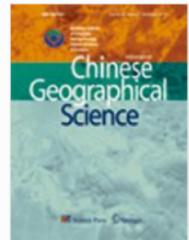
Perspectives on combining ecological process models and remotely sensed data

S.E. Plummer *

Opinion

Priorities to Advance Monitoring of Ecosystem Services Using Earth Observation

Anna F. Cord ¹ , Kate A. Brauman ², Rebecca Chaplin-Kramer ³, Andreas Huth ^{4, 5, 6}, Guy Ziv ⁷, Ralf Seppelt ^{1, 5, 8}



[Chinese Geographical Science](#)

December 2010, Volume 20, [Issue 6](#), pp 522–535 | [Cite as](#)

Remote sensing of ecosystem services: An opportunity for spatially explicit assessment

Potential contributions of remote sensing to ecosystem service assessments

Margaret E. Andrew

Murdoch University, Australia

Michael A. Wulder

Canadian Forest Service (Pacific Forestry Centre), Canada

Trisalyn A. Nelson

University of Victoria, Canada

Satellite remote sensing of ecosystem functions: opportunities, challenges and way forward

Nathalie Pettorelli , Henrike Schulte to Bühne, Ayesha Tulloch, Grégoire Dubois, Cate Macinnis-Ng, Ana M. Queirós, David A. Keith, Martin Wegmann, Franziska Schrodt, ... [See all authors](#)

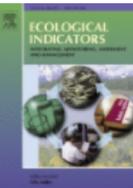
First published: 10 August 2017 | <https://doi.org/10.1002/rse2.59> | Cited by:5



ELSEVIER

Ecological Indicators

Volume 52, May 2015, Pages 430–443

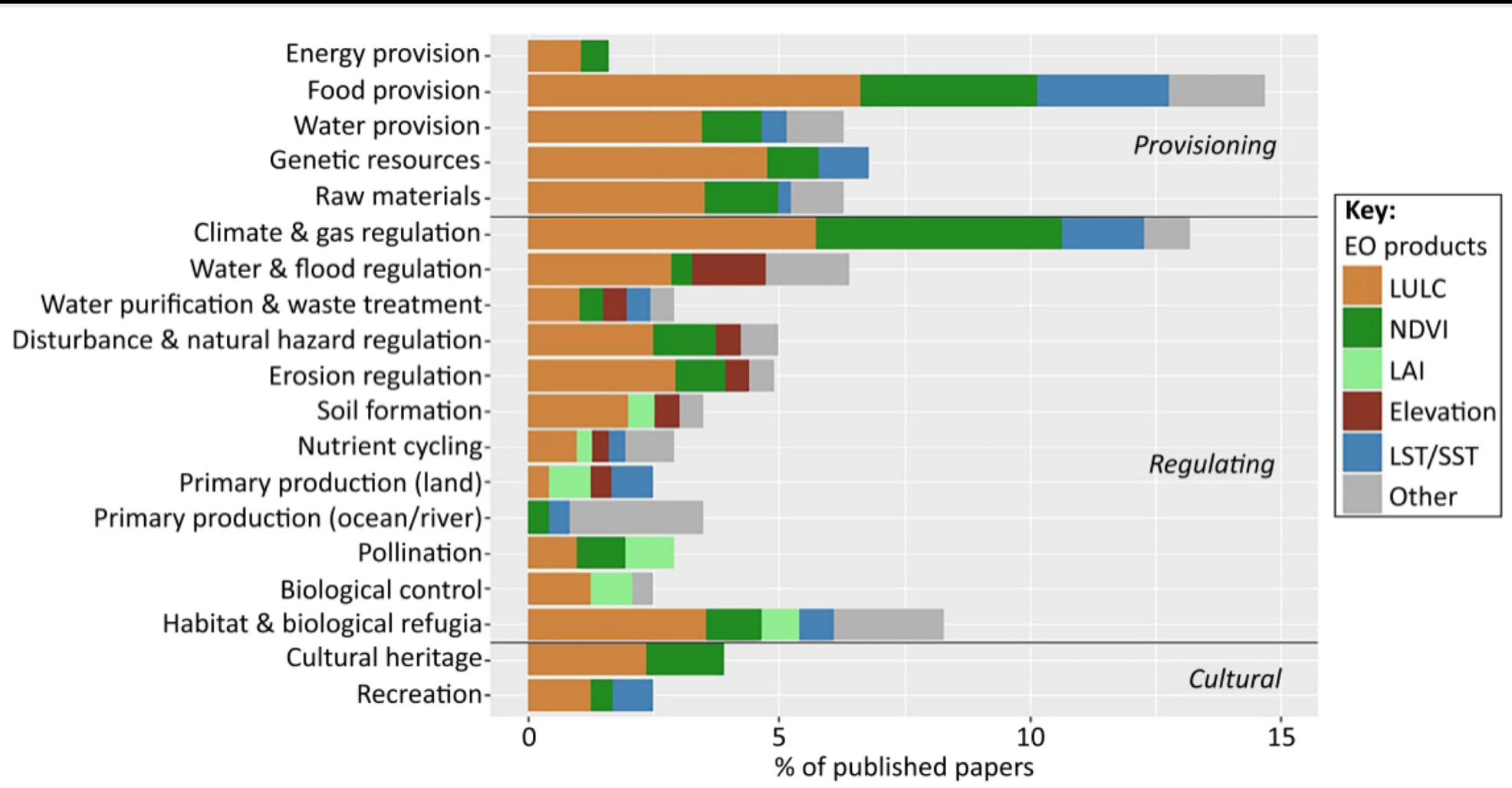


Review

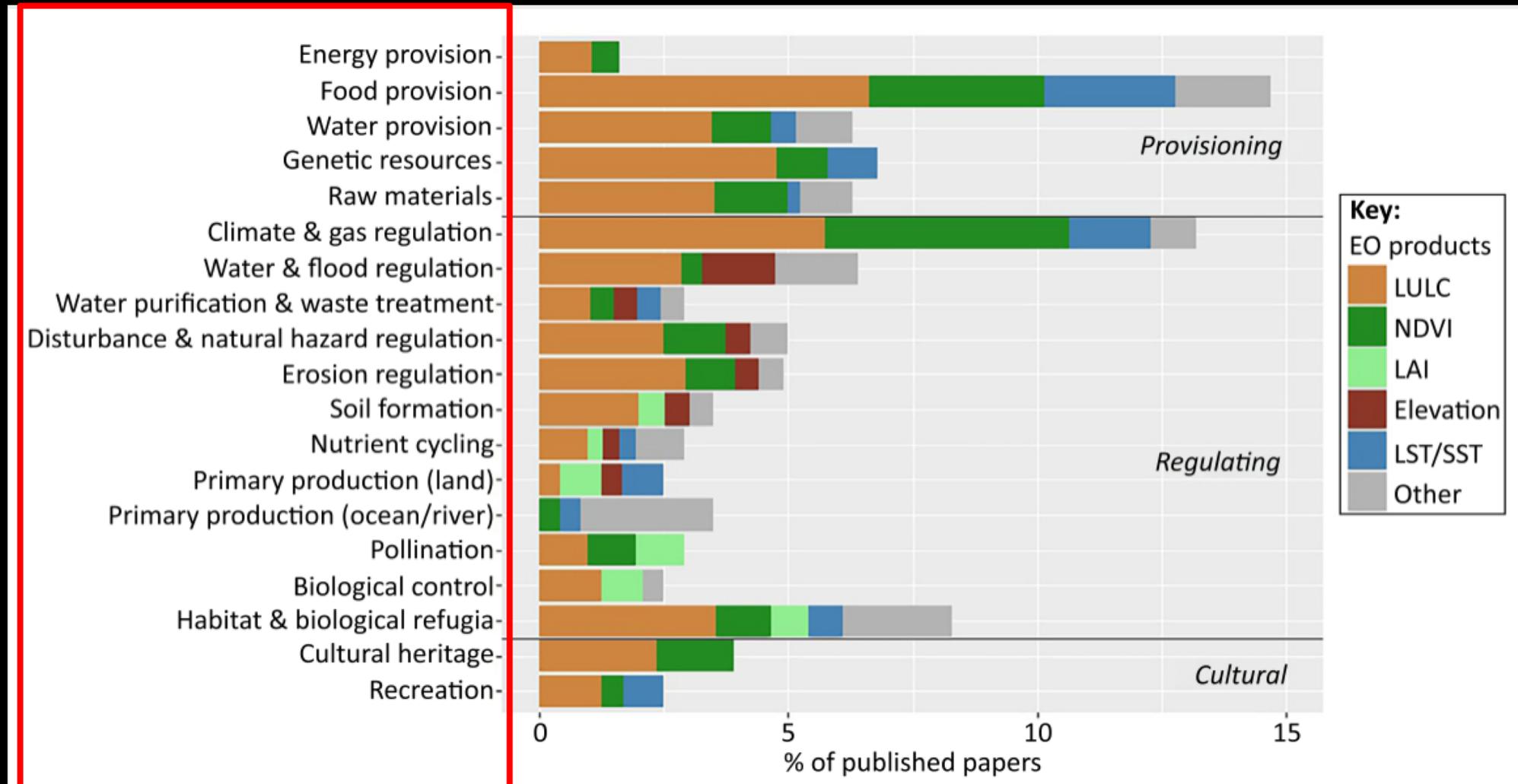
Remote sensing of ecosystem services: A systematic review

Caio C. de Araujo Barbosa ^a , Peter M. Atkinson ^a, John A. Dearing ^b

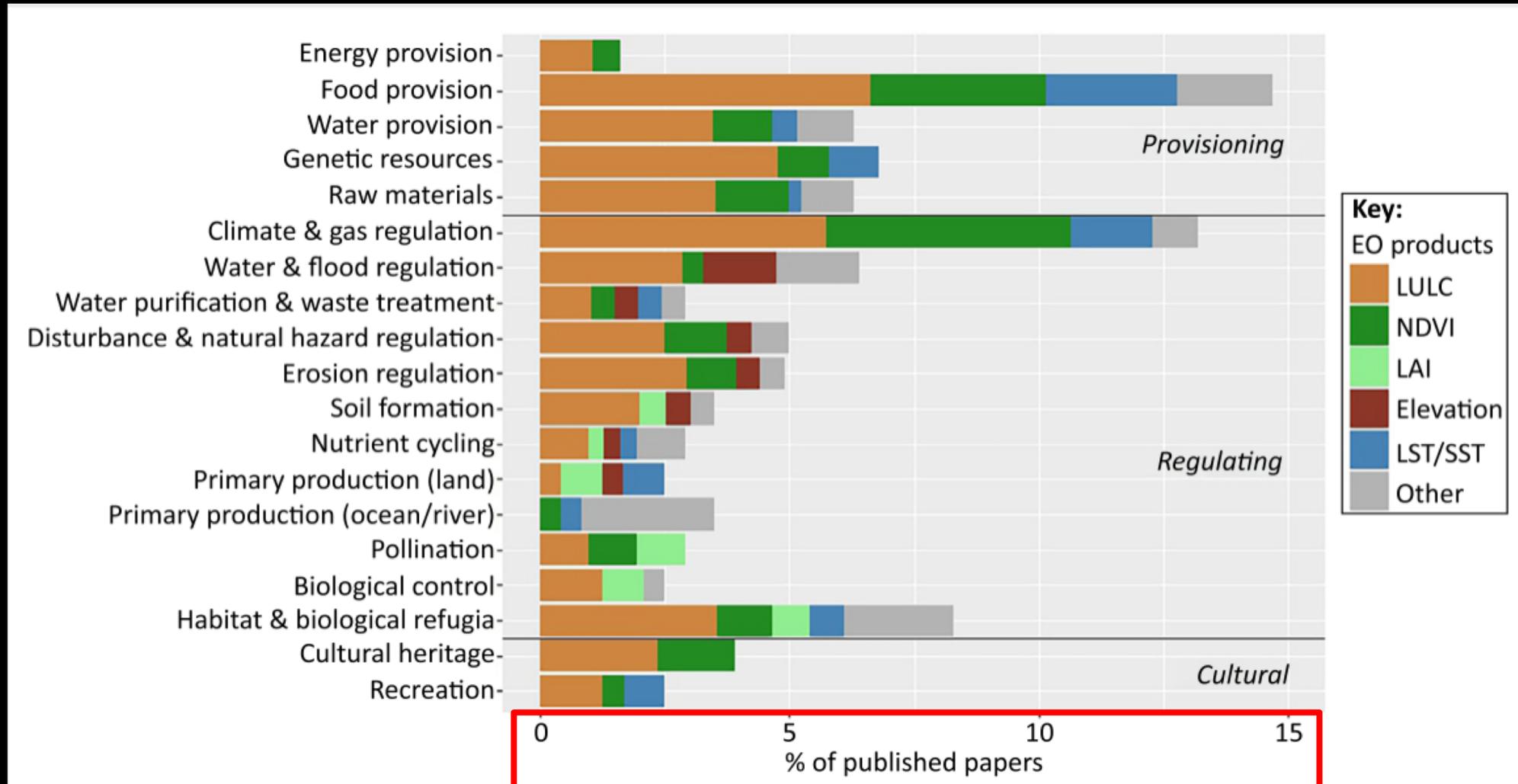
Few EO products are the most popular



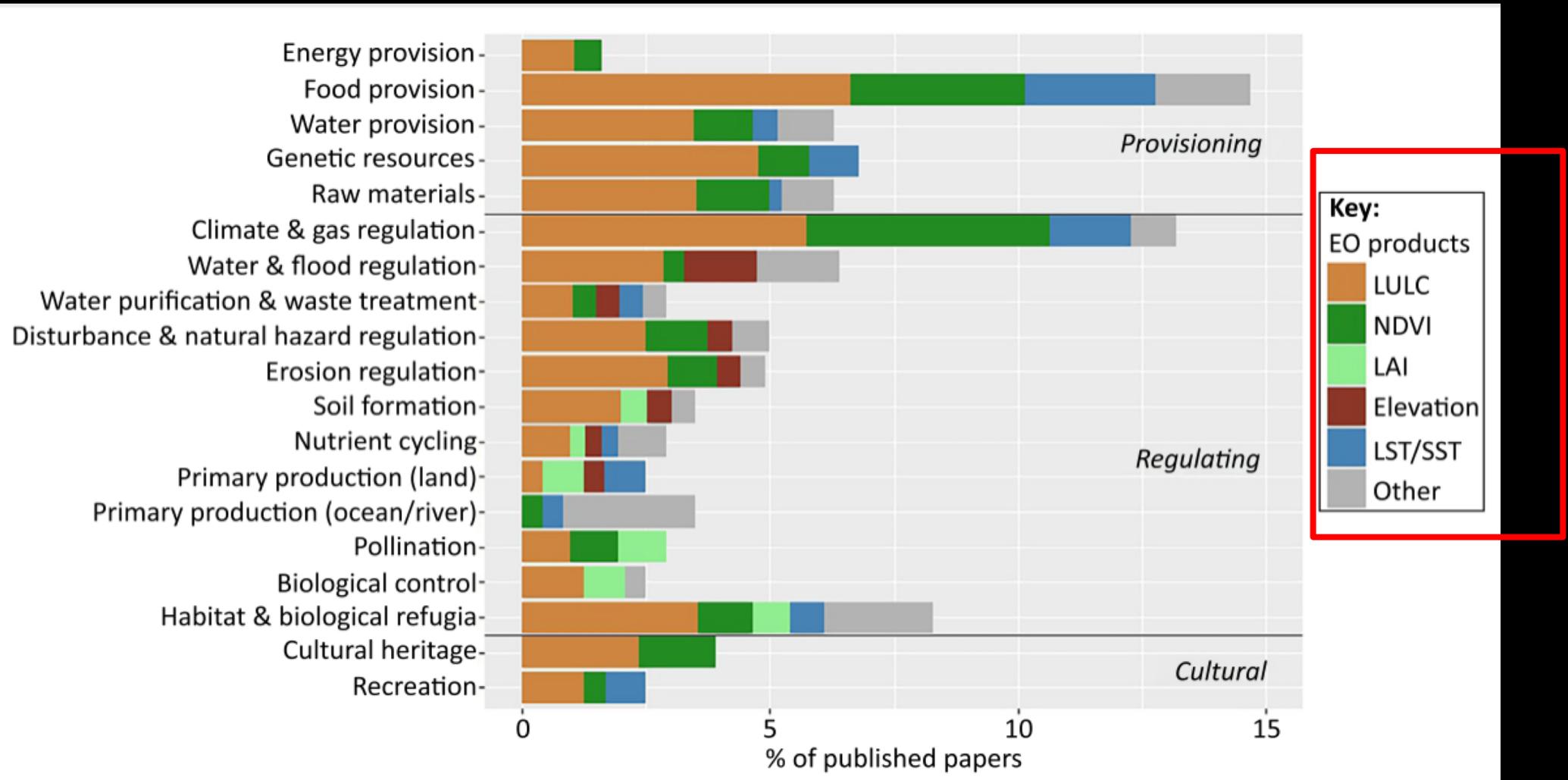
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EO & ES integration is still not happening

Why?



- W1: EO and ES Model development
- 20 ES & EO scientists
- 12 institutions
- Process of ES modelling and EO integration



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- W2: Sharing ideas and needs with practitioners
- 40 ES & EO scientist and practitioners
- 25 institutions
- Feedback from practitioners and identify solutions

Preliminary Results : 4 types of challenges



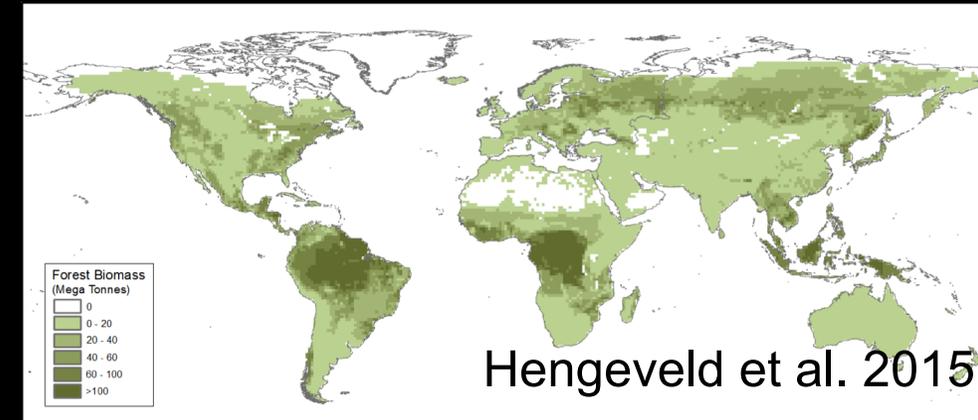
Types of challenges

1- Practical challenges

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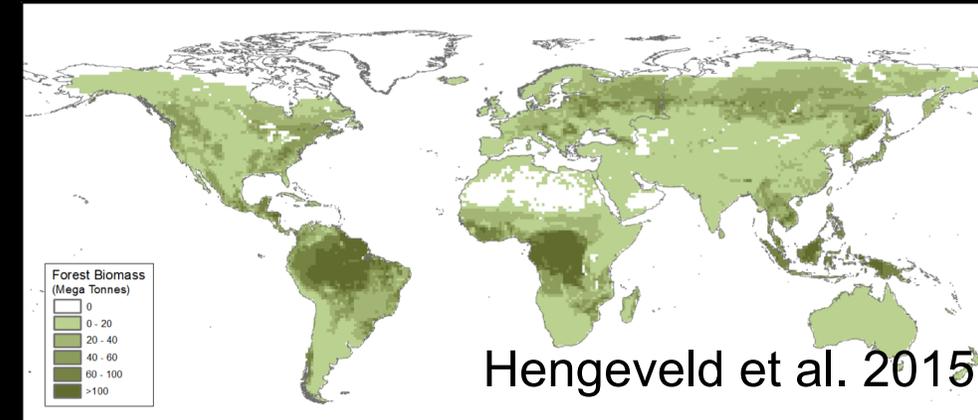
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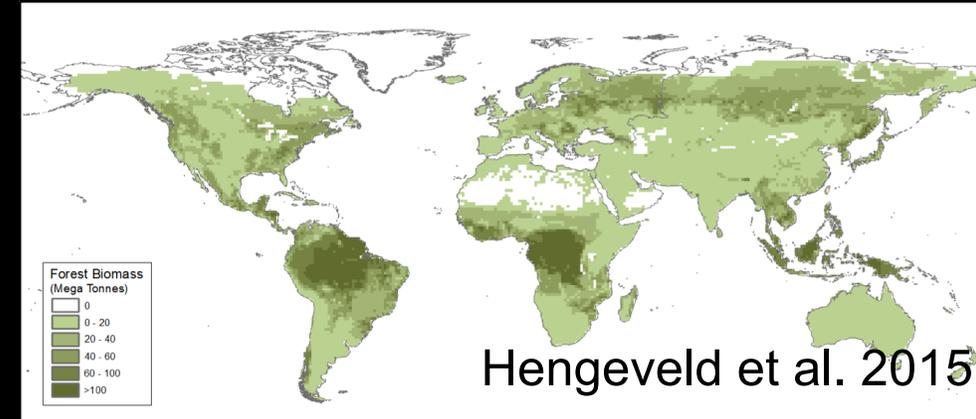
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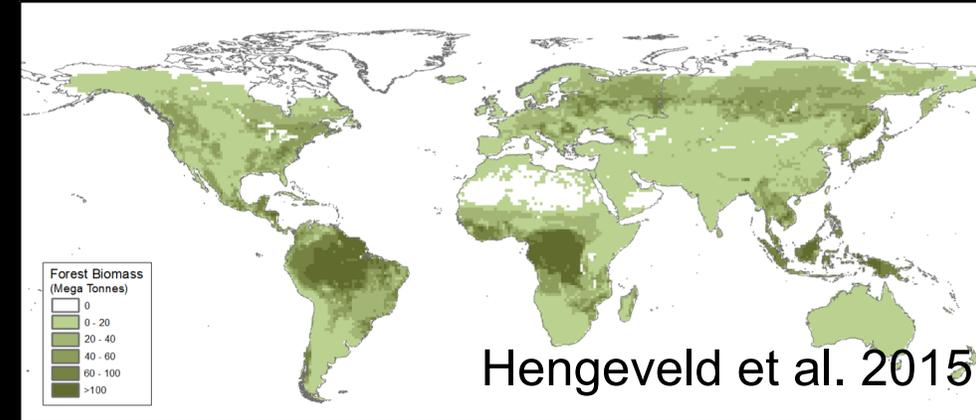
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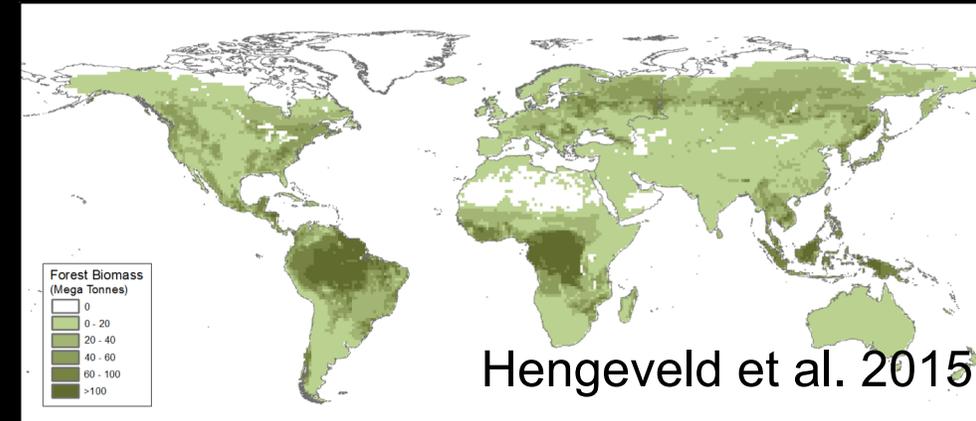
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- Different EO products have **different resolutions** and are difficult to use together
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- ES modelers don't know how to **ingest ES** into their models. **EO data is big** and complicated and **hard to compute**



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- ES modelers don't know **where to find EO data**
- ES modelers don't know how to **ingest ES** into their models. **EO data is big** and complicated and **hard to compute**
- People don't understand how to **interpret EO** products



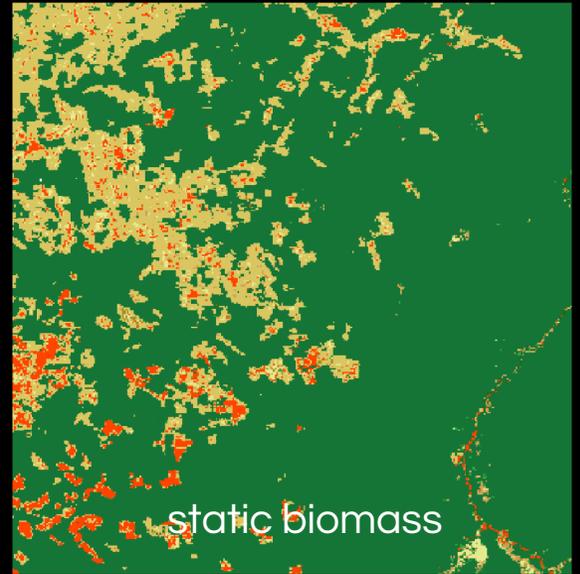
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2- Data and model adjustments

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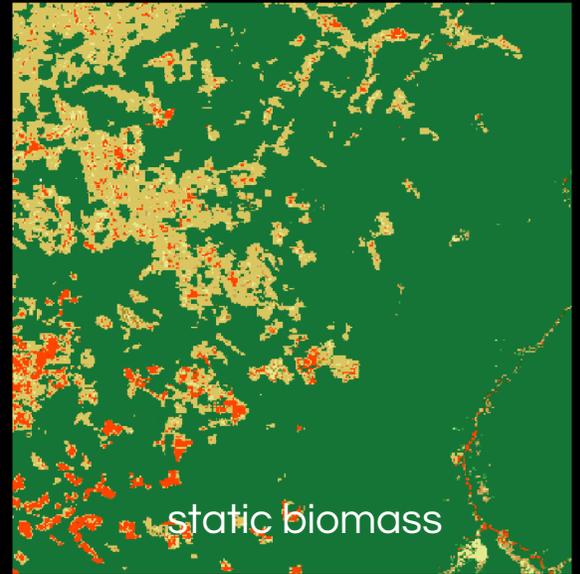
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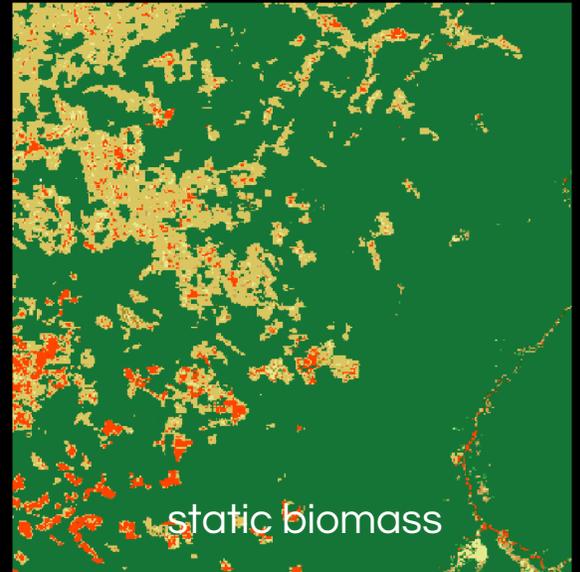
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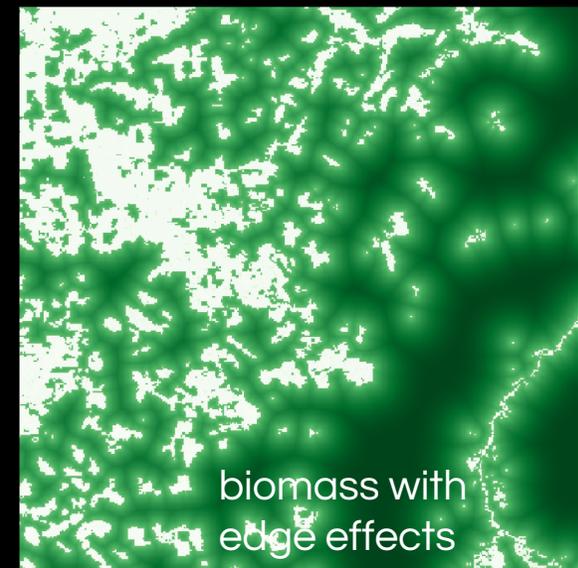
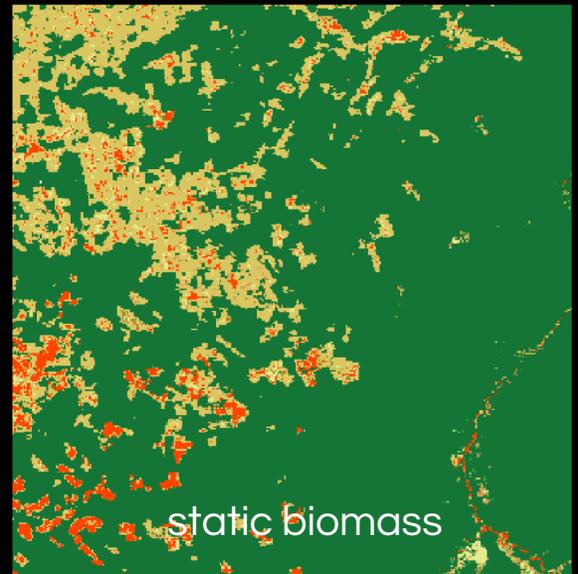
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- Including **impact on people** in ES models is difficult
- EO tells us what's on the landscape but not **how people are choosing and using** ES benefits
- Most ES models use **categorical LULC data**; ES processes depend on ecosystem condition, not just type



Chaplin-Kramer 2018

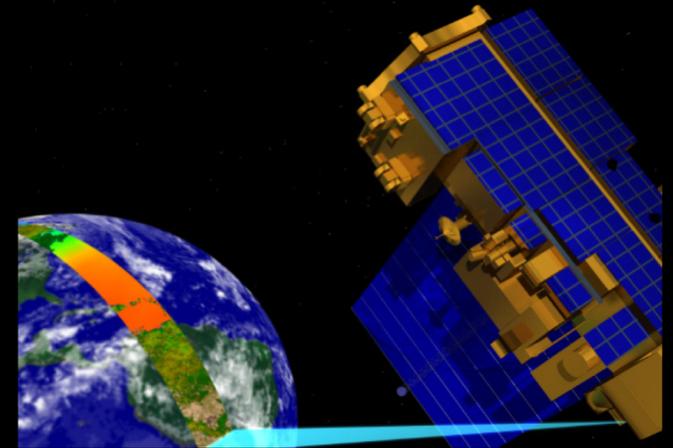
Types of challenges

3- New models

Types of challenges

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- Now we use LULC and production functions to model ES; could use existing or potential EO products to **directly measure ES supply or demand**



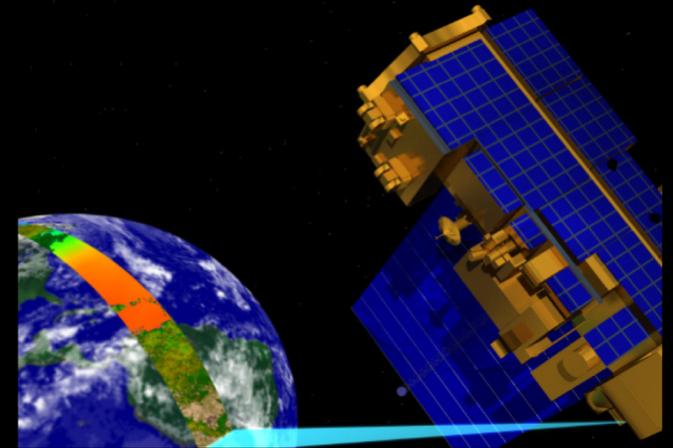
Example: ES - Climate mitigation

Carbon storage model -> Carbon Cycles

Types of challenges

3- New models

- Now we use LULC and production functions to model ES; could use existing or potential EO products to **directly measure ES supply or demand**
- Many ES models rely on LULC proxies; could measure/**create variable of interest directly**



Types of challenges

4- Testing assumptions

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- ES models assume that when people and ES production are both present, **ES provides benefit**



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- ES models assume that when people and ES production are both present, **ES provides benefit**
- Scenario assessments assume that a management action will have an intended ecosystem consequence; EO provides an opportunity to test **how ES changes in response** over time



Types of challenges

4- Testing assumptions

- ES models assume that when people and ES production are both present, **ES provides benefit**
- Scenario assessments assume that a management action will have an intended ecosystem consequence; EO provides an opportunity to test **how ES changes in response** over time
- ES model outputs are seldom calibrated; EO can be used for **calibration**



Summary

- 4 Distinct TYPES of challenges to EO-ES integration
 - Practical challenges
 - Data and model adjustments
 - New models
 - Testing assumptions

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 - Practical challenges
 - Data and model adjustments
 - New models
 - Testing assumptions
- Each type of challenge must be addressed by different KINDS of solutions
- **Collaborative ES-EO networks** - need interdisciplinary groups to address challenges holistically

Next steps

- 3rd workshop
 - Use case examples of EO-ES integration
 - test framework and provide guidance
- Getting additional feedback and recommendations to NASA
- Disseminate results
 - -Peer review paper
 - -White paper



Acknowledgments

- Our workshop participants
- NASA

cramirez@umn.edu



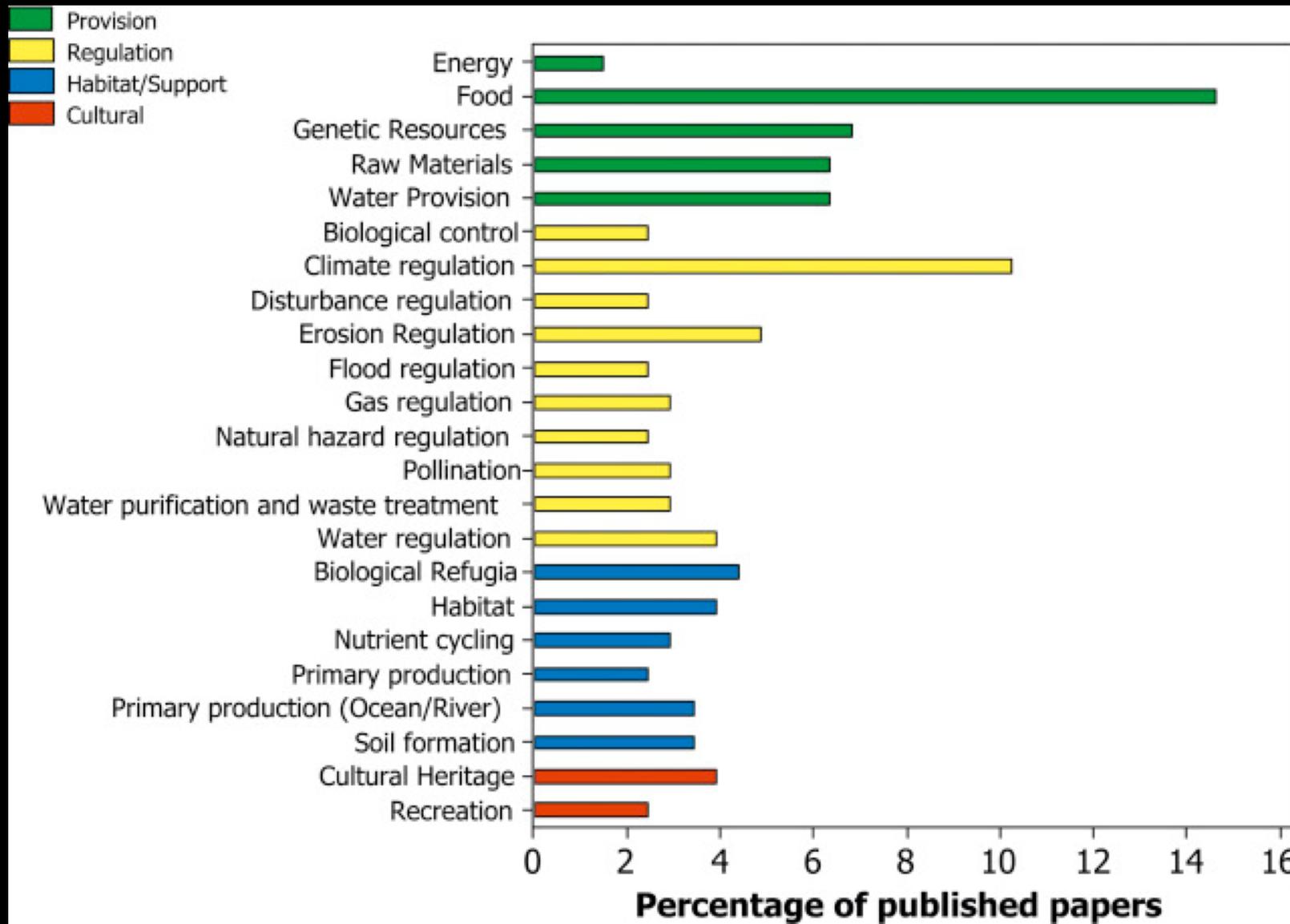
List of ES products

EO products available for different ES (Pettorelli et al., 2017)

Table 3. Non-exhaustive list of freely available, global satellite remote sensing data products that open opportunities for the dynamic monitoring of ecosystem functions.

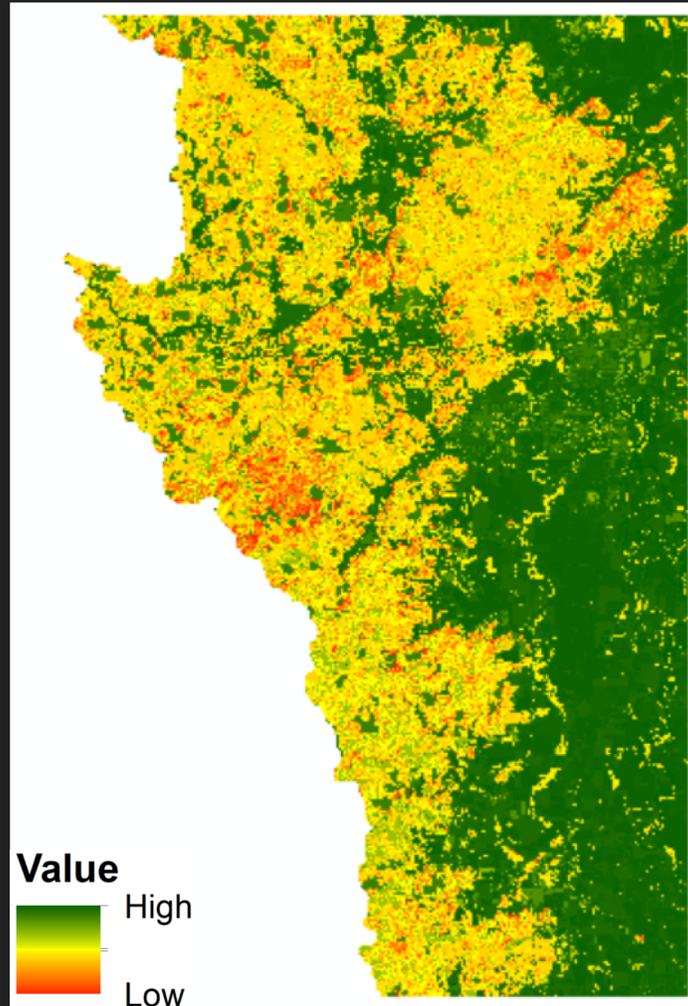
Function	Indicator	Proxy	Satellite (sensor)	SRS data product	Examples
Gas regulation	Gas concentrations	Total ozone burden	Terra/Aqua (MODIS) Nimbus-7/Meteor-3/Earth Probe	MODIS Atmospheric Profile product Total Ozone Mapping Spectrometer (TOMS) (1978-2006)	Spichtinger et al. (2001) used GOME-derived nitrogen oxide concentration to map emissions from boreal forest fires. Ribeiro et al. (2016) used the Aqua (AIRS) Methane product to link methane concentrations over the Amazon to wetness and biomass burning.
	Emissions of gases by ecosystems	Total methane burden Air-sea CO ₂ flux	Sentinel-5P (TROPOMI) Aqua (AIRS) Multiple, including POES (AVHRR), Terra/Aqua (MODIS), TRMM (CERES)	O ₃ tropospheric profile Methane product NOAA AOML Surface CO ₂ Flux maps (1982–2009)	
Climate regulation	Temperature regulation	Land and sea surface temperature	Terra/Aqua (MODIS)	MODIS Land Surface Temperature and Emissivity	Jin and Dickinson (2010) used Terra (MODIS) data to derive land skin temperature and investigate its relationship with local surface albedo and vegetation, among other parameters.
			Terra/Aqua (MODIS) POES (AVHRR)	MODIS Sea Surface Temperature NOAA Coral Reef Watch Sea Surface Temperature	
	Precipitation regulation	Rainfall	Sentinel 3 (SLSTR) TRMM (PR, TMI, VIRS, CERES) TRMM (PR, TMI, VIRS, CERES) TRMM (PR, TMI, VIRS, CERES)	Ocean/Sea Surface Temperature Land Surface Temperature TRMM precipitation estimates (1998–2015) CHIRPS GPCP	

EO is mostly used to assess provision services



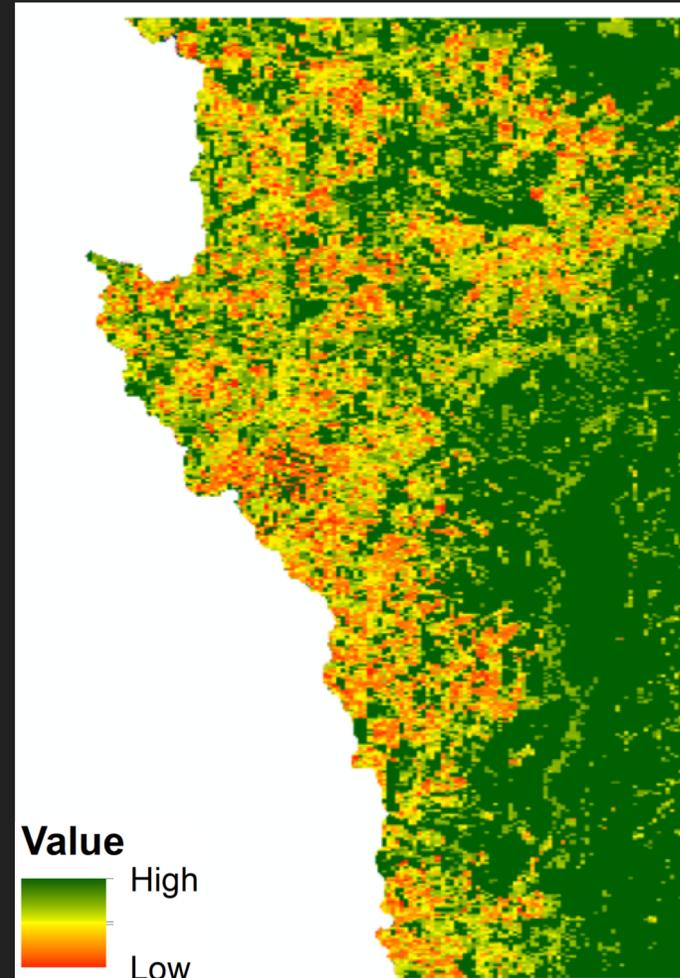
InVEST LULC- derived biomass

- Depends
on LULC
- C Averages
ex-situ



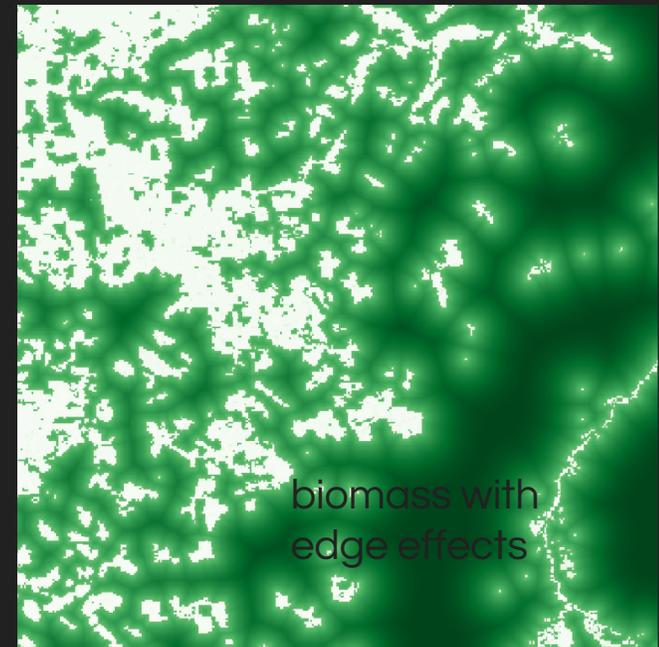
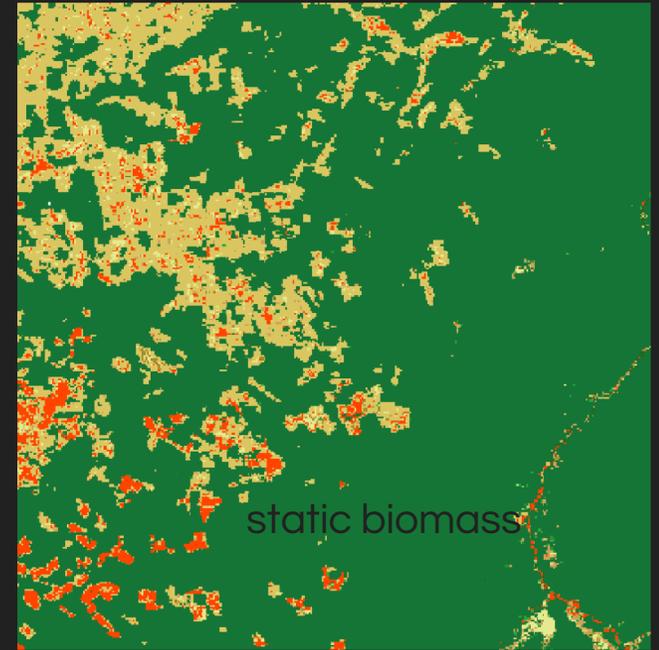
USGS biomass map

- Doesn't depend
on LULC

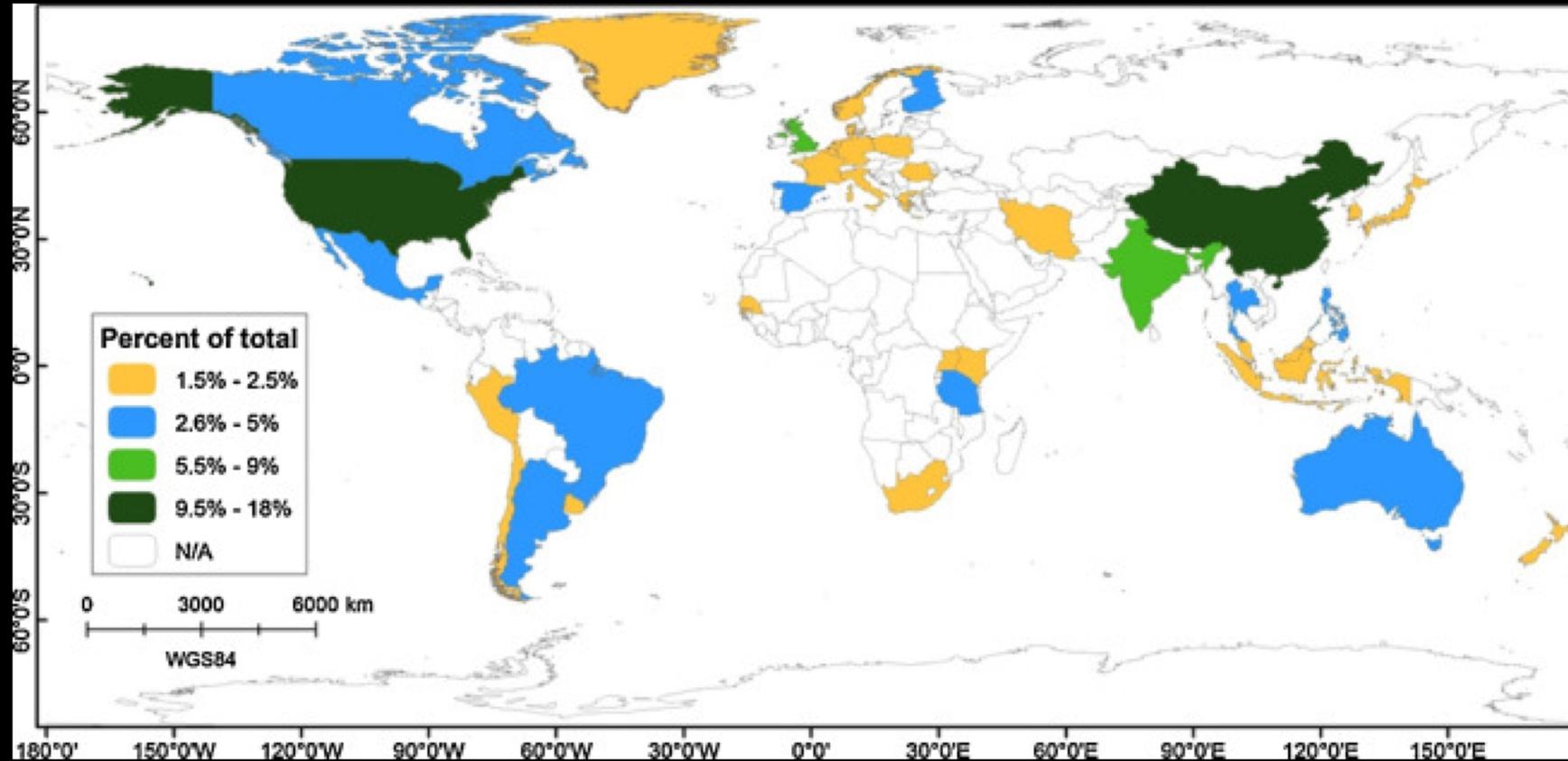


How is this used in decisions?

- Understanding impacts of forest fragmentation on remaining forest for sustainable development planning
- Sustainable supply chain commitments: no net deforestation does not mean no net carbon loss



The use of EO is limited and geographically constrained



De Araujo Barbosa et al. 2015