



# Managing Climate Transition Risks: Spatial Finance and Open Data Solutions

**Dr Felicia Liu**

Research Associate, Oxford Sustainable Finance Group

Research Fellow, Jesus College

University of Oxford

[Felicia.liu@smithschool.ox.ac.uk](mailto:Felicia.liu@smithschool.ox.ac.uk)

27<sup>th</sup> October 2022



## Outline

- Short introduction of the Oxford Sustainable Finance Group
  - What are climate risks and why do they matter?
  - 'Alternative data' and open data in operation:
    - Spatial Finance
    - Global Resilience Index Initiative
  - Q&A
-



OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



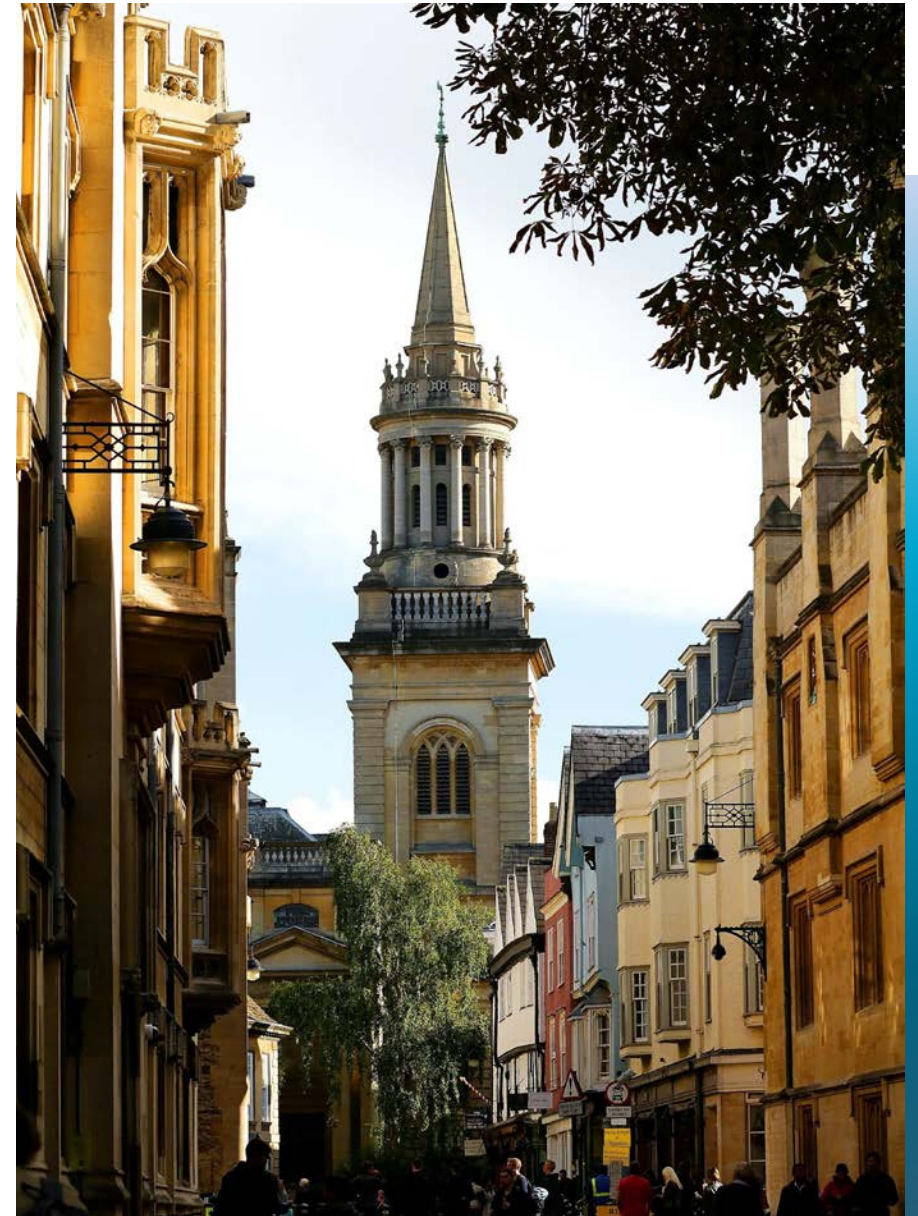
# Short introduction – who are we?



## SHORT INTRODUCTION

# OXFORD SUSTAINABLE FINANCE GROUP

- The world's largest research group focussing on sustainable finance
- **Research themes**
  - Climate and Environmental Analytics
  - Machine Learning & Data Science
  - Spatial Finance
  - Stranded Assets and Transition Finance
  - Future of Engagement
- **Relevant Initiatives**
  - Centre for Greening Finance and Investment
  - Public and Third Sector Academy for Sustainable Finance



# UK CENTRE FOR GREENING FINANCE AND INVESTMENT



# CGFI Team

## CORE TEAM



The Alan Turing Institute



Imperial College London



SPATIAL FINANCE INITIATIVE 



## CROSS-CUTTING PARTNERS



Icebreaker One



## PROFESSIONAL BODIES

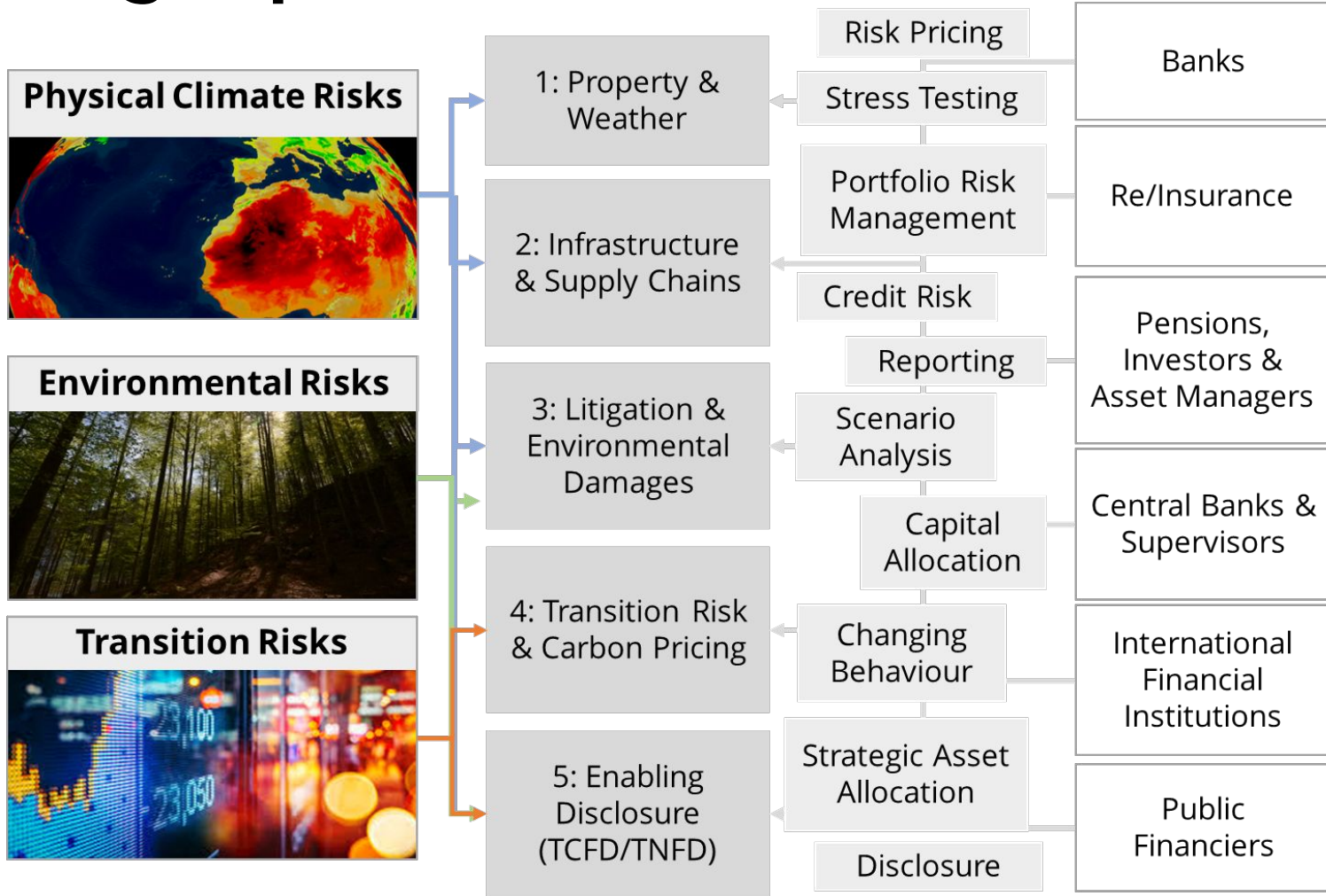
Chartered Banker



## INNOVATION HUBS



# Flagship Overview



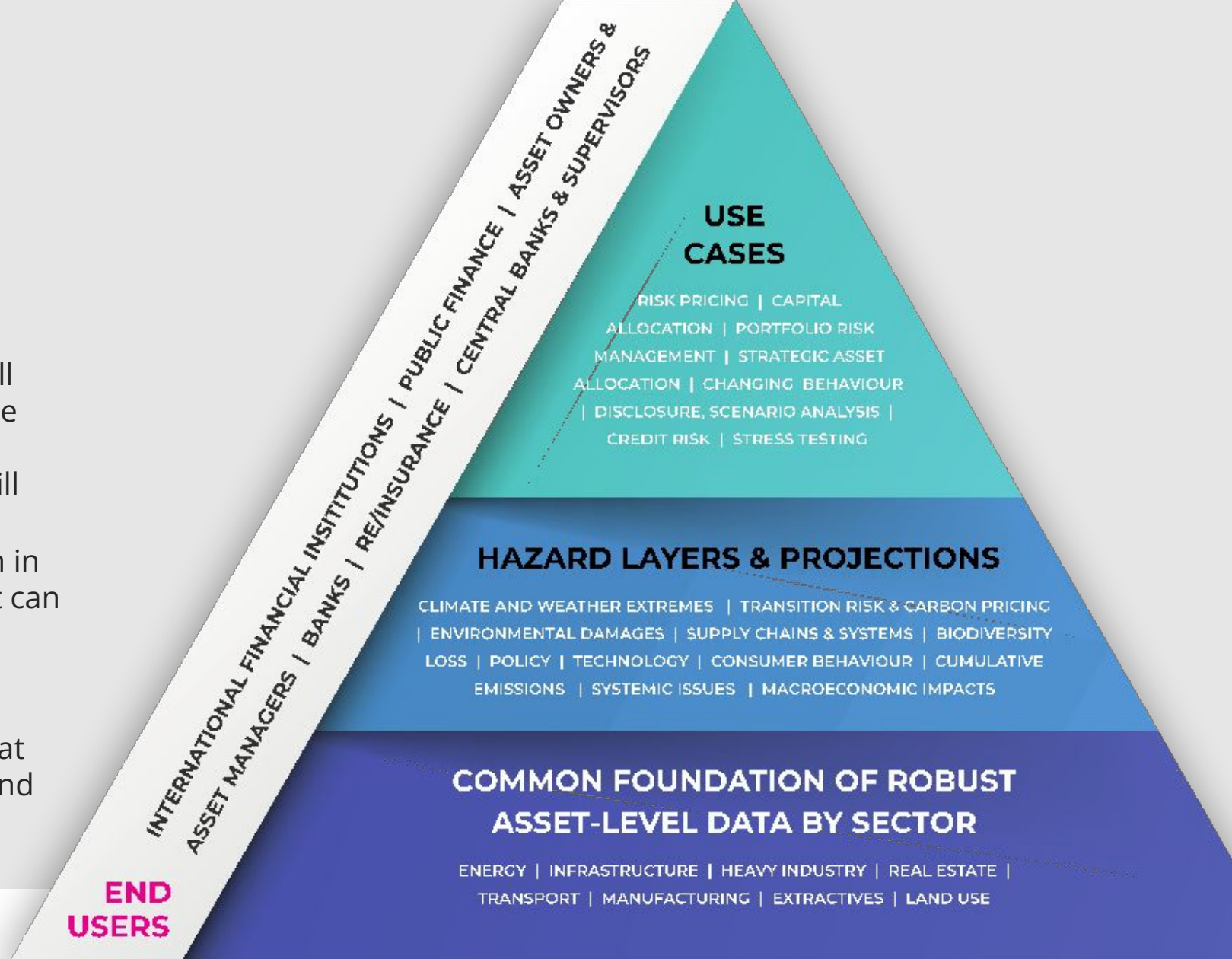


# SCALABLE FOUNDATIONS

From across the flagship projects, the CGFI will draw out products, learning, and good practice that will be shared in the form of standards, guidance, data and analytical products that will be openly available to all.

Each flagship will share a common foundation in being based upon robust asset-level data that can be aggregated up to inform asset-specific, portfolio-level, or macro-financial stability considerations.

Together they form a set of building blocks that cover the key risks, use cases, asset classes, and users, covering trillions of assets.





## Executive Education

- Training current and future leaders is one of our theories of change
- We offer a full range of programmes, including open-enrolment executive education and customised programmes delivered in-person or online
- We also provide undergraduate and graduate teaching and supervision for students enrolled at the University of Oxford.
- Across OxSFG and P3SA in the last 12 months we have provided capacity building to close to 2,000 participants from more than 300 organisations and 110 countries.



# PUBLIC AND THIRD SECTOR ACADEMY FOR SUSTAINABLE FINANCE





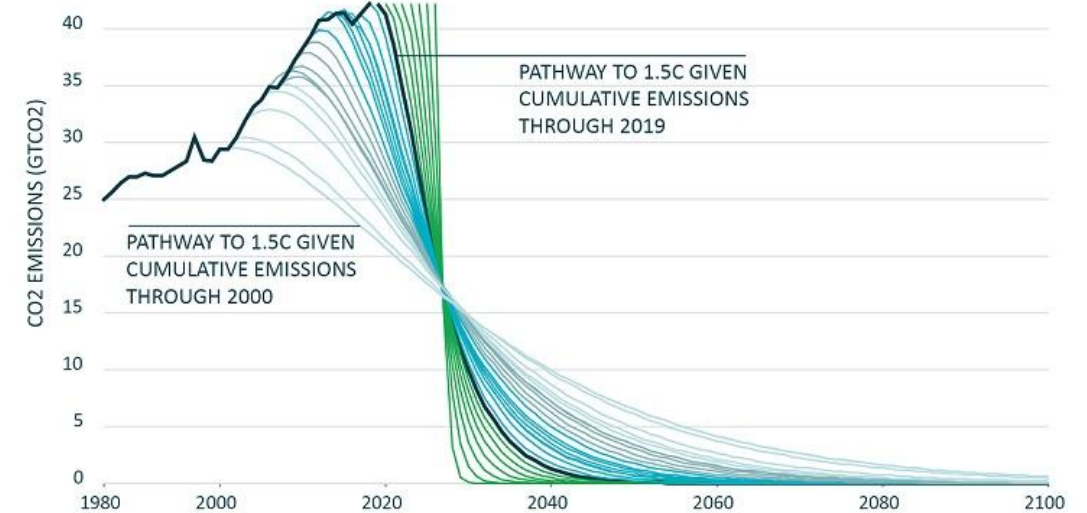
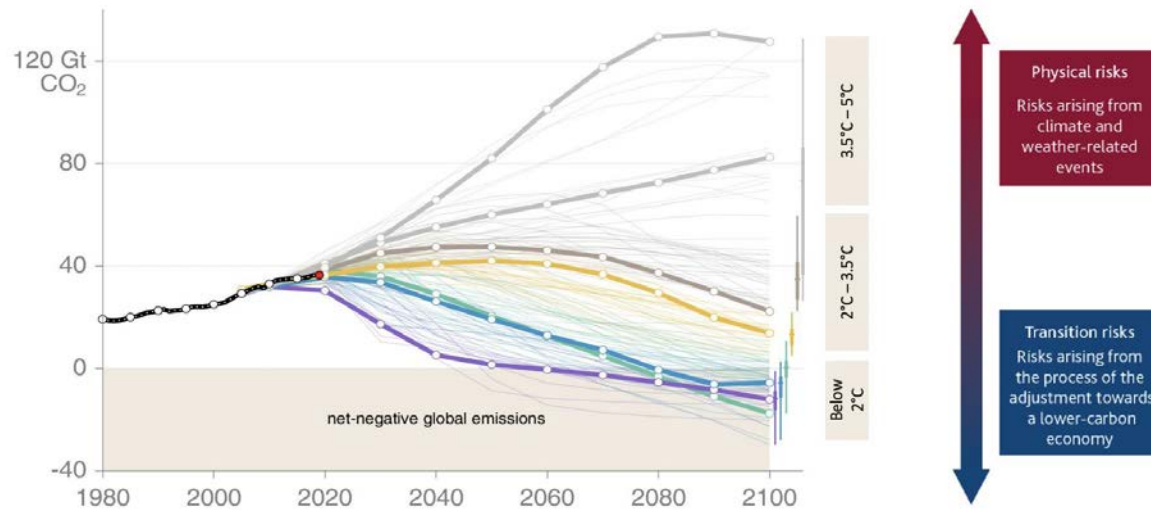


OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



What are climate risks and why do they matter?

# Symbiotic relationship between physical and transitional risks



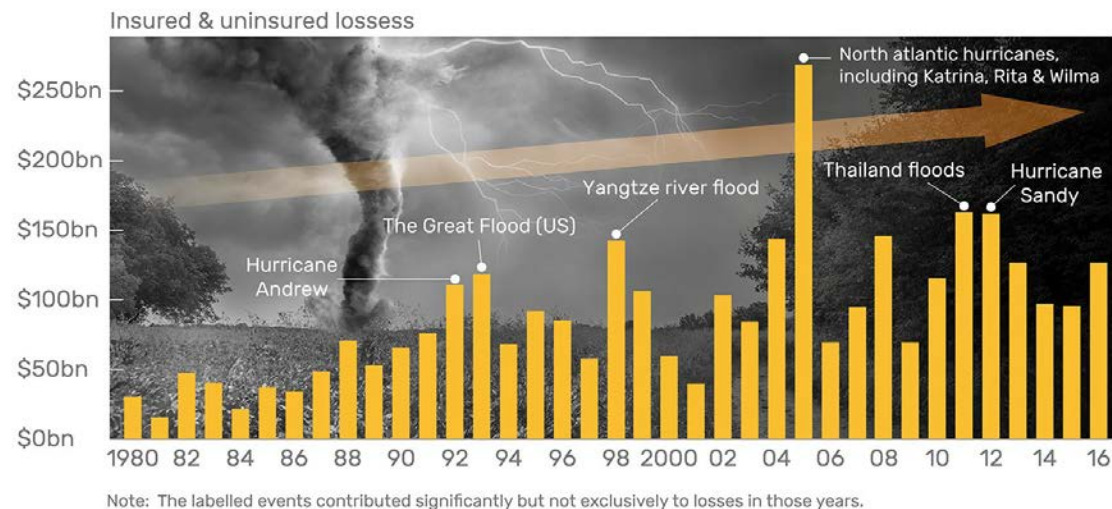
Source: Climate Policy Initiative (2019); Bank of England (2020)



## Physical risks - impact on property and productivity

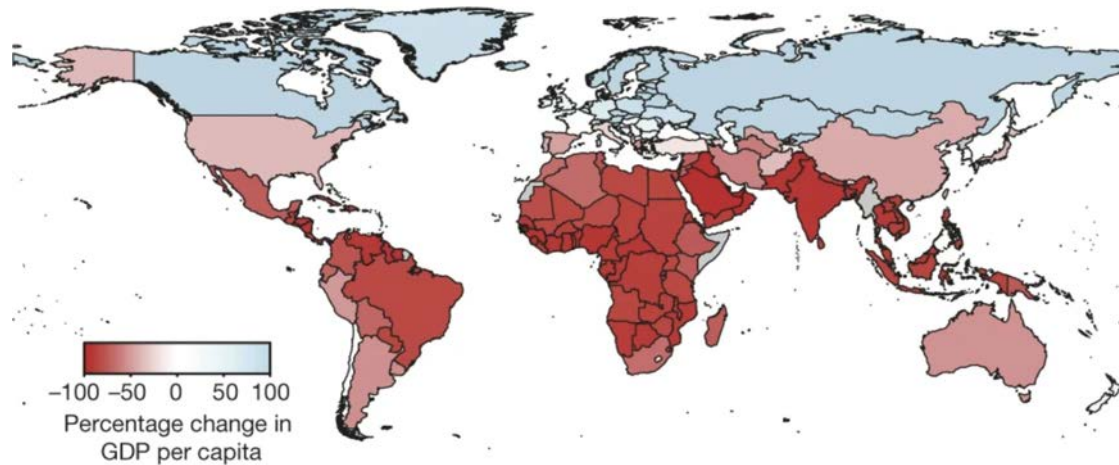
- First order risk of climate change
- Extreme weather events such as flooding, droughts and storms, as well as other types of hazards. These risks are often intensified in a **non-linear, compound manner**
- Important to not underestimate the threat of the **systemic risk** brought by climate change
  - Frequency and severity of tail events
  - Asset repricing
  - Shrinking of historically stable premium and profit pools

Global economic losses from extreme weather events have increased

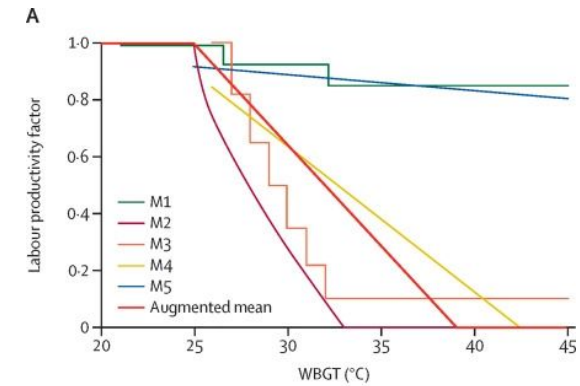


Source: Bank of England 2019

# Physical risks - impact on productivity

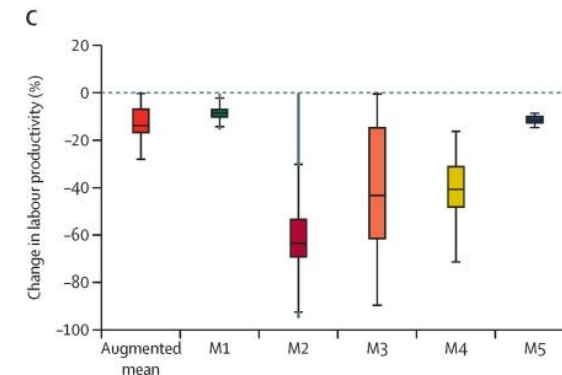


Source: Burke, M., Hsiang, S. M., & Miguel, E. (2015). Global non-linear effect of temperature on economic production. *Nature*, 527(7577), 235-239.; Dasgupta, S., van Maanen, N., Gosling, S. N., Piontek, F., Otto, C., & Schleussner, C. F. (2021). Effects of climate change on combined labour productivity and supply: an empirical, multi-model study. *The Lancet Planetary Health*, 5(7), e455-e465



B

Study	Response variable	Spatial scale
M1: Pilcher et al <sup>10</sup> (2002)	Psychological performance—eg, reaction time, tracking, or memory tasks	Global
M2: Dunne et al <sup>17</sup> (2013)	Individual capacity to safely perform heavy labour under heat stress	Global
M3: Kjellstrom et al <sup>18</sup> (2014)	Reduction of hourly work capacity for heavy work following the ISO standard	Global
M4: Sahu et al <sup>7</sup> (2013)	Work output per hour of rice farmers calculated by number of rice bundles laid down	India
M5: Li et al <sup>19</sup> (2016)	Time efficiency measures; direct, indirect, and idle time of rebar construction workers	China





## Compound risks with nature degradation & biodiversity loss

- Rapid decline of biodiversity and degradation of natural ecological system is posing risk to the economic system
- WEF estimates that USD 44 trillion of economic value generation are moderately or highly dependent on nature
- Biodiversity and climate risks are often **compounded**

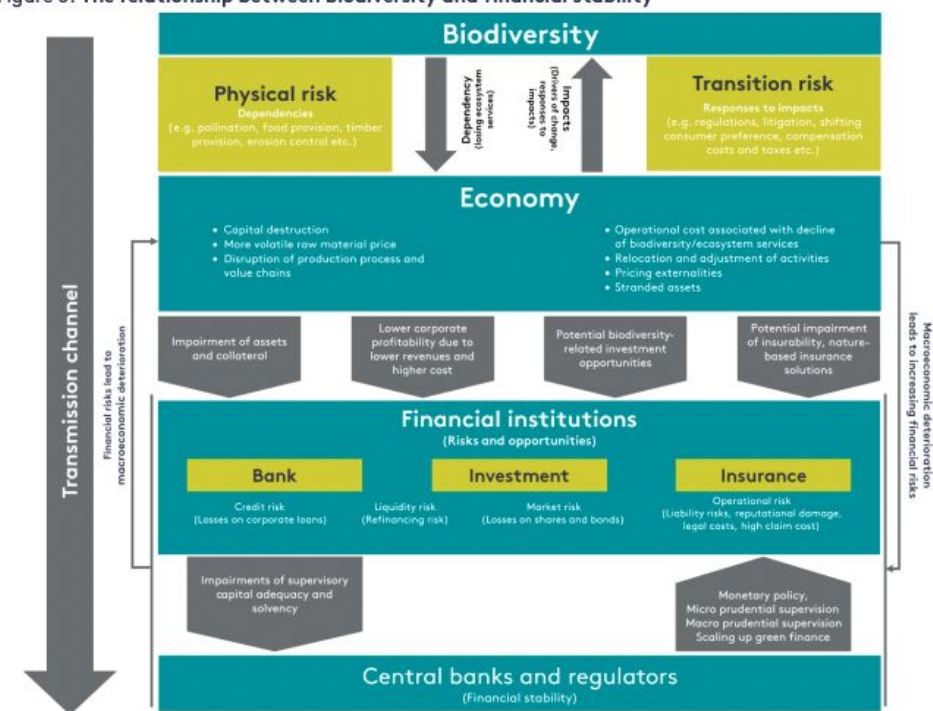


Source: Fermilab N.D.

## Double materiality

- An occasion paper published by INSPIRE and NGFS conceptualised biodiversity-related financial risk as a ‘**double materiality**’
- Stability of the financial system is highly reliant upon the stable provision of ecosystem services
- Current investment behaviours are driving the loss of nature and biodiversity
- Initiative efforts to estimate nature-related biodiversity risks has been undertaken by the central banks of France and the Netherlands, as well as by the Taskforce for Nature-based Financial Risk Disclosure

Figure 3: The relationship between biodiversity and financial stability

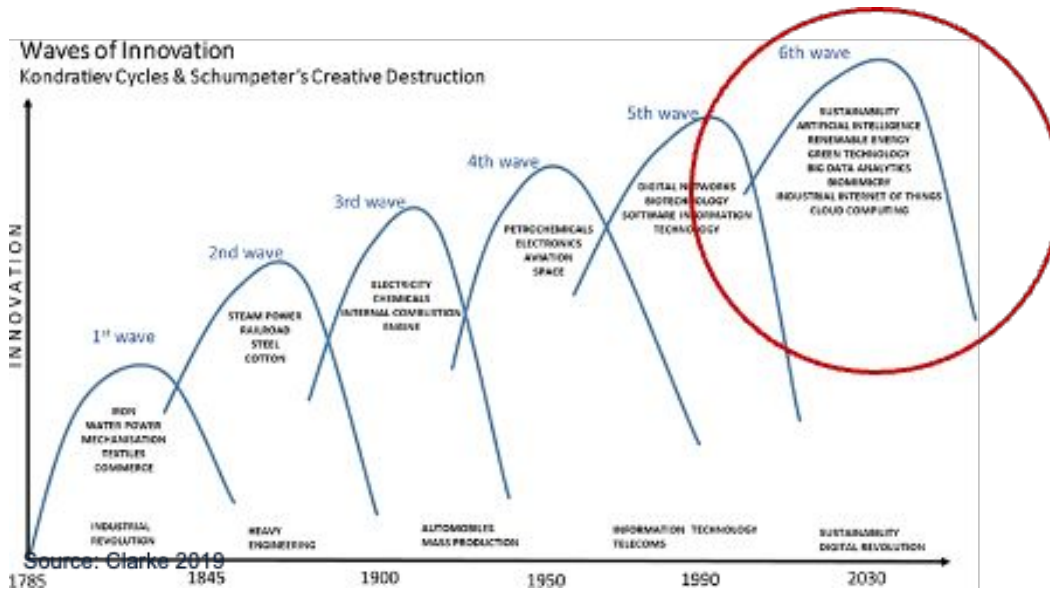


The illustration shows where and how central bank responsibilities are affected by the dynamics between biodiversity loss, financial stability, price stability, and the stability of individual financial institutions.  
Source: NGFS-INSPIRE

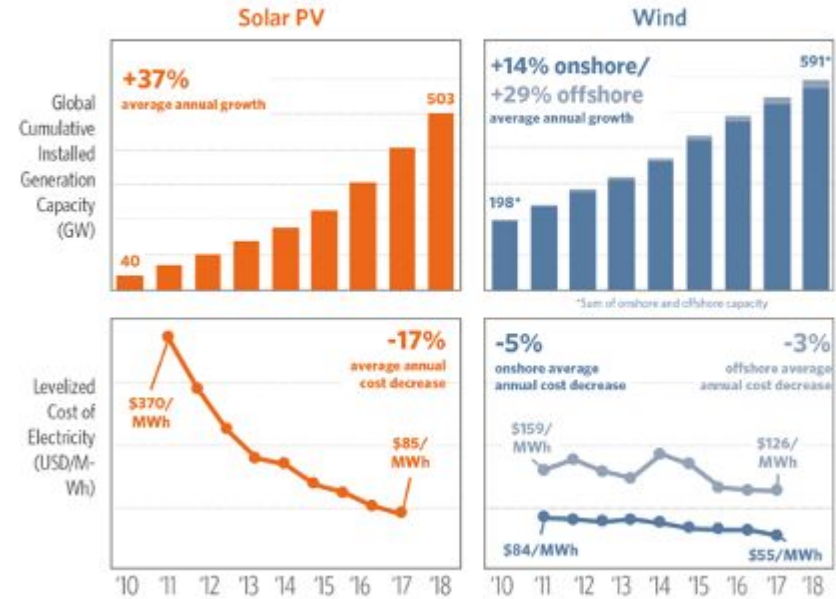
Source: NGFS-INSPIRE (2020)



# Technological risks



Global installed capacity and levelized electricity cost, solar PV and wind, 2010-2018



Source: Climate Policy Initiative (2019)



## Regulatory risks

- In 2015, Bank of England was the first central bank to highlight the climate-related risks faced by the insurance sector, with the view of informing supervisory changes
- NGFS found that 94% of its members have established international organization to address climate-related risks, 78% have included climate-related risks in their supervisory activities and 64% have already/in the process of implementing climate-related risk assessments
- Increased regulatory pressure and liability risk

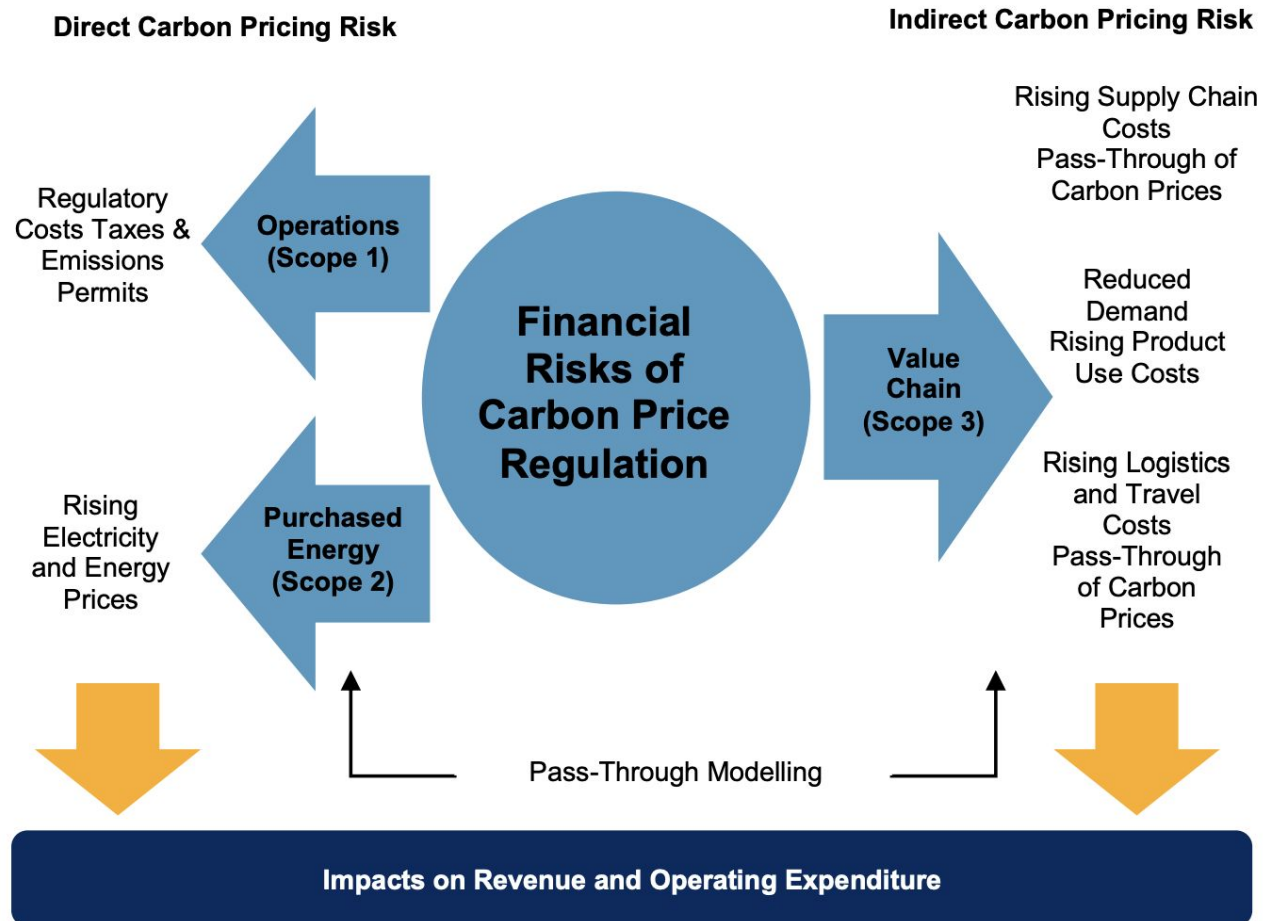


### The impact of climate change on the UK insurance sector

A Climate Change Adaptation Report by the Prudential Regulation Authority

September 2015

# Policy risk: Carbon Pricing

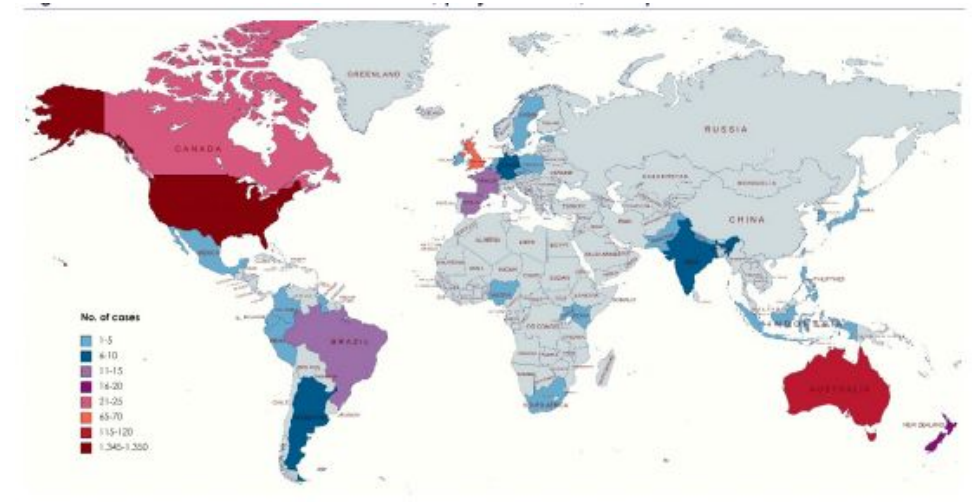


Source: Trucost. Data as of December 2017. Chart is provided for illustrative purposes.



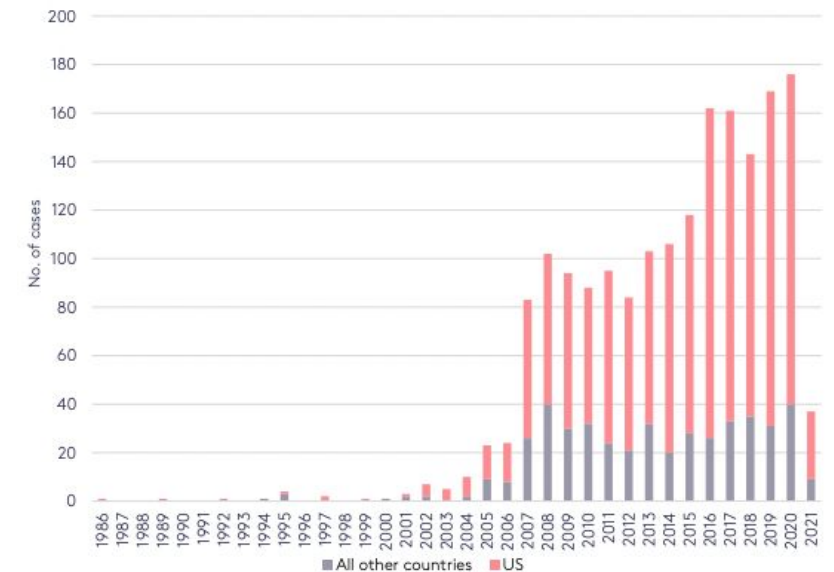
## Litigation risk

- At the wake of the 2017 North Atlantic hurricane season, there is growing interest in attributing the causes and liabilities of extreme weather events. Marjanac and Patton (2017) observed that “advancements in attribution science are poised to alter significantly the legal landscape for climate-related suits” (Marjanac and Patton 2017: 266)
- The latest scientific developments could overcome historic challenges of inadequacy of causal evidence (Stuart-Smith et al. 2021)

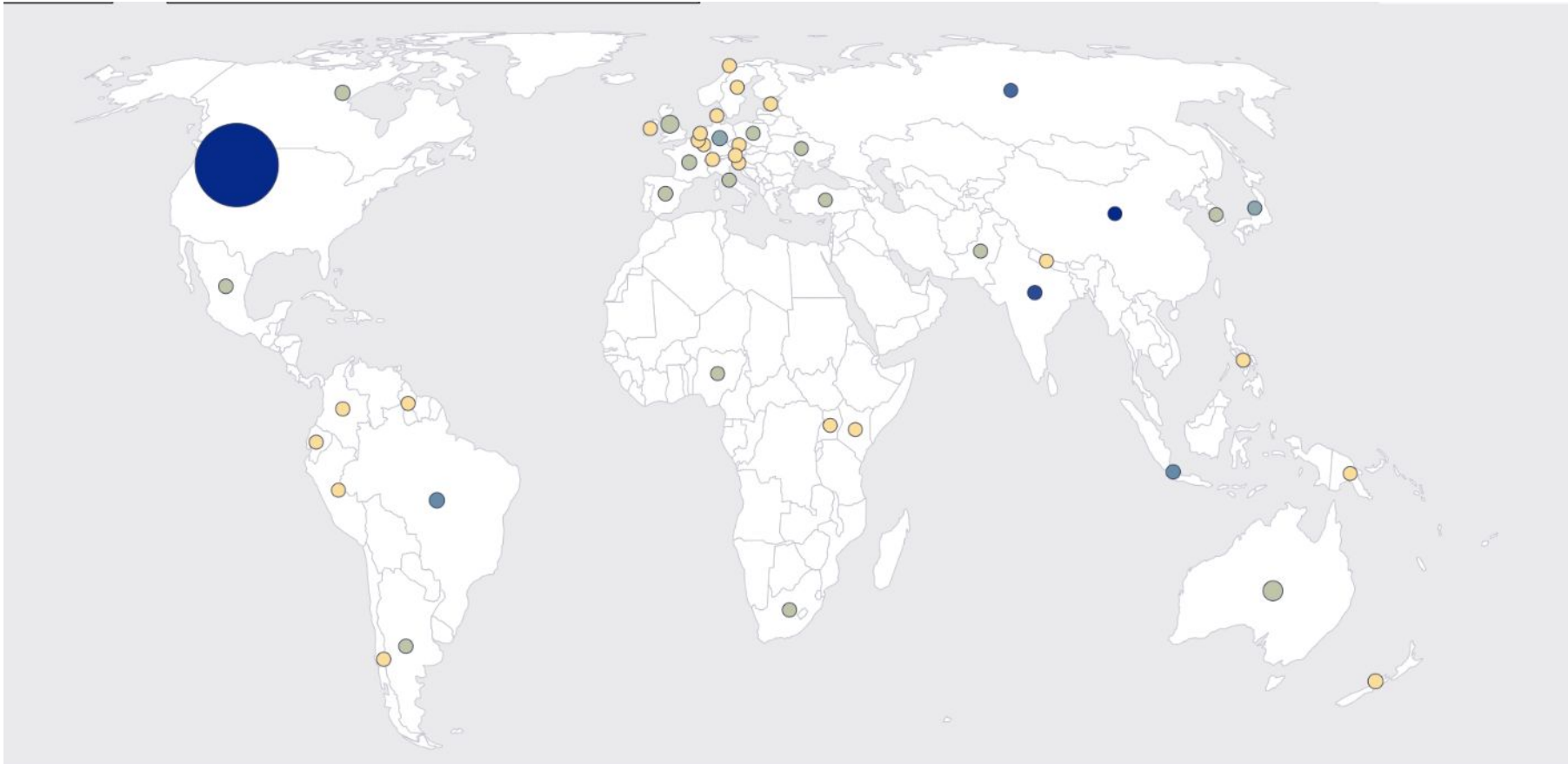


Notes: Cumulative figures to May 2021. Map created with mapchart.net.  
Source: Authors based on CCLW and Sabin Center data

Figure 1.1. Total cases over time, US and non-US, to 31 May 2021



# Relationship between emissions and litigation risks



Source: LSE Grantham Institute N.D.

## Reputational risk

- Shifting societal awareness and demand for corporate responsibility over climate and other sustainability issues
- Firms can suffer from severe publicity backlash for greenwashing or involving in environmentally damaging activities



26<sup>th</sup> October 2022

Climate Capital HSBC Holdings PLC + Add to myFT

### HSBC ads banned for misleading consumers about green credentials

UK watchdog rules series publicising tree planting and net zero emissions plans failed to disclose fossil fuel financing



The ruling by the Advertising Standards Authority sets a precedent for the financial sector





OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



What are some examples of innovation approaches to climate risk?

## Stress-test exposure against projected climate risks

- BoE's 2021 Climate Biennial Exploratory Scenario test explores the resilience of the UK financial system to the physical and transition risks
- Assume high peak carbon price, severe levels of global warming (3.3°C) and limit credit for management action
- The design of the BoE test make it likely that some insurers will breach their solvency levels
- Learning exercise to build climate-modelling capacity, better understand risk exposure and assist in risk management

	Early Action	Late Action	No Additional Action
<b>Transition risks</b>	Medium	High	Limited
Transition begins in	2021	2031	n.a.
Nature of transition	Early and orderly	Late and disorderly	Only policies that were in place before 2021
Peak UK shadow carbon price (carbon tax and other policies) (2010 US\$/tonne carbon dioxide equivalent)	900	1,100	30
<b>Physical risks</b>	Limited	Limited	High
Mean global warming relative to pre-industrial times by the end of scenario (°C)	1.8	1.8	3.3
Mean sea level rise in the UK (m)	0.16	0.16	0.39
<b>Impact on output</b>	Temporarily lower growth	Sudden contraction (recession)	Permanently lower growth and higher uncertainty
Average annual output growth in the UK (per cent)	1.4, 1.5, 1.6	1.5, 0.1, 1.6	1.4, 1.4, 1.2
	Year 6-10, Year 11-15, Year 26-30	Year 6-10, Year 11-15, Year 26-30	Year 6-10, Year 11-15, Year 26-30

Image source: Bank of England 2021



## Contribute to risk mitigation and adaptation

- Innovative products and policies can help customers mitigate both *acute* and *chronic* risks
  - Parametric pricing
  - Catastrophe bonds
  - Resilience bonds
  - Start Network: providing funding for predictable crises

**START**  
**NETWORK**





## Build resilient portfolios

- Insurers can build greater resilience by adjusting their exposure to climate risk, e.g. re-considering the frequency and likelihood of catastrophic events and diversifying their portfolio, taking into account of non-historic data
- A study by AXA (2021) show that 60% of risk managers fear that certain geographies or activities will become uninsurable
- Insufficient data and capacity to interpret climate data limits the accuracy of loss estimates, especially compound risks



OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



UNIVERSITY OF  
OXFORD

# Towards an asset-level based approach







### ASSETS



EXPOSED TO  
DIFFERENT  
ENVIRONMENTAL  
RISKS AND  
OPPORTUNITIES

### COMPANIES



OWN  
EXPOSED  
ASSETS

### ASSET MANAGERS AND BANKS



OWN  
COMPANY  
DEBT AND  
EQUITY

### ASSET OWNERS



ALLOCATE  
CAPITAL TO  
ASSET  
MANAGERS  
OR ACT AS  
ASSET  
MANAGERS  
THEMSELVES

### POLICYMAKERS AND REGULATORS



MANAGE  
MICROPRUDENTIAL  
RISK, SYSTEMIC  
RISK, ECONOMIC  
GROWTH, AND  
WANT TO  
IMPLEMENT NDCs  
SUCCESSFULLY



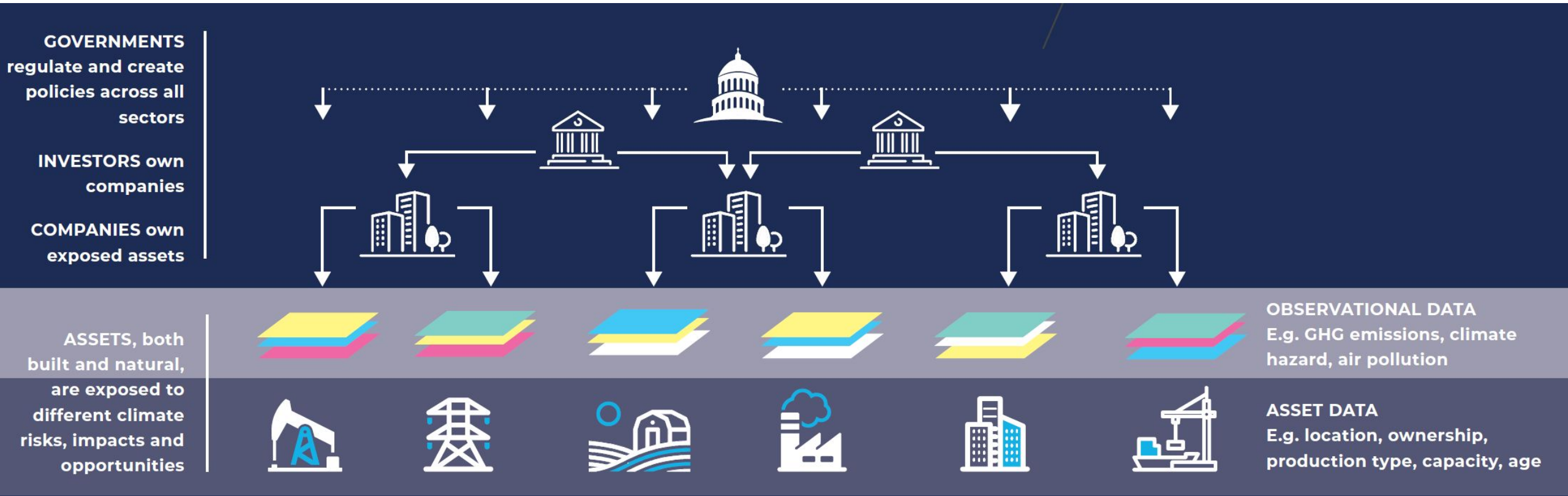


OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



# Spatial Finance

# SPATIAL FINANCE AND ASSET-LEVEL DATA





The UK Centre for Greening Finance and Investment (CGFI) is a national centre established to accelerate the adoption and use of climate and environmental data and analytics by financial institutions internationally. It will unlock opportunities for the UK to lead in greening finance and financing green.

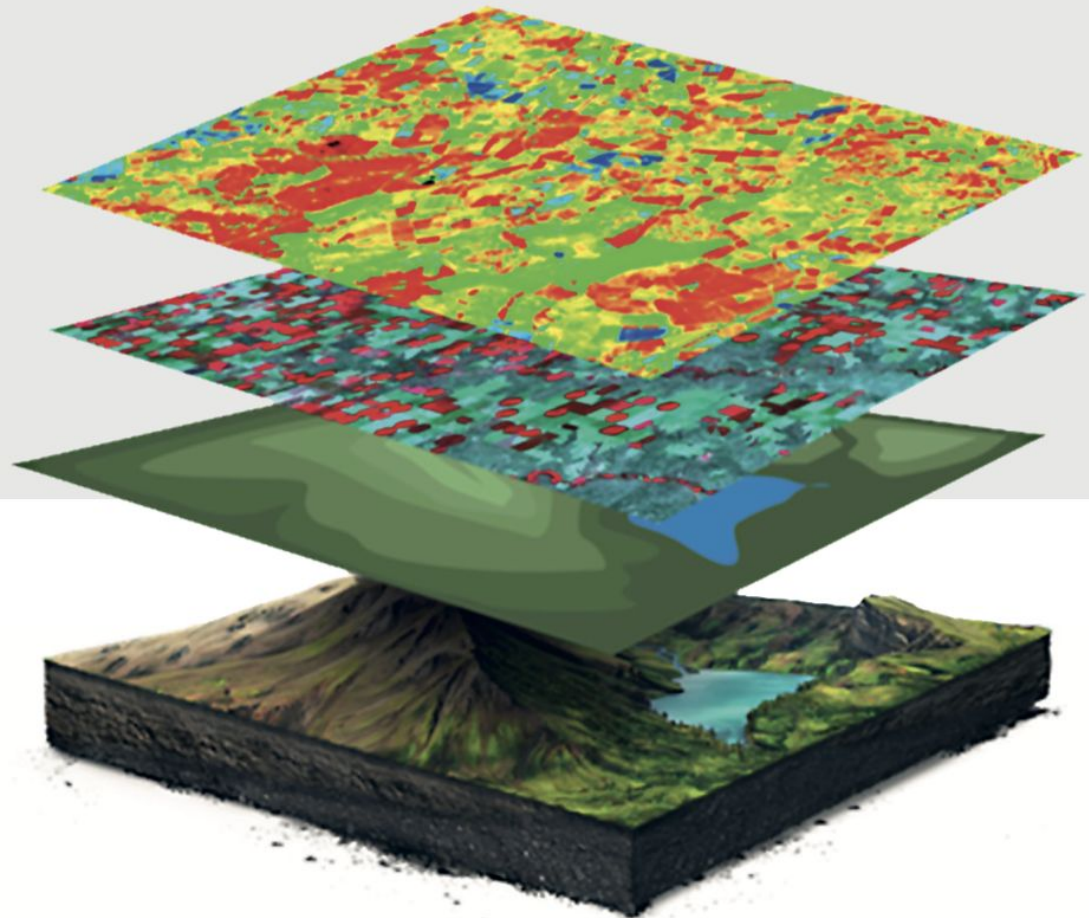
## ULTIMATE VISION

**Financial institutions able to access and use climate and environmental data and analytics for:**

- Any point on earth
- Past, present, and future
- Every major sector
- Material climate and environmental factors

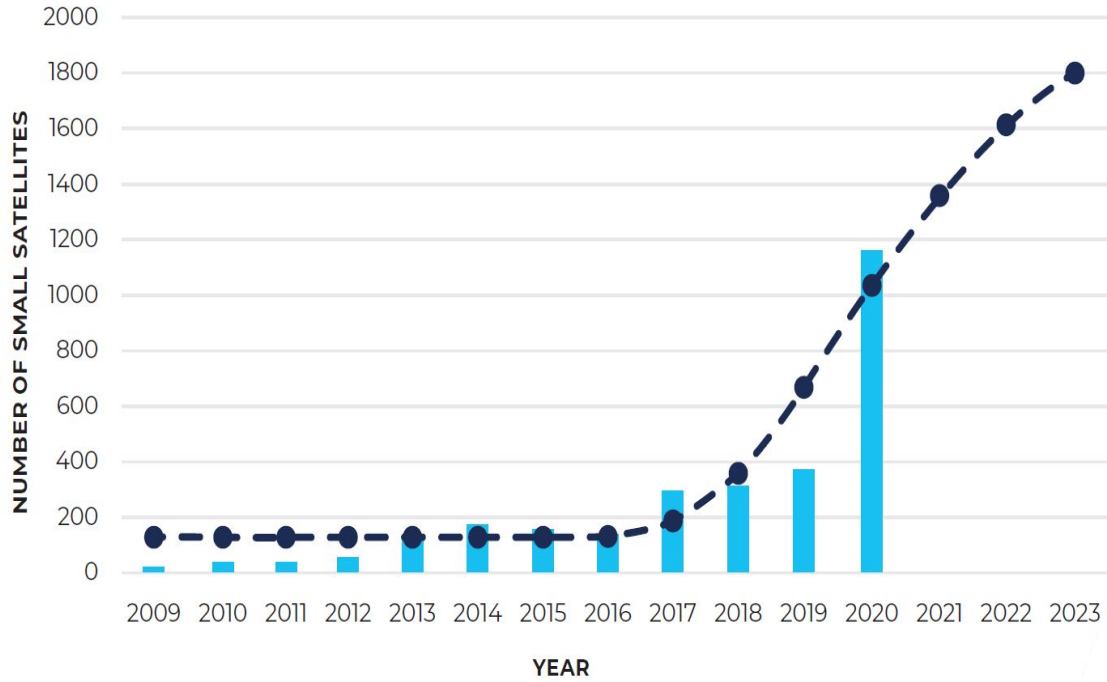
## SUCCESS WILL MEAN

- Enhanced solvency of financial institutions
- Reallocation of capital towards green
- Resilient global financial system
- Realise the opportunity for UK plc

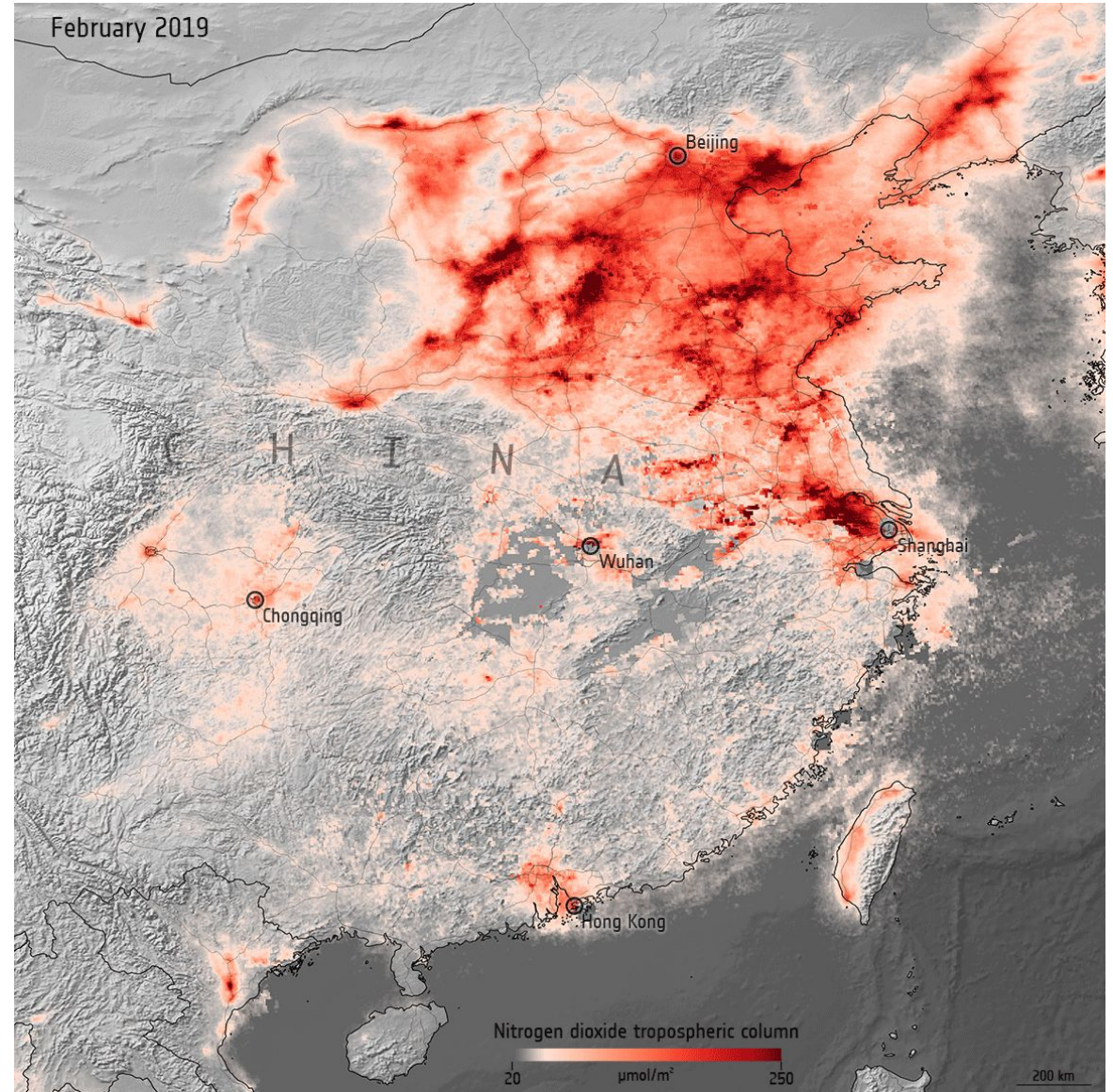




# OBSERVATIONAL DATA



Number of small satellites launched, historical (columns) and modelled (line)  
Credits: Satellite Applications Catapult



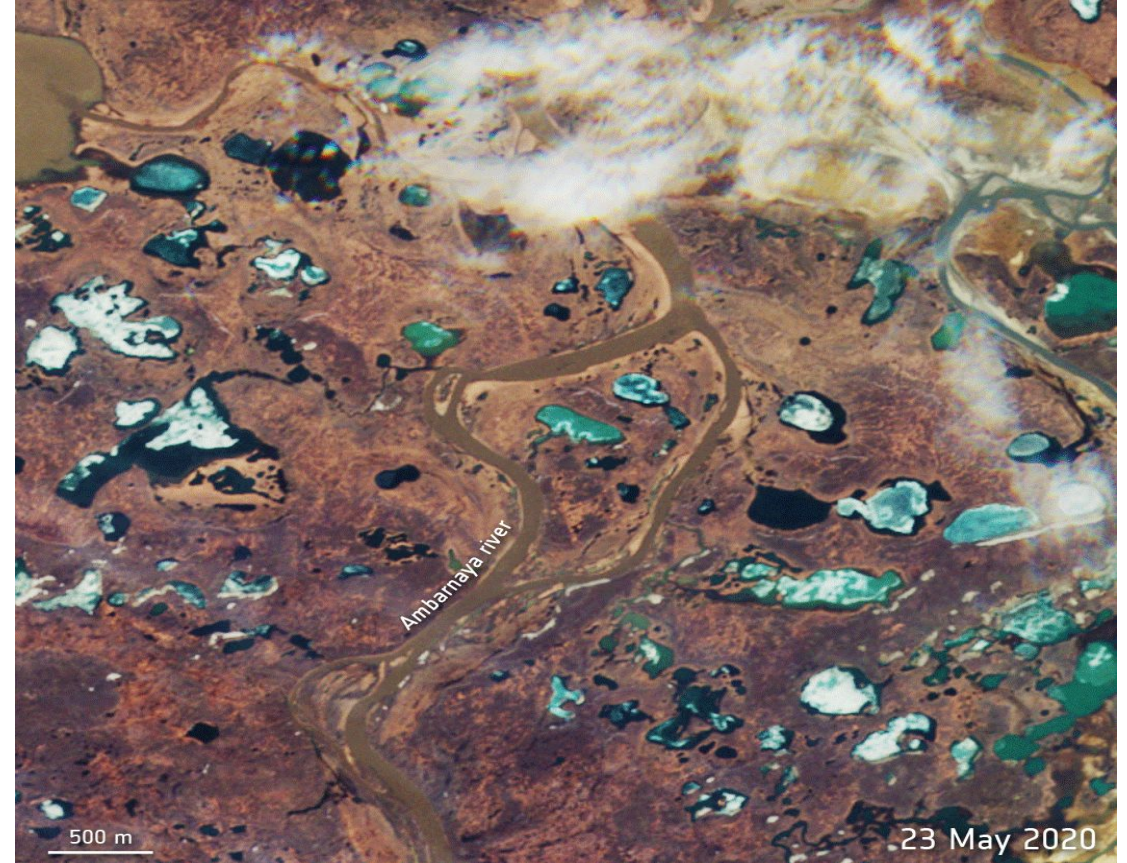
Nitrogen dioxide emissions over China  
Credits: ESA



# OBSERVATIONAL DATA



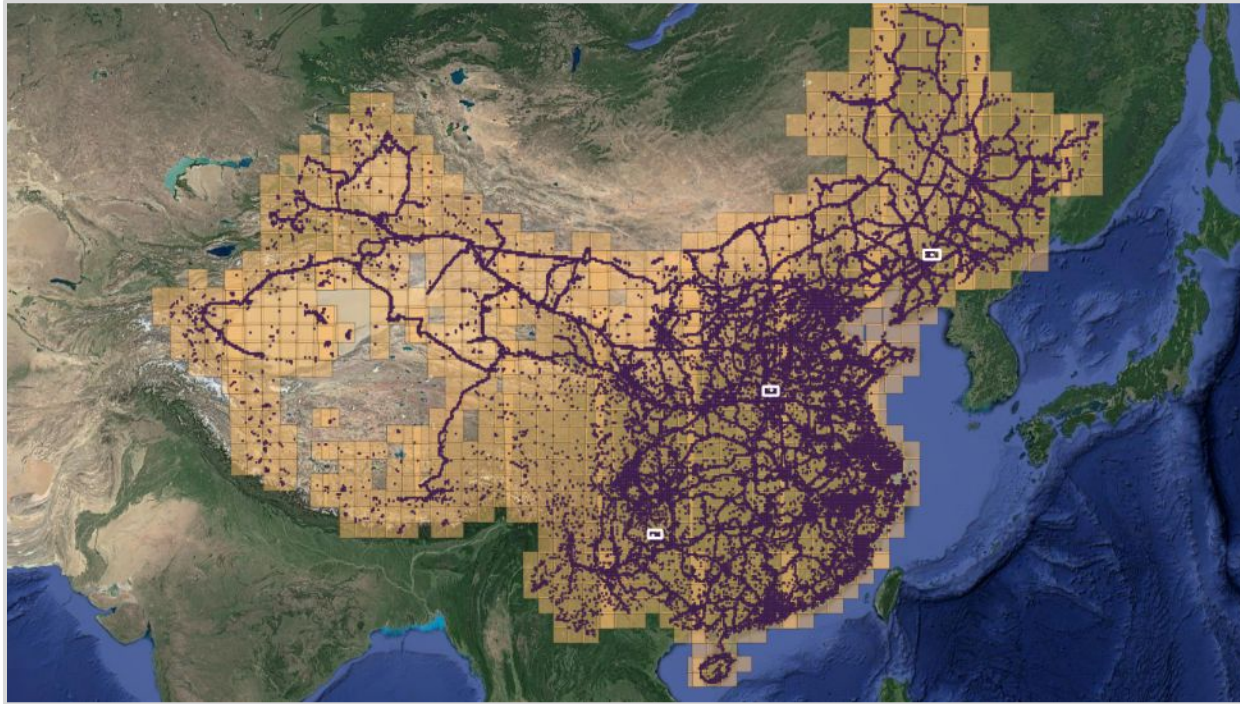
Deforestation in Colombian Amazon  
Credits: Planet Labs Inc



Arctic oil spill Russia  
Credits: ESA



# GEOASSET: DIGITAL FOOTPRINT OF GLOBAL ECONOMY



New Plant



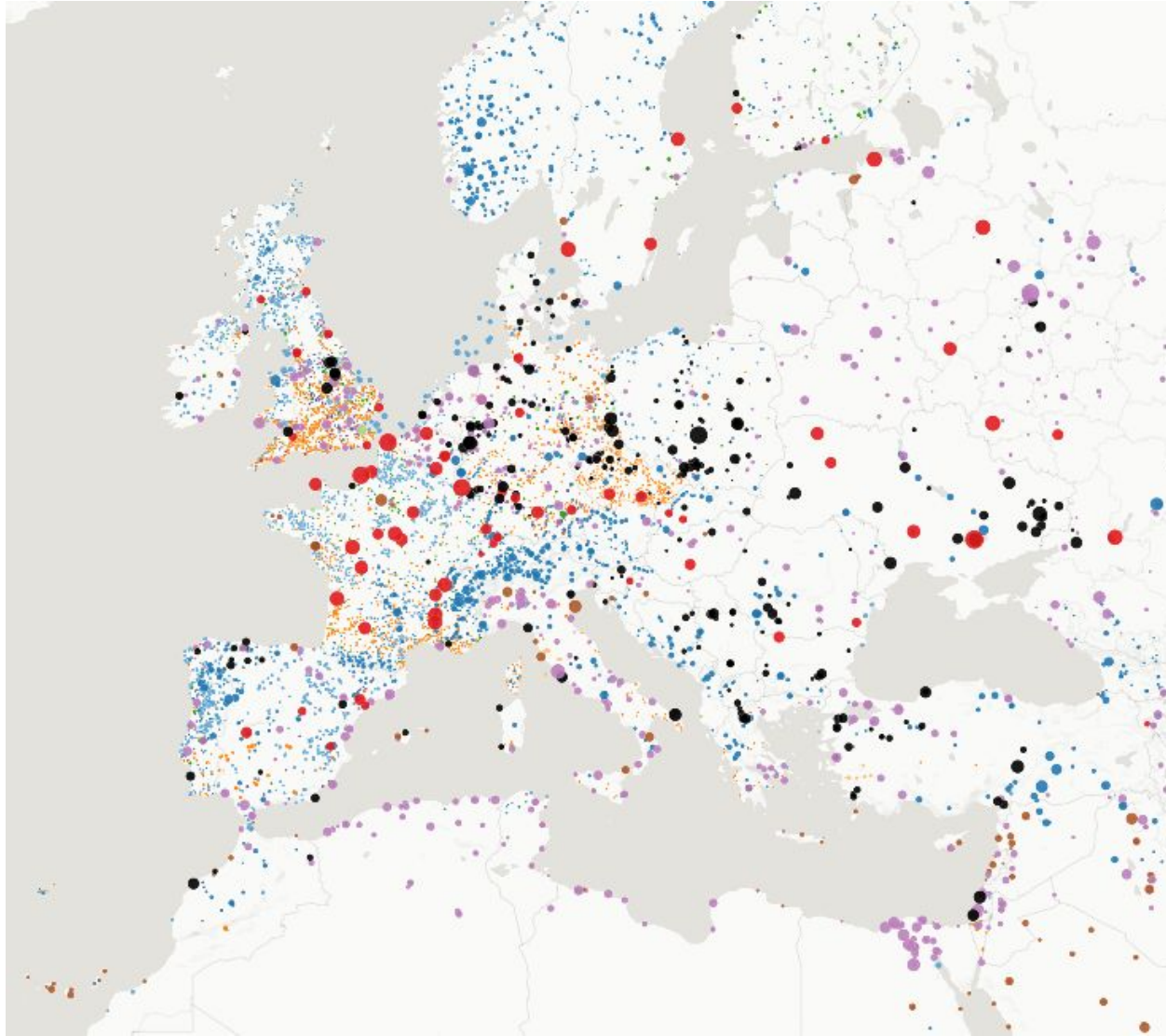
Known Plant



False Positive

Source: Spatial Finance Initiative, Astraea Inc

# ASSET DATA



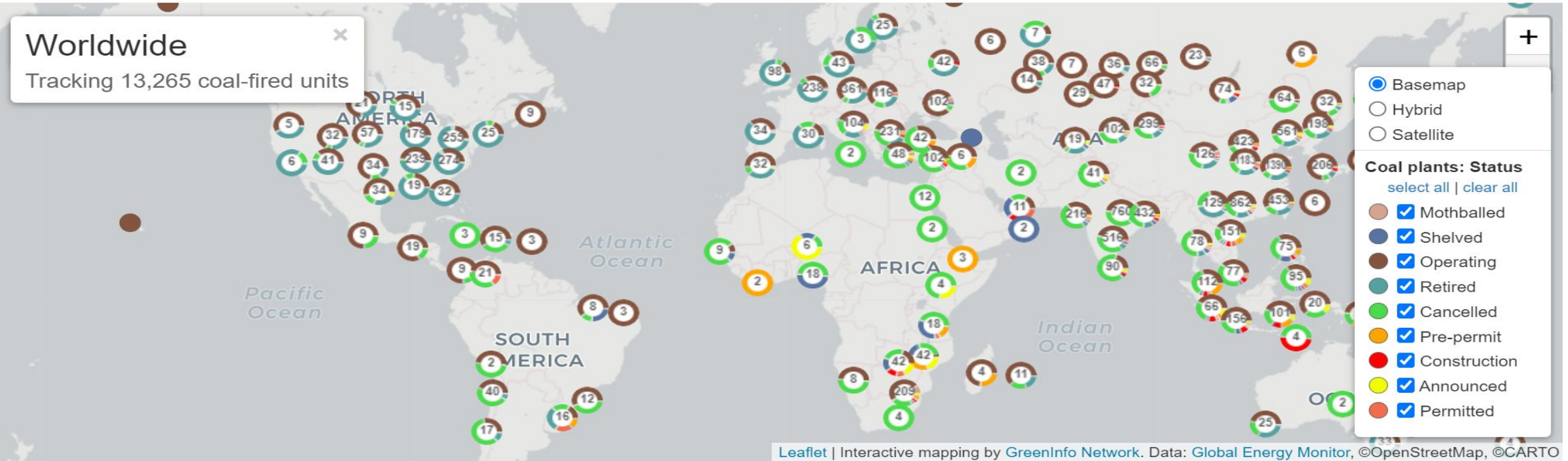
Global Power Plants Database  
Credits: Global Energy Observatory, Google, KTH Royal Institute of Technology  
in Stockholm, Enipedia, World Resources Institute. 2018



# ASSET DATA

 **Global Energy Monitor** | Global Coal Plant Tracker ▾ | **MAP** | DASHBOARD

Map | Table | About | Summaries | Restart | Search  ▾ for  🔍



Global Coal Plant Tracker  
Credits: Global Energy Monitor



# ASSET CHARACTERISATION

## Jindal Steel Bolivia, Midrex to construct world's largest capacity single Direct Reduction (DR) module

Jindal Steel Bolivia, a subsidiary of Jindal Steel & Power Ltd. (JSPL) of India, will build a 2.52 MMTPA natural-gas-based MIDREX® Direct Reduction Plant at EL-Mutun, Puerto Suarez, Bolivia, South America. The new MIDREX® Plant will be the largest single module till date of any commercial direct reduction technology in the world. The contract for this new MIDREX® Plant was signed on March 30, 2011.

The project will be known as the Naveen Ultra Mega Mod DRI and will feature the latest MIDREX® Shaft Furnace innovations and will have the flexibility to produce both quality Hot DRI and Hot Briquetted Iron for use in a new proposed greenfield meltshop. Iron Ore and Iron Pellets will be supplied from Jindal Steel's El Mutun Iron Ore Reserves in Bolivia, where Jindal Bolivia is also installing a Pellet Plant and a Steel Making facility.

Based on the stellar performance of MIDREX® DRI Plants, this new facility at Jindal Steel Bolivia will be capable of producing more than the rated capacity -- making it truly the world's largest single module DR plant. The Naveen Ultra Mega Mod plant can produce up to 2.70 million metric ton per year of DRI depending upon the quality of inputs, operating parameters and skill of the workforce.

This is the third time that JSPL is making use of the MIDREX® Direct Reduction Process technology for its commercial DR production. In 2009, JSPL contracted with Midrex Technologies, Inc. for a 1.8 million ton per year coal gasification-based MXCOL® Direct Reduction Plant in Angul, Orissa, India. The MXCOL plant commercially pairs a 7.15 meter MIDREX® Shaft Furnace with available gasification technology from Lurgi GmbH of Germany, to produce DRI for use in meltshop applications. In 2010, JSPL acquired the former Shadeed MIDREX® HOTLINK® plant in Sohar, Oman. Renamed as Jindal Shadeed Iron & Steel, the plant was commissioned successfully and has been producing HBI since December, 2010.

Facility

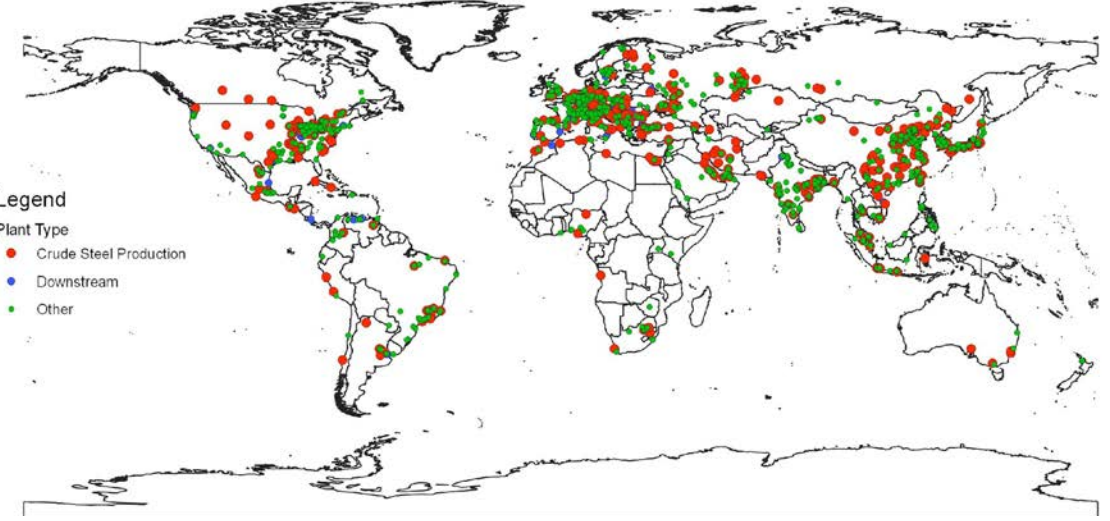
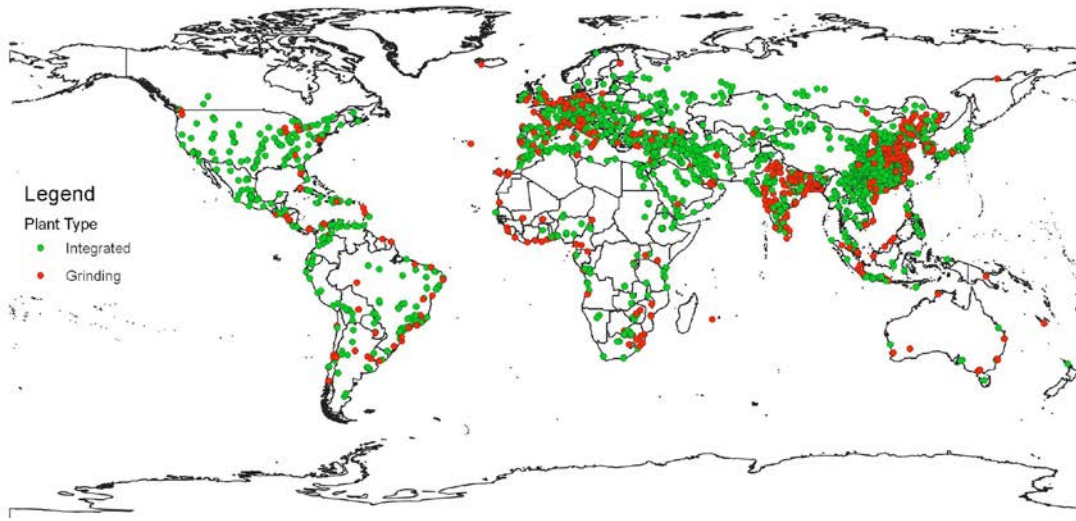
Entity Relation

Production capacity

Innovation/Technology

Location

# CEMENT AND STEEL PRODUCTION ASSETS



	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P
1	uid	city	state	country	iso3	country_code	region	sub_region	latitude	longitude	accuracy	status	plant_type	production_type	capacity	capacity_source
2	GACTAFG0001	Pol-e Khomri	Baghlan	Afghanistan	AFG	4	Asia	Southern Asia	35.9658	68.686338	Exact	Operating	Integrated	Wet	0.36	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
3	GACTAFG0002	Injil	Herat	Afghanistan	AFG	4	Asia	Southern Asia	34.322144	61.953503	Exact	Under Construction				
4	GACTAGO0001	Luanda	Luanda	Angola	AGO	24	Africa	Sub-Saharan Africa	-8.766173	13.316051	Exact	Operating	Integrated		1.2	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
5	GACTAGO0002	Cacuaco	Luanda	Angola	AGO	24	Africa	Sub-Saharan Africa	-8.796392	13.42678	Exact	Operating	Integrated	Dry	1.83	Estimated
6	GACTAGO0003	Lobito	Benguela	Angola	AGO	24	Africa	Sub-Saharan Africa	-12.342644	13.581766	Exact	Operating	Grinding		0.35	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
7	GACTAGO0004	Sumbe	Kwanza-Sul	Angola	AGO	24	Africa	Sub-Saharan Africa	-11.185243	14.030804	Exact	Operating	Integrated	Dry	1.4	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
8	GACTAGO0005	Ícolo e Bengo	Bengo	Angola	AGO	24	Africa	Sub-Saharan Africa	-9.101295	13.567408	Exact	Operating	Integrated	Dry	4	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
9	GACTAGO0006	Benguela	Benguela	Angola	AGO	24	Africa	Sub-Saharan Africa	-12.537825	13.496729	Exact	Operating	Grinding		0.7	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
10	GACTALB0001	Rrethi i Lezhës	Qarku i Lezhës	Albania	ALB	8	Europe	Southern Europe	41.83677	19.63345	Exact	Operating	Grinding		0.5	<a href="https://prd-wret.s3">https://prd-wret.s3</a>
11	GACTALB0002	Rrethi i Krujës	Qarku i Durrësit	Albania	ALB	8	Europe	Southern Europe	41.503079	19.743606	Exact	Operating	Integrated	Dry	1.33	<a href="https://prd-wret.s3">https://prd-wret.s3</a>

Global Database of Cement Production Assets & Global Database of Iron and Steel Production Assets

Credits: Spatial Finance Initiative

<https://www.cgfi.ac.uk/spatial-finance-initiative/geoasset-project/geoasset-databases/>



# GEOASSET INDUSTRIES

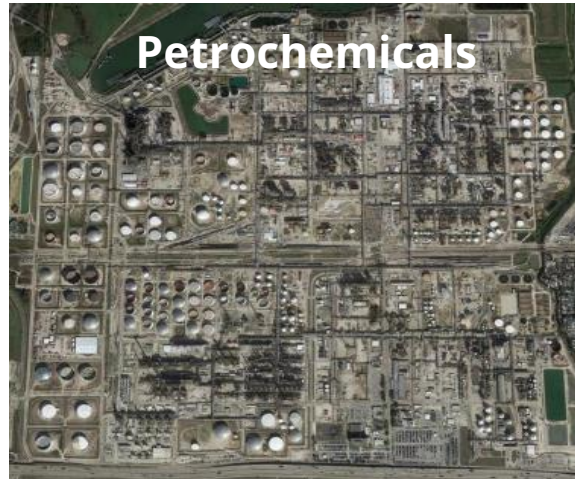
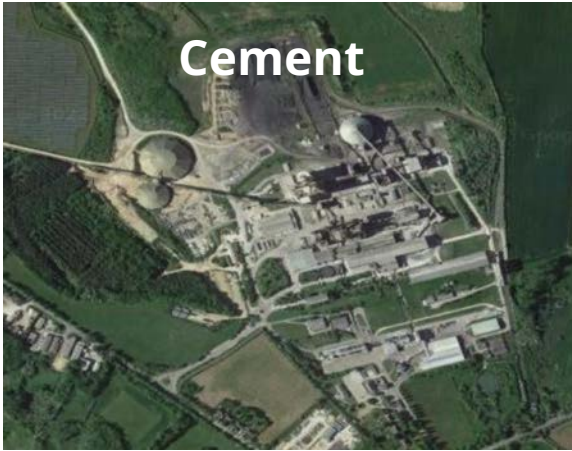
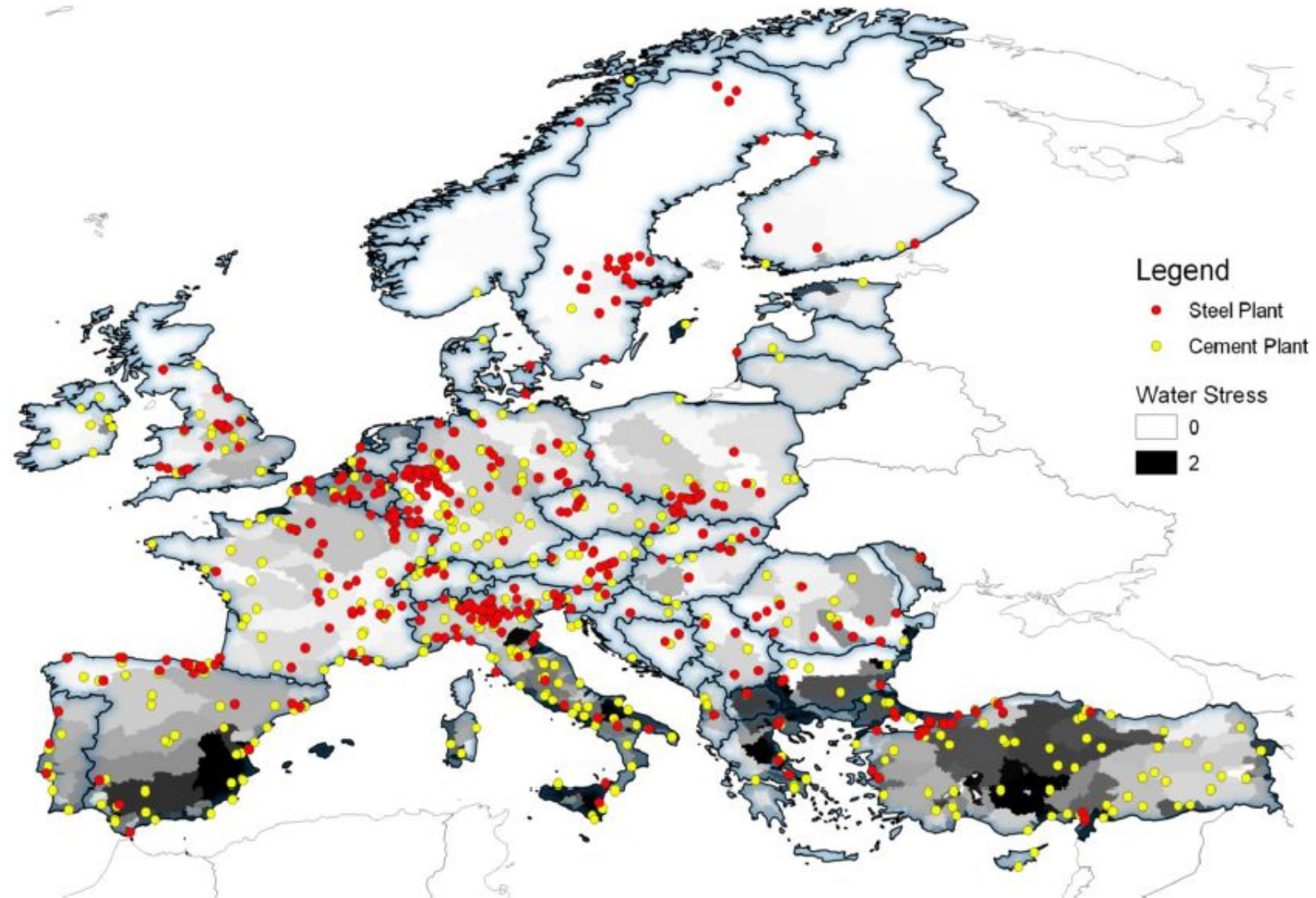


Image credits: Google



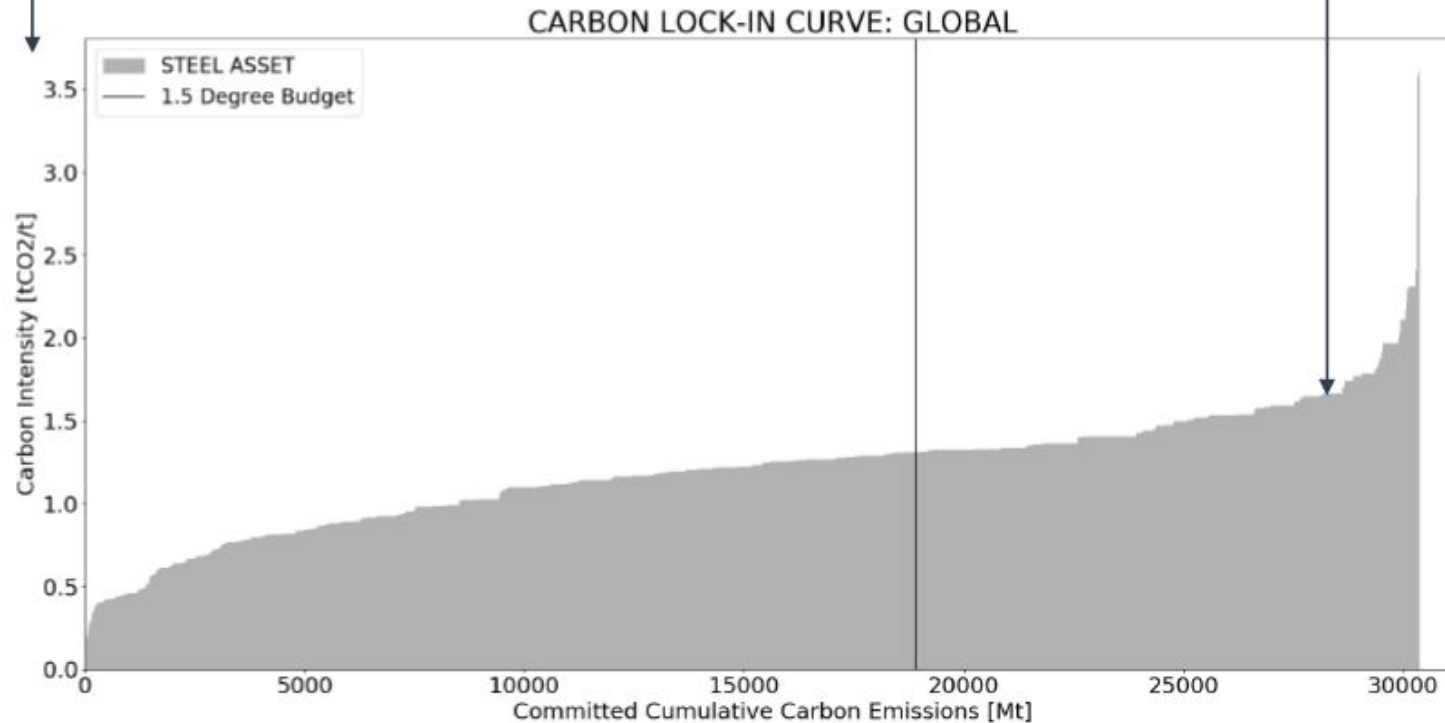
# PHYSICAL RISK

- Using the location information and physical risk layers it is possible to derive the physical risk exposure to both sectors, with a higher degree of granularity than has been possible with existing asset-level datasets
- On the right is a representation of this process where water stress risk in Europe has been overlaid on the steel and cement plant locations
- These physical risk metrics can then be aggregated up to company/country/portfolio/global level to better understand overall risk



# TRANSITION RISK – CARBON LOCK-IN CURVES

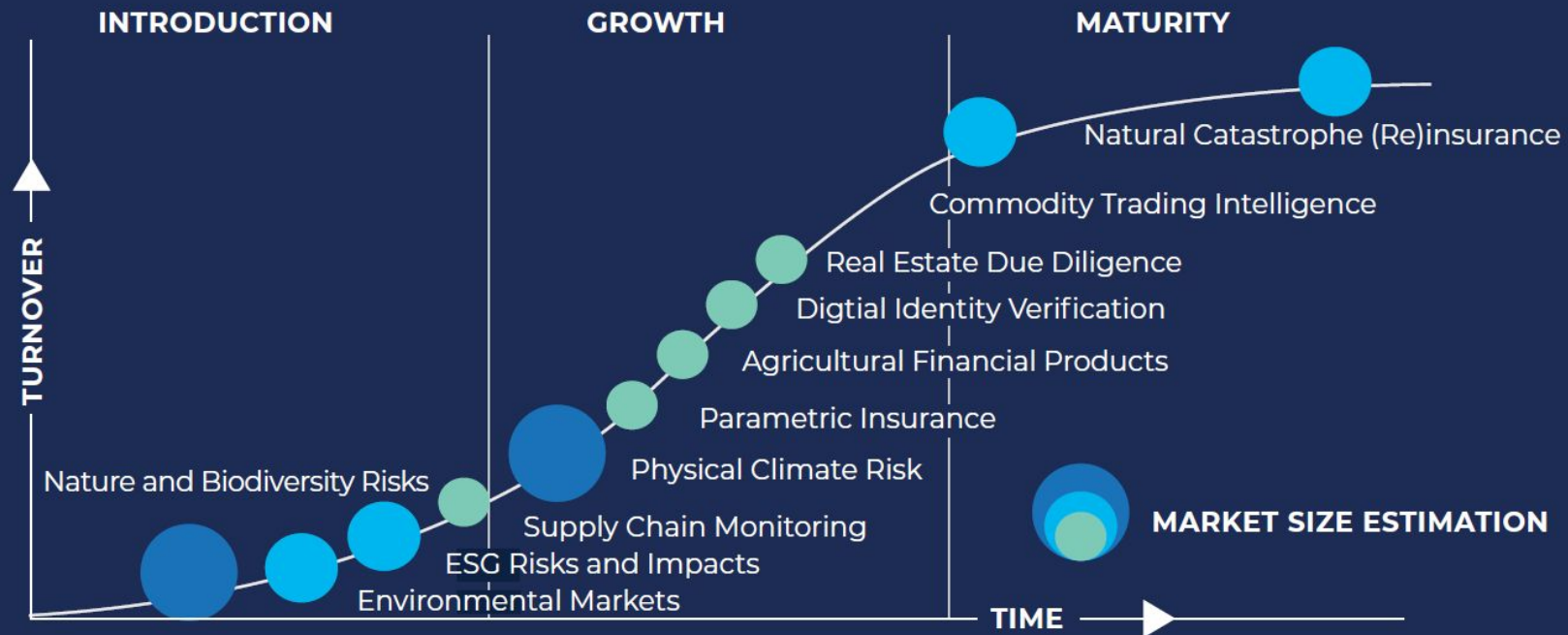
- Steel plants on the x-axis are ordered by an ordering metric on the y axis.
- This graph is ordered by carbon intensity which is emissions produced per tonne of steel produced.
- The black vertical line is the carbon budget.
- A carbon budget is the cumulative amount of CO<sub>2</sub> emissions permitted over a period to keep within a certain temperature threshold.
- Steel plants to the right of the black line are incompatible with that carbon budget
- The x-axis shows an estimate of what the cumulative emissions of all steel plants globally are likely to produce over their remaining life.
- Each bar represents a crude steel production asset.
- The width of each line represents the amount of carbon emission associated with each steel production asset.



**24.8% of GLOBAL crude steel producing assets incompatible SR 1.5°C**  
**18.6% of GLOBAL crude steel capacity incompatible SR 1.5°C**

- SR 1.5°C is the IPCC's latest estimate of a carbon budget that corresponds to 1.5°C with a 66% probability.

# SPATIAL FINANCE APPLICATIONS & INNOVATION







OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



# Global Resilience Index Initiative





# GLOBAL RESILIENCE INDEX (GRI) INITIATIVE

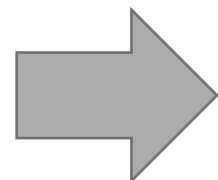
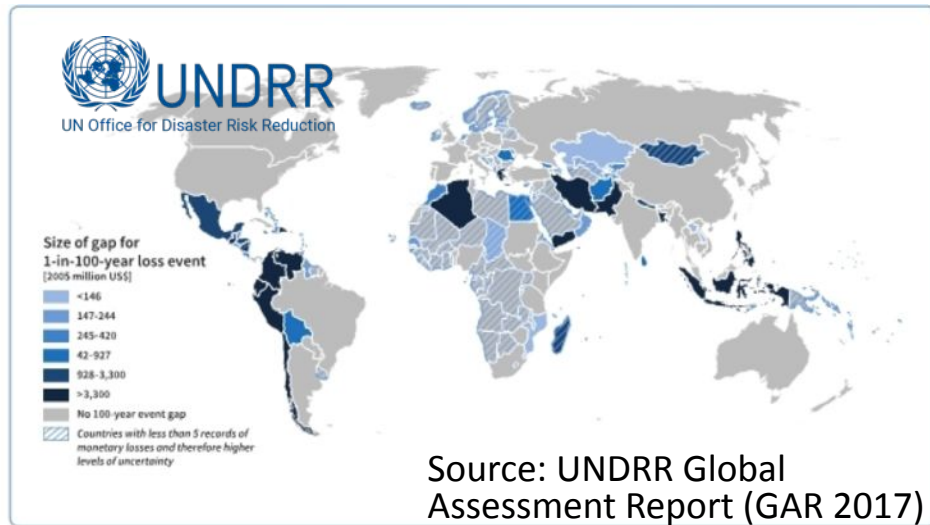
## CREATING A COMMON LANGUAGE OF RISK

Embedding risk within global financial flows and decisions at all levels to drive resilience and resilient investment





GRII builds upon the UN's Global Assessment Report 2017. A multi-agency effort to create the first public good, globally consistent, multi-hazard catastrophe risk model.



Proven public-private-academic model, focussed on standards and interoperability



# GLOBAL RESILIENCE INDEX (GRI) INITIATIVE

## OPEN PHYSICAL RISK DATA AND ANALYTICS

Key GRII features and confront persistent challenges in climate and wider resilience

**A COMMON LANGUAGE OF RISK** across public, private, finance and civil society

**CONSISTENT RISK METRICS** – systemic risks, supply chains, trade, natural capital

**SHARED ANALYTICS**, allowing risk to be integrated into decision making

**GLOBALLY CONSISTENT** and integrated across hazards, assets, and timescales

**INTEGRATED EXPERTISE** – based on last decade of cross sector collaboration

**OPEN TO ALL**, public good. Inspired by UN GAR17 and Global Earthquake Model

Rio de Janeiro  
Flood hazard: **High**  
Seismic hazard: **Low**





# PUBLIC – PRIVATE COLLABORATION TO BUILD A COMMON LANGUAGE AND UNDERSTANDING OF RISK



Public-private partnership co-chaired by  
World Bank – UNDP – Insurance Industry



Partnership of national governments,  
UN agencies, MDBs and private sector



Public-private partnership institutional  
investors, financial institutions, ratings  
agencies, knowledge organisations



*Open platform for collaboration  
Contributing institutions to date:*

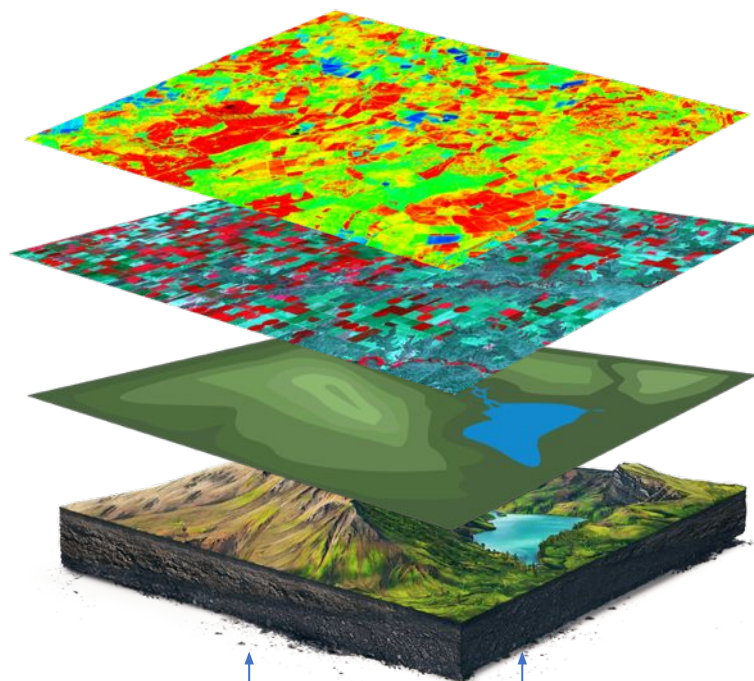


# GLOBAL RESILIENCE INDEX (GRI) INITIATIVE OPEN PHYSICAL RISK DATA AND ANALYTICS

## *Vision:*

Finance and investment, IFIs  
government, civil society and  
firms able to access and use  
globally consistent,  
transparent acute physical  
risk data for:

- Every point on the planet
- Covering all material risks
- Present and future



An open platform of high-quality,  
consistent, global hazard, exposure and  
risk data covering material risks:

Combines best-in-class data from multiple  
contributing organisations to generate  
sub-national risk metrics: exposures,  
average annual loss, EPs

'plug and play' interoperability

Strategically fills gaps: tail risks (acute  
risks), system-level risks, supply chains,  
indirect economic losses

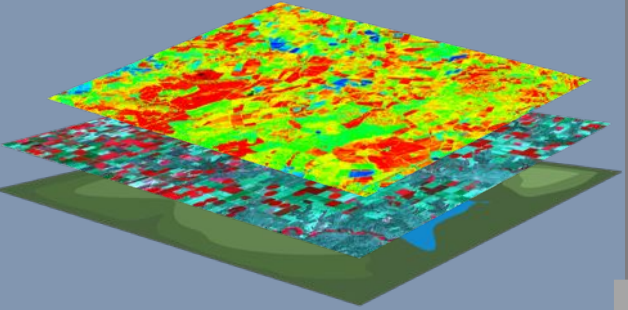
Standards and transparent methods



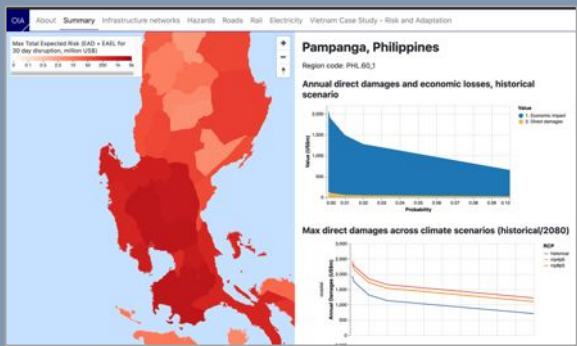


# GLOBAL RESILIENCE INDEX INITIATIVE

➔ **OpenGRI DATA REPOSITORY**



➔ **GRI INTERFACE**



## GLOBAL/REGIONAL

GLOBAL/REGIONAL RISK  
FINANCING MECHANISMS

➔ GLOBAL RISK MONITORING

DISCLOSURE

REPORTING

PORTFOLIO RISK MGMT

SYSTEMIC-LEVEL RISK

HUMANITARIAN

## NATIONAL

RISK IDENTIFICATION

MACRO-PRUDENTIAL

FINANCIAL PROTECTION

ADAPTATION PLANNING

PRIORITISING RESILIENCE

INVESTMENTS

## SUB-NATIONAL/ ASSET-LEVEL

MICRO-PRUDENTIAL

RISK ANALYTICS

RISK PRICING

RISK MONITORING





**Select layers**

- Power Grid
- Railways
- Trunk Roads
- Motorways
- Primary Roads
- Secondary Roads
- Tertiary and Other Roads
- Coastal flood depth (m), 100yr
- Fluvial flood depth (m), 100yr
- Cyclone gust speed (m/s), 100yr

Coastal flood depth (m)

0 2.5 5

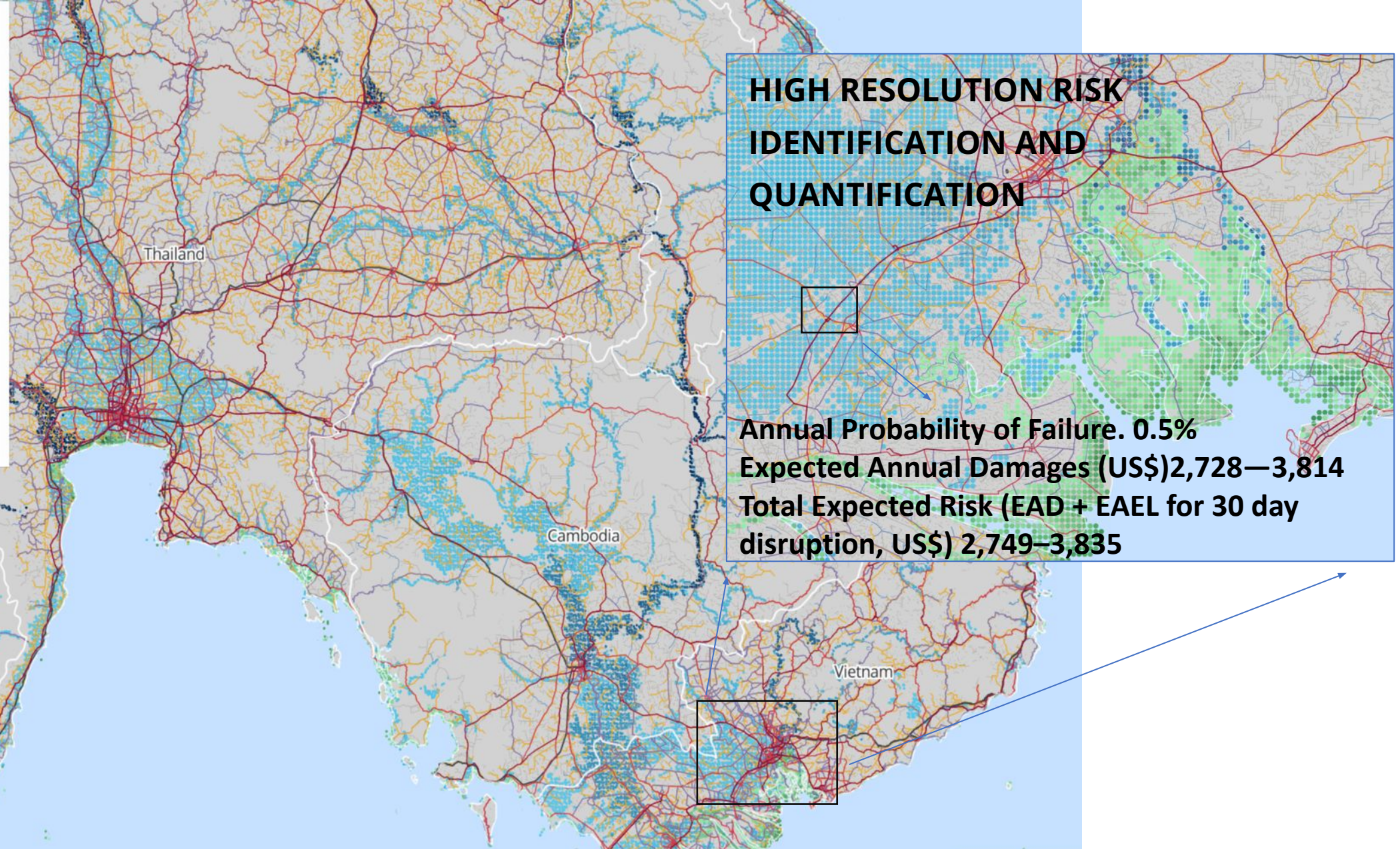
Fluvial flood depth (m)

0 2.5 5

Cyclone gust speed (m/s)

0 25 50

[More info](#)



**HIGH RESOLUTION RISK IDENTIFICATION AND QUANTIFICATION**

**Annual Probability of Failure. 0.5%**  
**Expected Annual Damages (US\$) 2,728—3,814**  
**Total Expected Risk (EAD + EAEL for 30 day disruption, US\$) 2,749—3,835**



# ROADMAP AHEAD

LAUNCH AT  
COP26  
DEMONSTRAT  
OR PLATFORM

SET-UP AND  
GOVERNANCE  
SUMMER 2022

LAUNCH OF  
FULL OPEN  
REPOSITORY  
AND  
INDICES  
COP27

GLOBAL  
RESILIENCE  
INDEX  
INITIATIVE

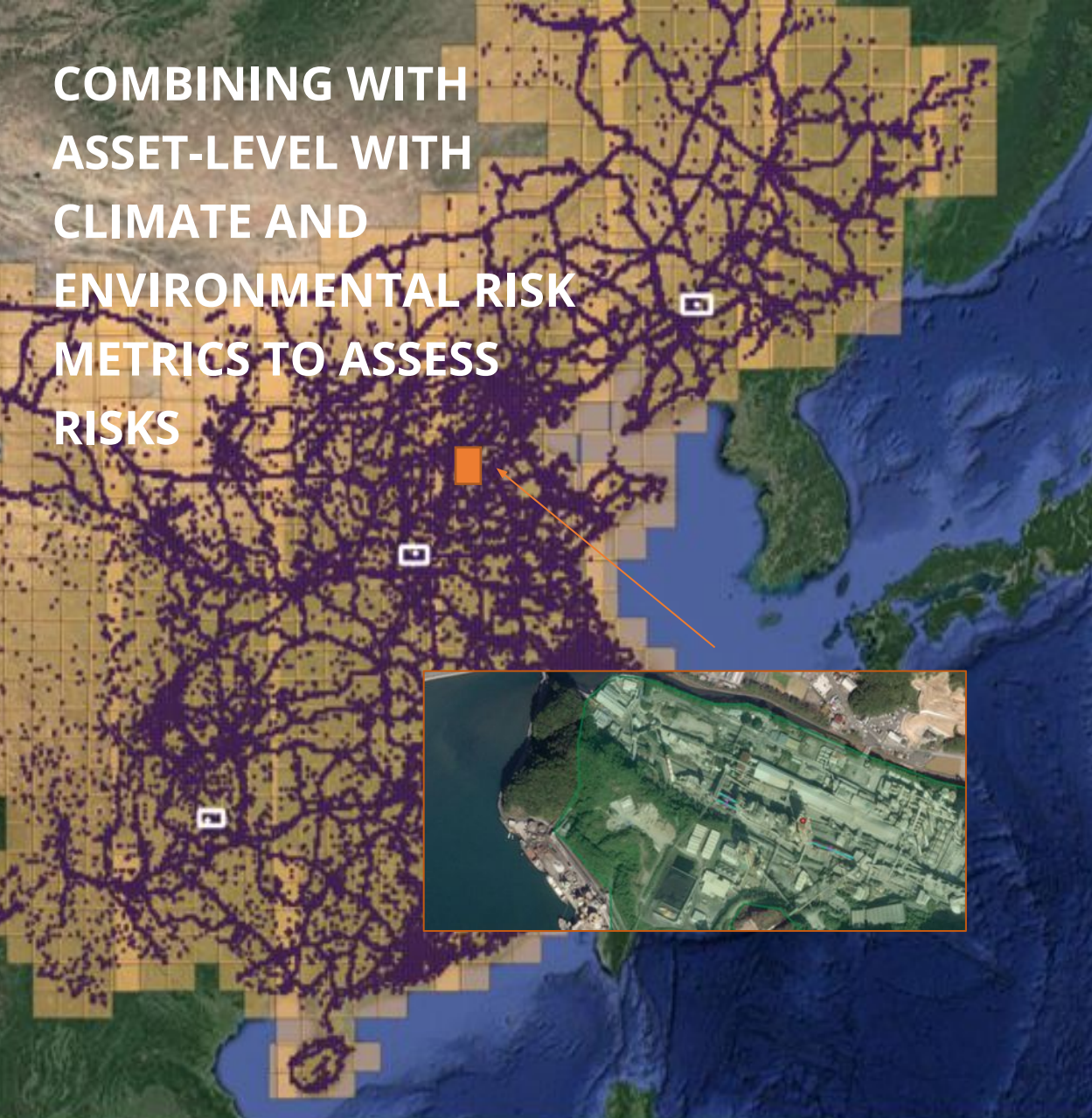
Rio de Janeiro  
Flood hazard: **High**  
Seismic hazard: **Low**



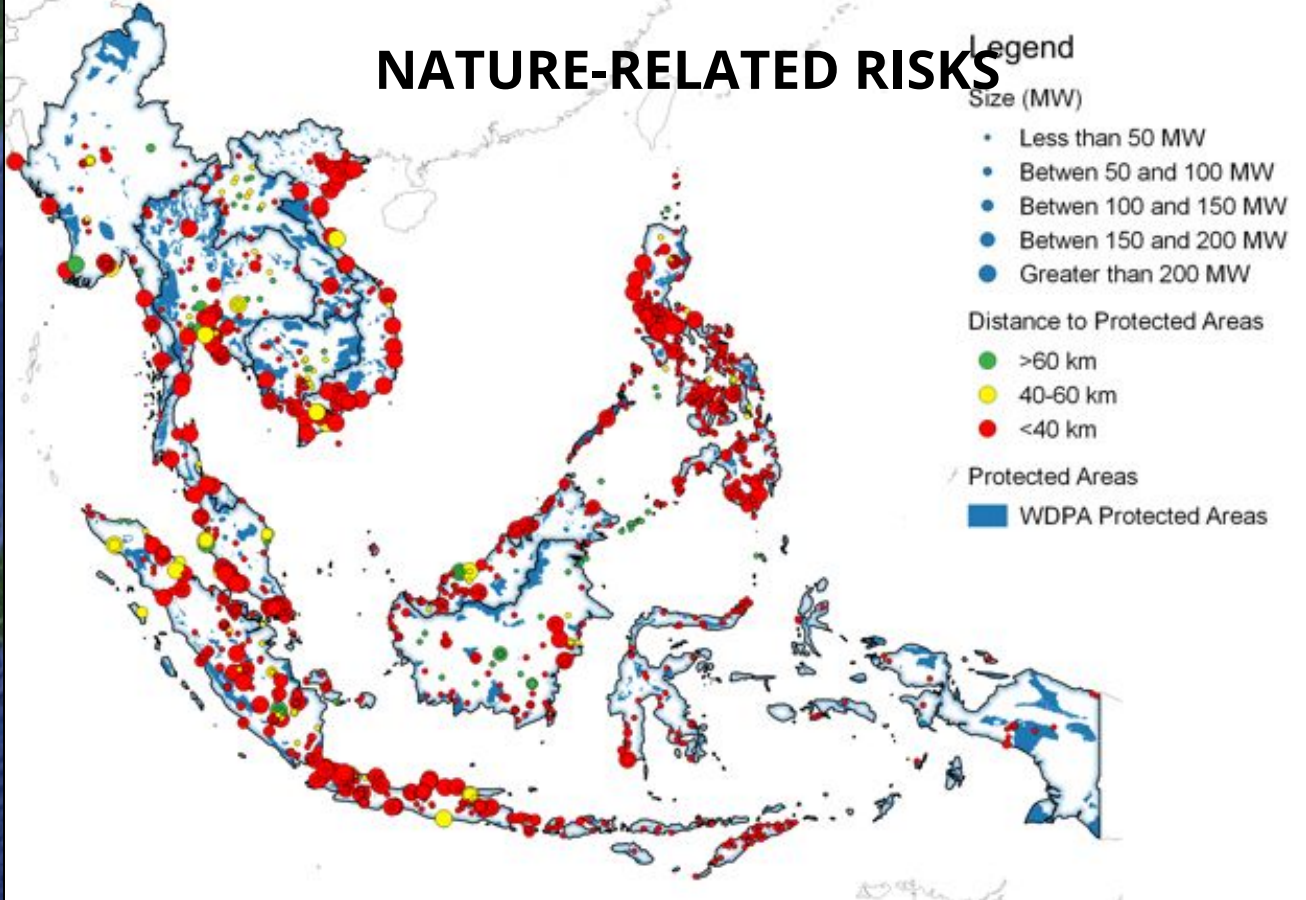




COMBINING WITH  
ASSET-LEVEL WITH  
CLIMATE AND  
ENVIRONMENTAL RISK  
METRICS TO ASSESS  
RISKS



## NATURE-RELATED RISKS





## References

The concepts and model results presented here are documented in the study report:

- Pant, R., Russell, T., Glasgow, G., Verschuur, J., Gavin, H., Fowler, T. & Hall, J.W. (2021). *Analytics for Financial Risk Management of Critical Infrastructure in Southeast Asia – Final Report*. Oxford Infrastructure Analytics Ltd., Oxford, UK. (Available on request from the World Bank)

The tool being used to visualize the model outputs is developed and documented here:

- [github.com/oi-analytics/oi-risk-vis](https://github.com/oi-analytics/oi-risk-vis)

The Southeast Asia analytics are produced using the code here:

- [github.com/oi-analytics/seasia](https://github.com/oi-analytics/seasia)



## CONCLUDING THOUGHTS

**The insurance sector needs to fully understand its exposure to projected climate risk and take action to build resilience**

---

**Assessing risks and impact from the asset level provides a more granular and comprehensive approach to identifying and attributing risk and impact to individual companies, investment portfolios and sovereigns. Earth Observation, artificial intelligence tools and network modelling allow us to extract and process vast amounts of data, creating comparable, verified global datasets**

---

**Public-private-academia collaborations and knowledge co-production are highly valuable**



OXFORD  
SUSTAINABLE  
FINANCE  
GROUP



Stay in touch!

[felicia.liu@smithschool.ox.ac.uk](mailto:felicia.liu@smithschool.ox.ac.uk)

[Nicola.ranger@smithschool.ox.ac.uk](mailto:Nicola.ranger@smithschool.ox.ac.uk)





OXFORD  
SUSTAINABLE  
FINANCE  
GROUP

