



Harnessing Geospatial Data for Effective Climate Risk Assessment

**SEVENTH HIGH-LEVEL FORUM ON UNITED NATIONS
GLOBAL GEOSPATIAL INFORMATION MANAGEMENT**

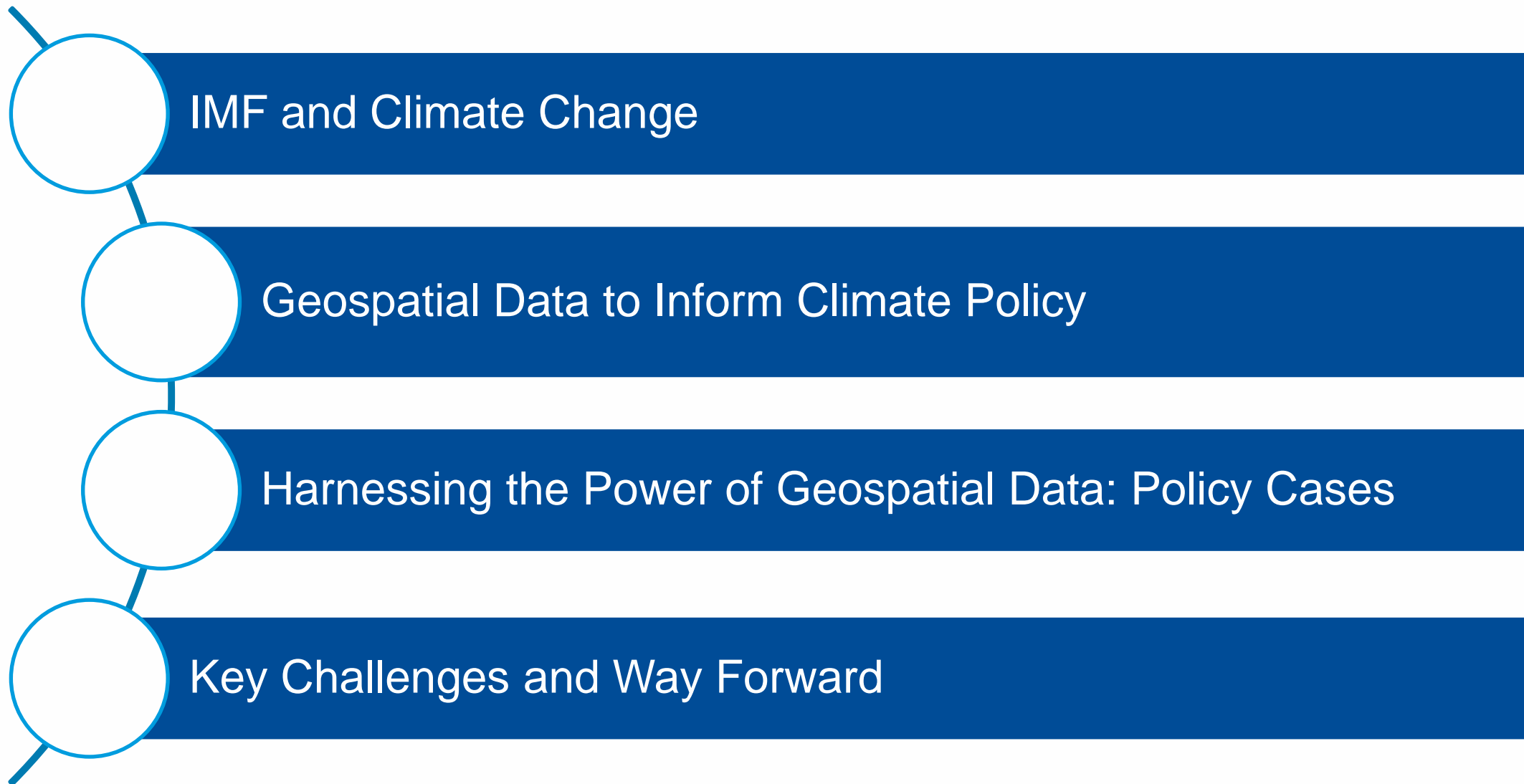
OCTOBER 8-10, 2024

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The views expressed herein are those of the author and should not be attributed to the IMF, its Executive Board, or its management

Outline



IMF and Climate Change

- Climate change is an **existential threat** to long-term growth and prosperity
- IMF's Climate Strategy (2021) goal: *“provide high quality, granular, and tailored advice to the membership on macroeconomic and financial policy challenges related to climate change”*
- Systematic and strategic integration of climate change into the IMF's activities



**Surveillance and
Analytical Work**



**Capacity
Development and
Data**



Lending

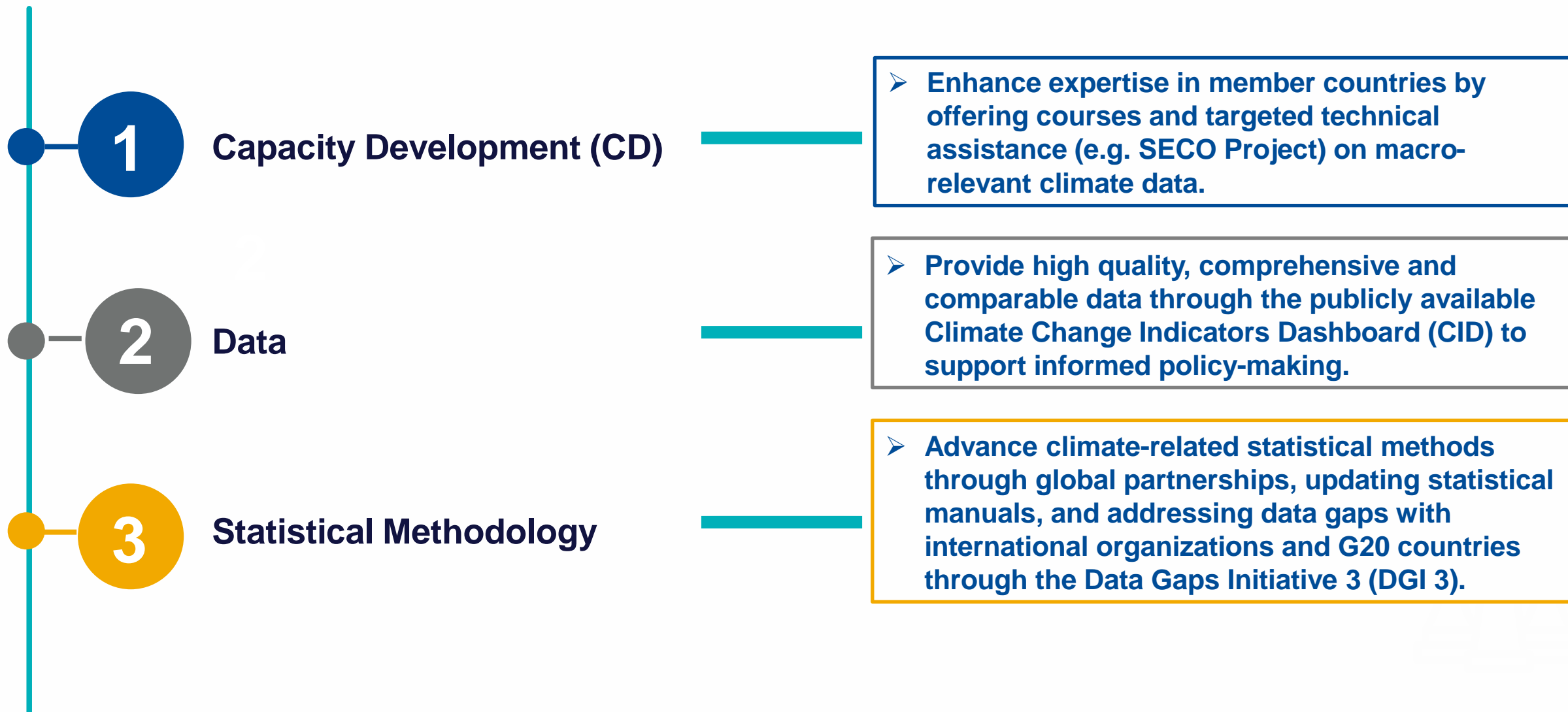


**Cooperation and
Coordination**

Link to the climate strategy document: [Here](#)

STA's Environment and Climate Change Statistics Program

Three Main Pillars



Capacity Development (CD)

Providing Training and Technical Assistance

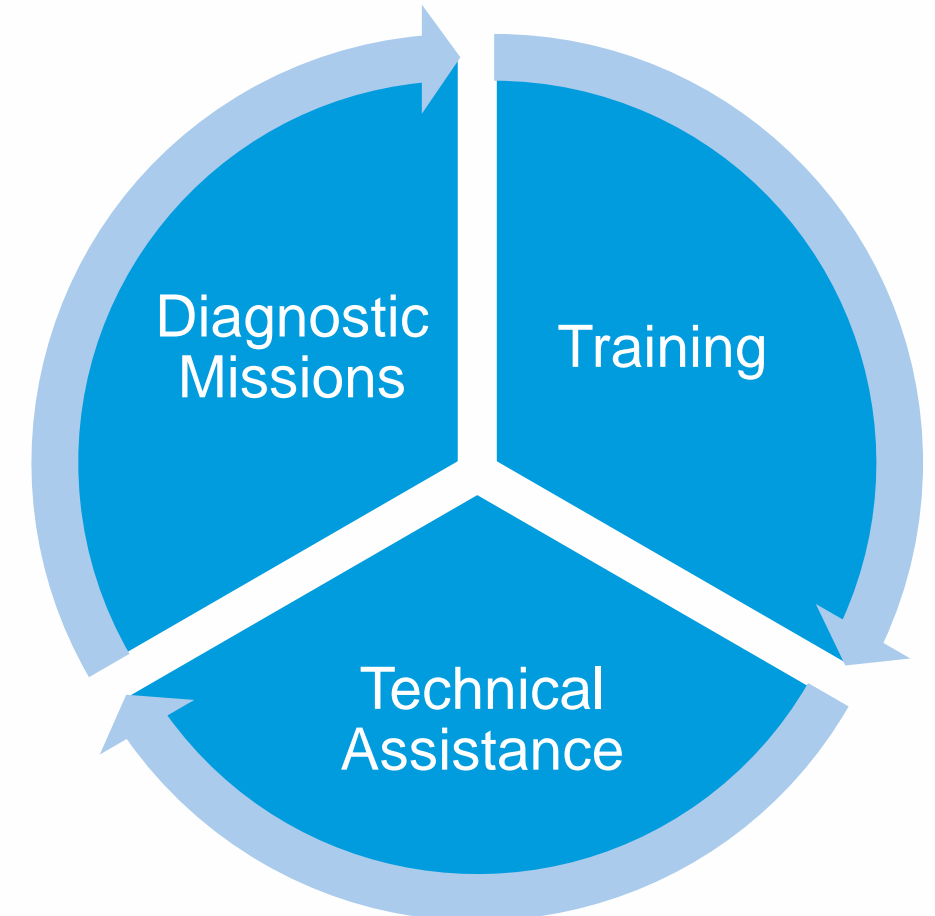
Training

- **Course on “Macro-relevant Environment and Climate Change Statistics”**
 - Introductory and advanced versions of the course are offered in many regional training centers and IMF HQ
 - Physical and transition risk is a separate module

Technical Assistance

- **Country projects funded by SECO (10 countries)**
 - Algeria, Bangladesh, Colombia, Egypt, Ghana, Indonesia, Mozambique, Peru, South Africa, Vietnam.
- **Other technical assistance projects**
 - Azerbaijan, Barbados, Jamaica, **Tanzania, Pakistan, Seychelles, Morocco, Iraq and others.**

SECO Project: Three Phase Approach



Data: Climate Change Indicators Dashboard (CID)

- ✓ The CID addresses the growing need for climate-related data used in macroeconomic and financial stability analysis by identifying and developing a range of distinctive indicators, including experimental ones.

IMF | CLIMATE CHANGE DASHBOARD | **INDICATORS** | **COUNTRIES** | **ACCESS DATA** | **TOOLS** | **LEARN MORE**

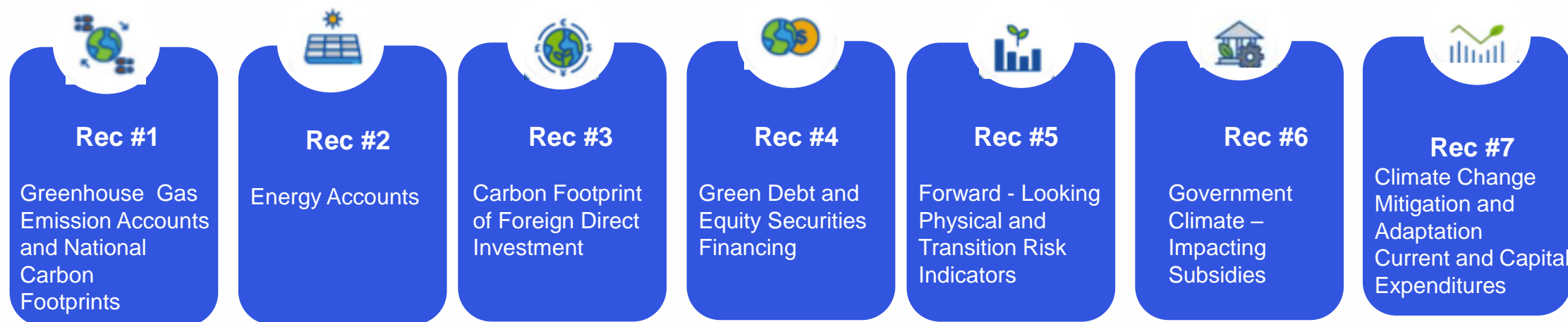
Climate Change Indicators Dashboard

Bridging the data gap on climate change for evidence-based economic decision-making

- Greenhouse Gas (GHG) Emissions**
 - GHG Emissions Accounts
 - National Inventories and Targets
 - CO₂ Emissions Intensities and Multipliers
 - Carbon Footprints from Economic Activity
- Mitigation**
 - Environmental Taxes
 - Environmental Protection Expenditures
 - Fossil Fuel Subsidies
 - Renewable Energy
 - Trade in Low Carbon Technology
- Adaptation**
 - Climate-related Disasters Frequency
 - Climate-driven INFORM Risk
- Transition to a Low-Carbon Economy**
 - NEW** NGFS Transition Pathways
 - NEW** NGFS GDP Losses and Benefits
 - Forward-Looking Risks
 - Trade in Low Carbon Technology
- Climate Finance**
 - Green Debt
 - Carbon Footprint of Bank Loans
- Climate and Weather**
 - Surface Temperature Change
 - Atmospheric CO₂ Concentrations
 - Change in Mean Sea Levels
 - Land Cover Accounts

G20 Data Gaps Initiative (DGI-3) Climate-Related Recommendations

- The new DGI-3 endorsed by the G20 FMCBG will play an important role in addressing climate-related data gaps
- Seven out of the fourteen recommendations are on climate-related data
- **Rec # 5 is on forward looking physical and transition risks, where the role of geospatial data is critical**



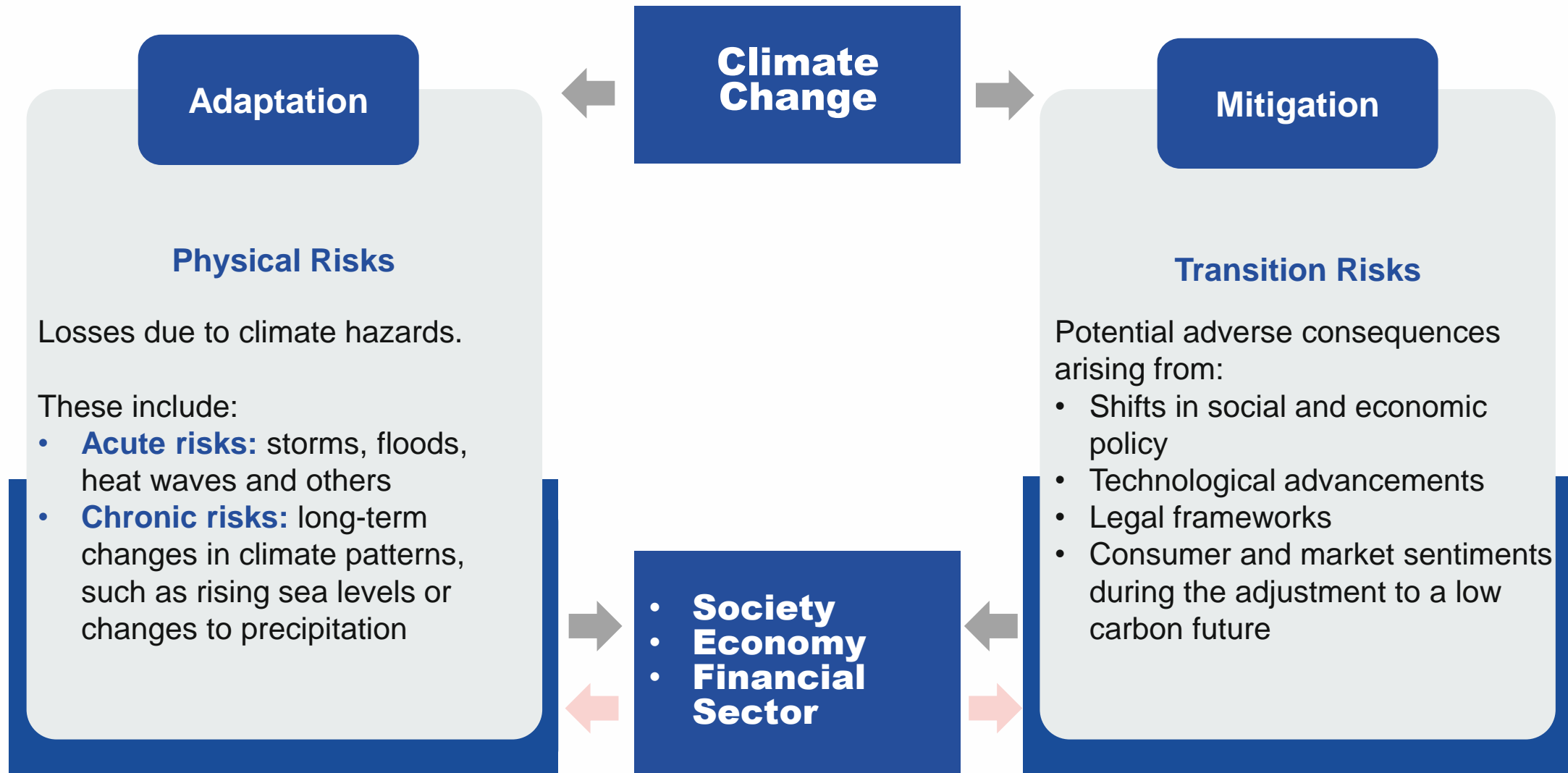
DELIVERING INSIGHTS FOR ACTION

Benefits of Using Geospatial Data to Inform Climate Policy

An aerial photograph showing a residential area completely inundated with brown floodwater. The water has reached the roofs of many houses and is surrounding trees. A white van is partially submerged in the water. The scene illustrates the impact of flooding on infrastructure and property.

**WHAT IS THE IMPACT OF
CLIMATE HAZARDS AND
CLIMATE POLICIES ON THE
FINANCIAL SECTOR AND THE
ECONOMY?**

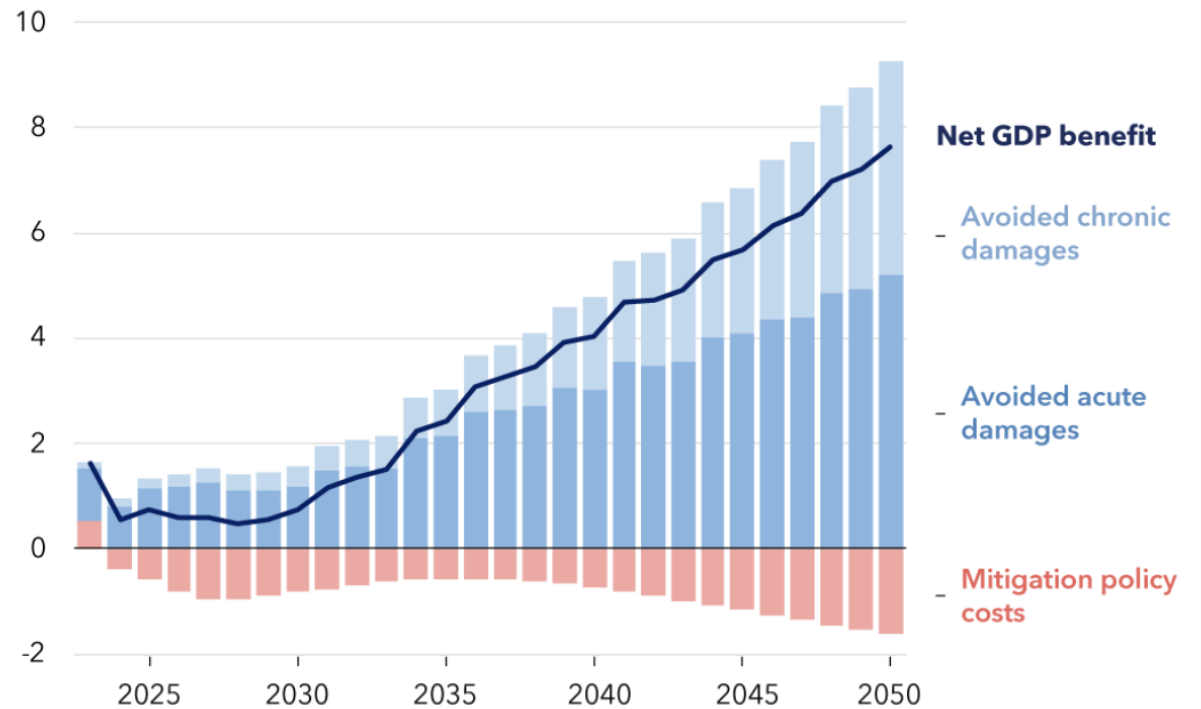
Measuring Physical and Transition Risks for Better Adaptation and Mitigation Policies



The Case for Immediate Action: Climate Transition Benefits Exceed Costs

- Avoiding physical damage from climate change can have sizable benefits
- Making an orderly transition to net zero by 2050 could result in global gross domestic product being 7 percent higher than under current policies, based on NGFS estimates.
- Supporting countries with the development of indicators that quantify physical and transition risks for better policy analysis is critical
- Geospatial data is critical to bridge data gaps

World potential GDP benefit under net zero carbon emissions by 2050
(percent deviation from reference scenario)



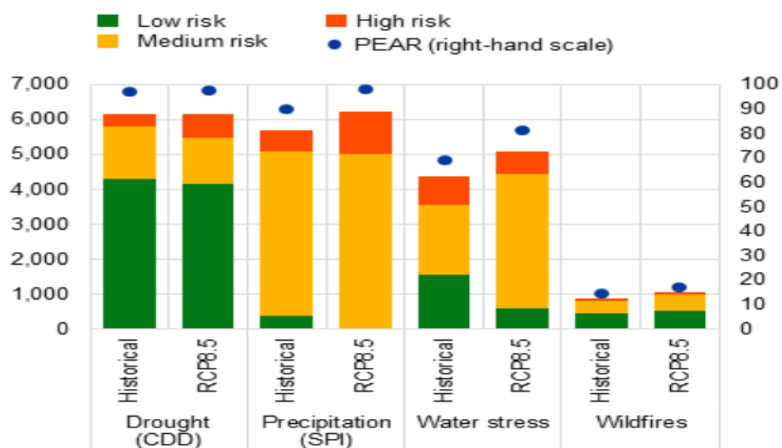
Sources: NGFS (2023), Scenarios Portal; IIASA (2023), NGFS Phase 4 Scenario Explorer; and IMF staff calculations. Note: NiGEM model with REMIND-MAGPIE inputs. The reference scenario is the Current Policies scenario with no transition but physical risk.

Linking Physical Risks to Financial Sector: ECB

- Assessing financial institutions' exposure to physical risks is important from a financial stability perspective
- ECB's indicators and risk scores provide that assessment for their member countries. For example:
 - Potential exposure at risk (PEAR); Normalized exposure at risk (NEAR); Collateral-adjusted exposure at risk (CEAR)

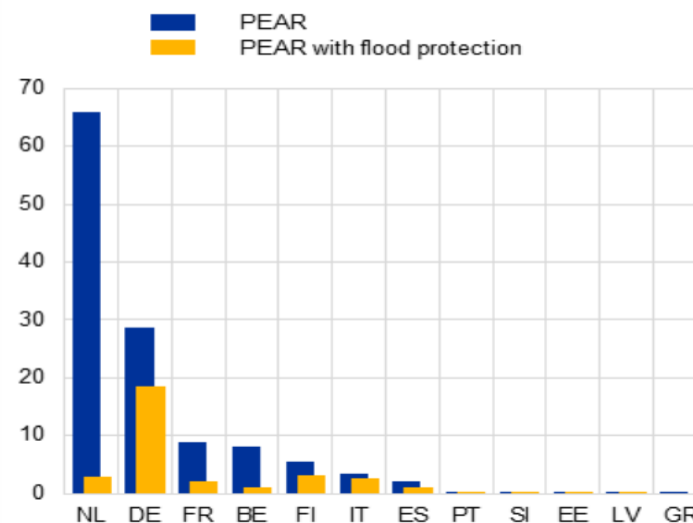
Portfolio exposures of euro area financial institutions to different hazards by risk score

(left-hand scale: EUR billions; right-hand scale: percentage of portfolio)



Potential exposure at risk: Coastal Flooding

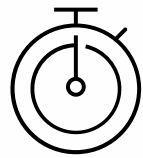
(EUR billions)



Benefits of Geospatial Data for Policy Analysis



**Accurate Mapping
of Vulnerable
Areas**



**Real-Time
Monitoring**



**Enhanced
Forecast Accuracy**



**Informed Policy &
Planning**



Natural Hazards
(Hazard * Exposure * Vulnerability)



Damages



**Financial Sector
Risk Analysis**



**Economic Risk
Analysis**

Harnessing the Power of Geospatial Data: Policy Cases

Overview of Key Projects for Better Climate Policy Analysis

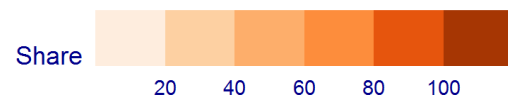
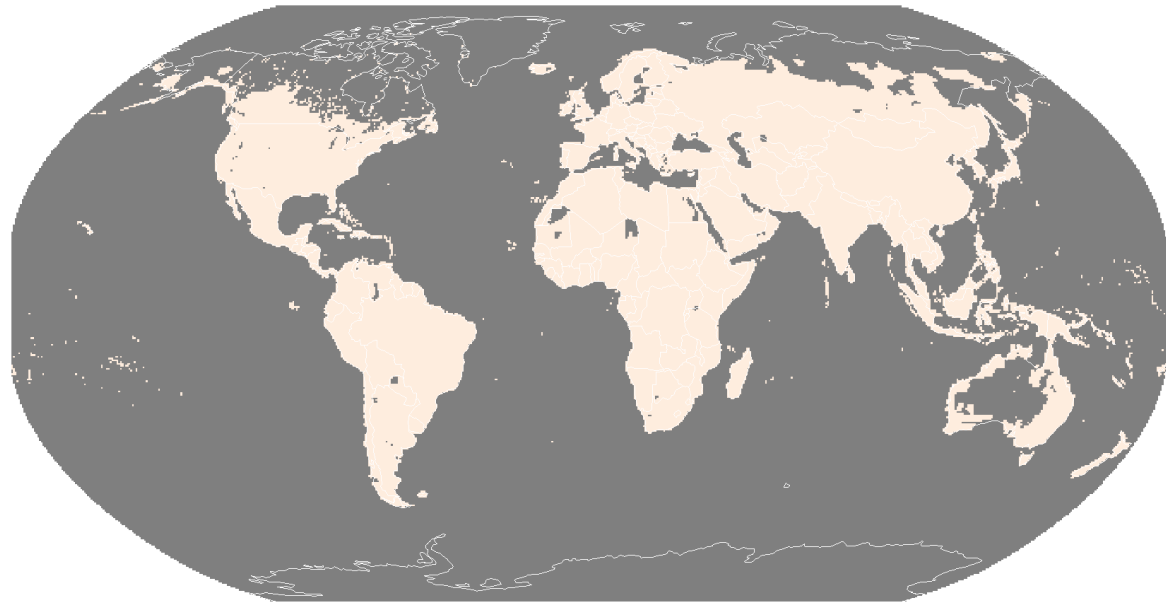
- **Measuring physical and transition risk indicators under G20 DGI-3**
 - ◆ Ongoing work on building a geospatial platform
 - ◆ Working with several partners
 - ◆ Computing experimental indicators
- **“Census of Structures Project”: Physical Asset Exposure to Climate Hazards**
 - ◆ Provides an assessment of climate risks, including both fiscal and financial impacts
 - ◆ Vital for climate adaptation policies
- **PortWatch**
 - ◆ Explore climate risks posed to international trade
- Overall, the goal is to help Fund staff and IMF members better integrate climate risk into policy



Exposure to Heat Stress Indicators | People

Share of population (SSP245 projection)

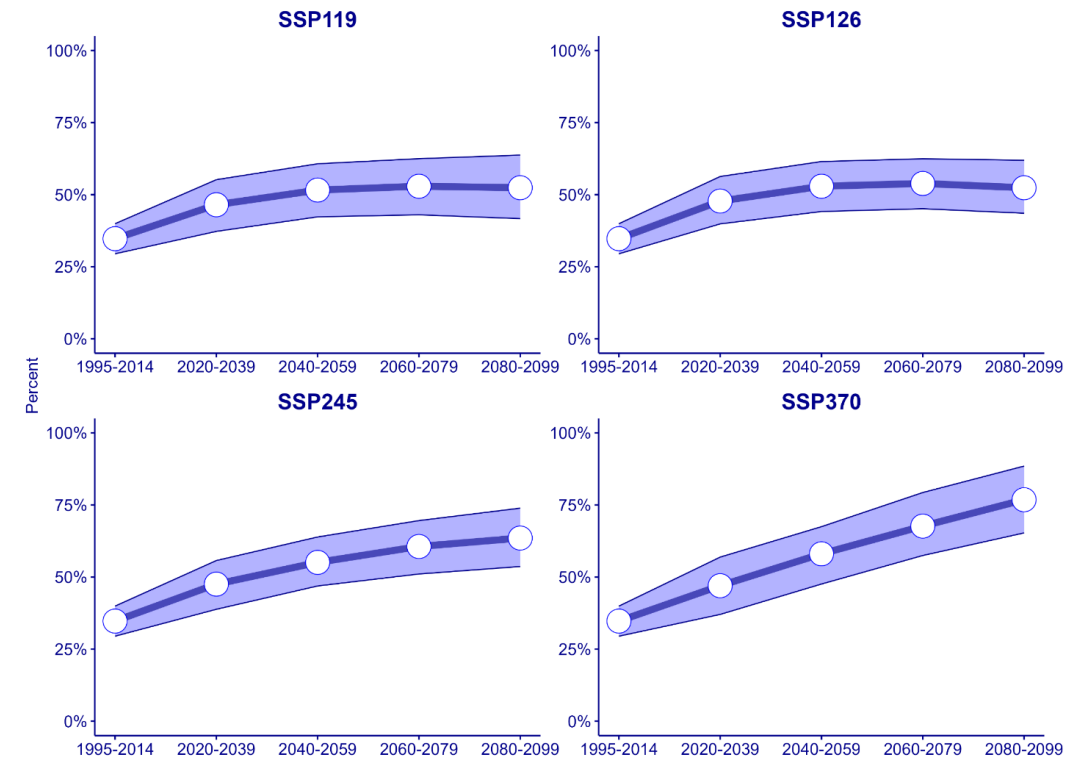
Exposed to at least 10 days with daily maximum temperature $\geq 35^{\circ}\text{C}$
2010



IMF Statistics computations using World Bank Climate Change Knowledge Portal gridded climate data

G20 Countries

Percent of population exposed to at least 10 days with daily maximum temperature $\geq 35^{\circ}\text{C}$
CMIP6 Ensemble

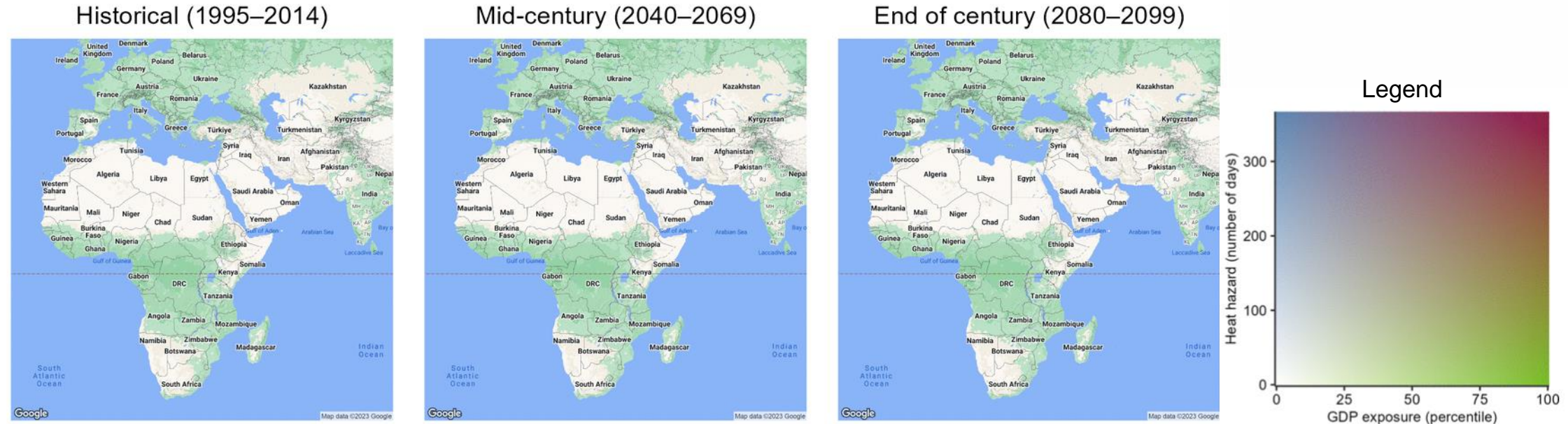


Source: IMF Statistics computations using World Bank Climate Change Knowledge Portal gridded climate data.
Original citation: Eyring, V. et al. (2016): Overview of the Coupled Model Intercomparison Project Phase 6 (CMIP6) experimental design and organization, Geosci. Model Dev., 9, 1937-1958,
DOI: <https://doi.org/10.5194/gmd-9-1937-2016>
Note: solid line represent median, ribbon shades represent the 10th and 90th percentiles.

Exposure to Heat Stress Indicators | GDP

- Working on utilizing geospatial tools and integrating publicly available data on hazards, exposures, and vulnerabilities along with climate scenarios to generate estimates of risk.

Susceptibility of GDP to Heat Stress in Africa in an Intermediate Emissions Scenario (SSP2-4.5), 15 arcminutes resolution



Source: World Bank (2023), Climate Change Knowledge Portal; Marukami, D., Yoshida, T., and Yamagata, Y. (2021), *Front. Built Environ.* 7; and IMF staff calculations.

Note: Scenarios are referred to as “SSPx-y”, where “SSPx” refers to the Shared Socio-economic Pathway describing the socio-economic trends underlying the scenario, and “y” refers to the approximate target level of radiative forcing (in watts per square meter) resulting from the scenario in the year 2100.

Geospatial tool to better understand future physical risks

- Ongoing work to develop a geospatial tool with partners
 - ◆ BC3, ESA, ESRI, World Bank, G20 DGI-3 and others.
- Integrate different layers on hazards and exposures to identify hot spots for climate risks using global data sets
- Synergies with other ongoing work: Digital Twin Project (France, Netherlands, Hong Kong) and ECB's work

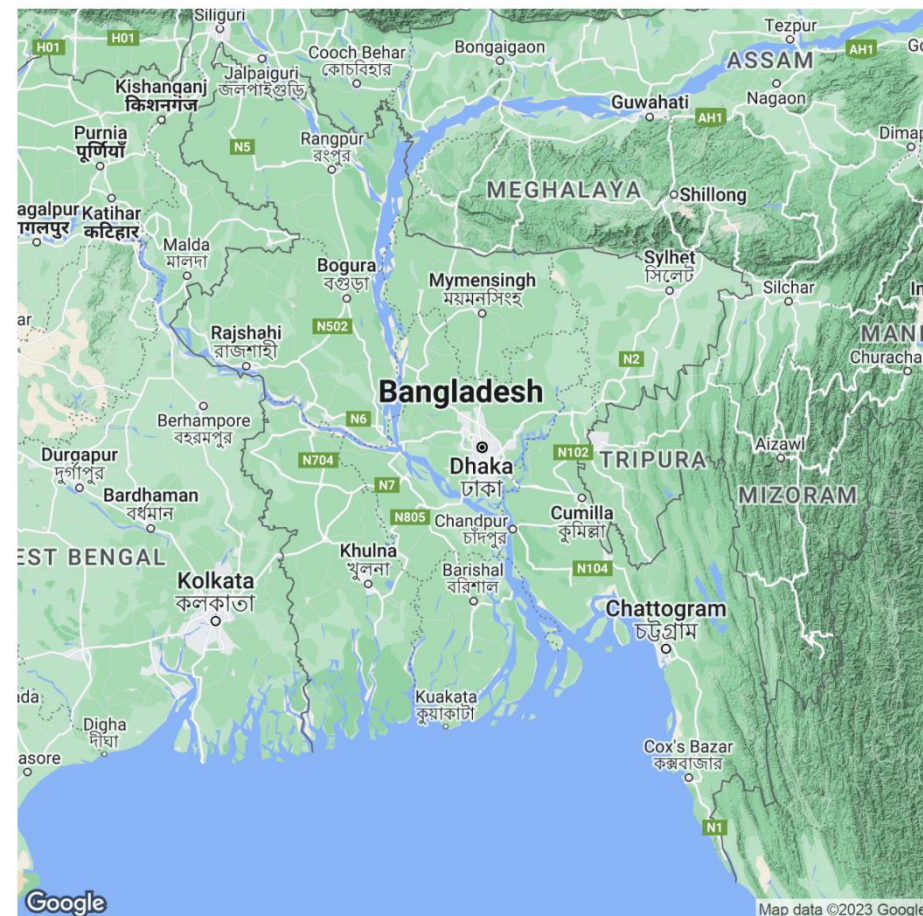
Example: Bangladesh

Hazard layer: # of days per year with heat index greater than 35°C

Exposure layer: Gridded GDP

Vulnerability layer: Damage functions – not yet

Terrain Map of Bangladesh

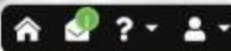


Sources: Google (2023), Maps Platform; and GADM (2022), version 4.1.

The boundaries, colors, denominations, and any other information shown on maps do not imply, on the part of the IMF, any judgment on the legal status of any territory or any endorsement or acceptance of such boundaries.



Bangladesh detailed



Gridded Gross Domestic Product (GDP) ...
Bangladesh detailed
1/1
< Dec 31 2000 >



Gridded Gross Domestic Product (G...
1000000 20000000000



Urban Land Extent Projection
0 1



Multi-model ensemble anomaly of d...
75days 200days



Datasets: 3 +



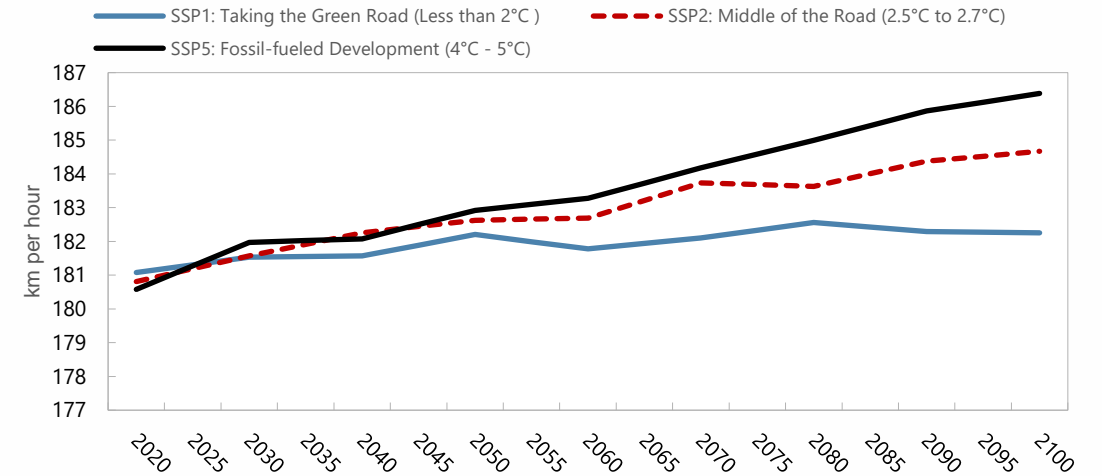
Jamaica Case Study | Forward-Looking Damages



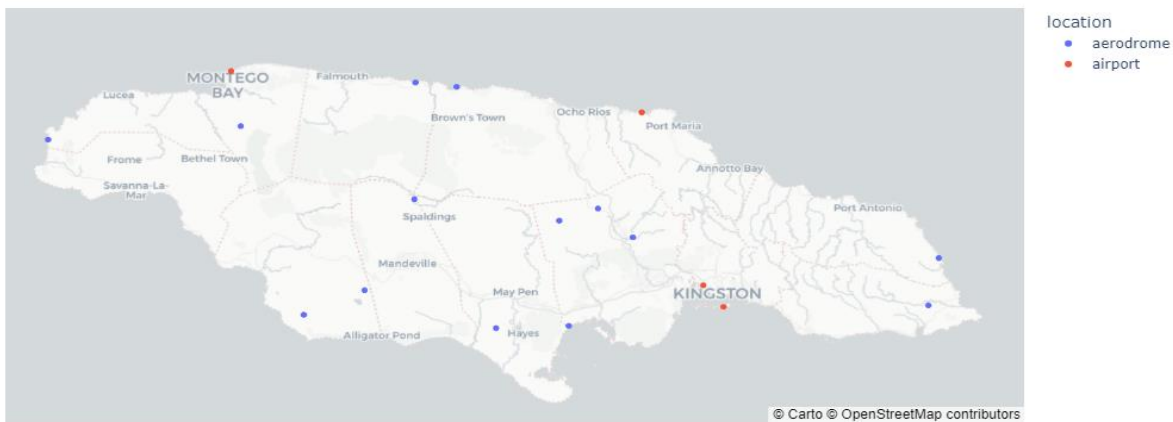
Wind speed 1-in-100 years, 2050, SSP2 RCP 4.5 (kilometers per hour)



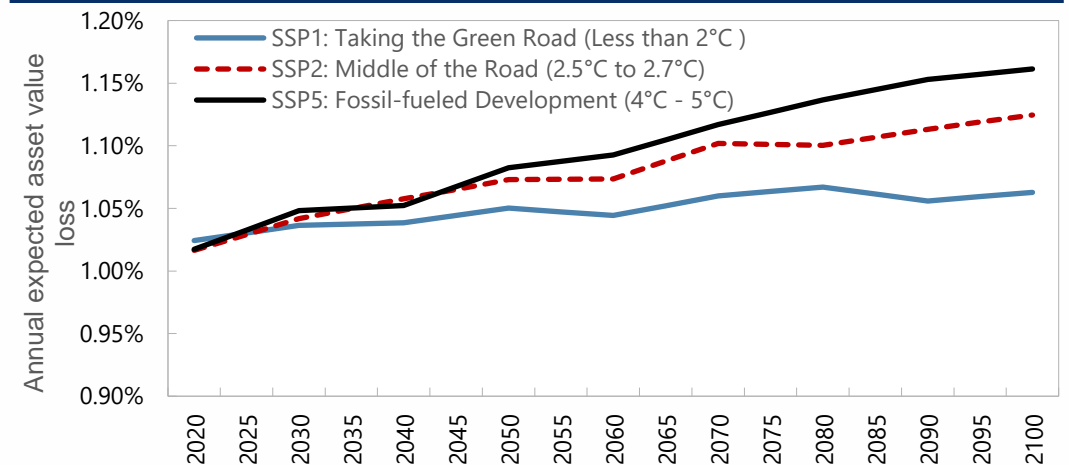
Wind speed by scenario 1-in-100 year - Average of locations



Airports' locations



Forward Looking Damage Rates Under Various Climate Scenarios – at a select location



Physical Asset Exposure to Climate Hazards | Buildings

Illustration: Buildings exposure to coastal flooding, historical and 2050

- Some climate hazards are highly localized (e.g. floods), requiring granular geospatial data on assets:
 - Residential and commercial buildings
 - Industrial structures
 - Critical infrastructure
- Such data allow accurate analysis of climate risks to:
 - Financial systems:
 - Banking sector (mortgages)
 - Insurance sector (losses and premiums)
 - Central bank regulation and supervision
 - Government sector (revenue and spending)
 - Overall economy



Note: Buildings exposure to coastal flood. Source: Flood data sourced from Aqueduct Floods (WRI)

- Historical (lightblue) vs. 2050 projection under RCP8.5 (Business as usual) (blue). Flood intensity=100-years return period.
- Fly to destination 1 (New Orleans, USA) and destination 2 (Guayaquil, Ecuador).

Monitoring Trade Disruptions | PORTWATCH



In partnership with:



THE WORLD BANK
IBRD • IDA



WORLD TRADE ORGANIZATION

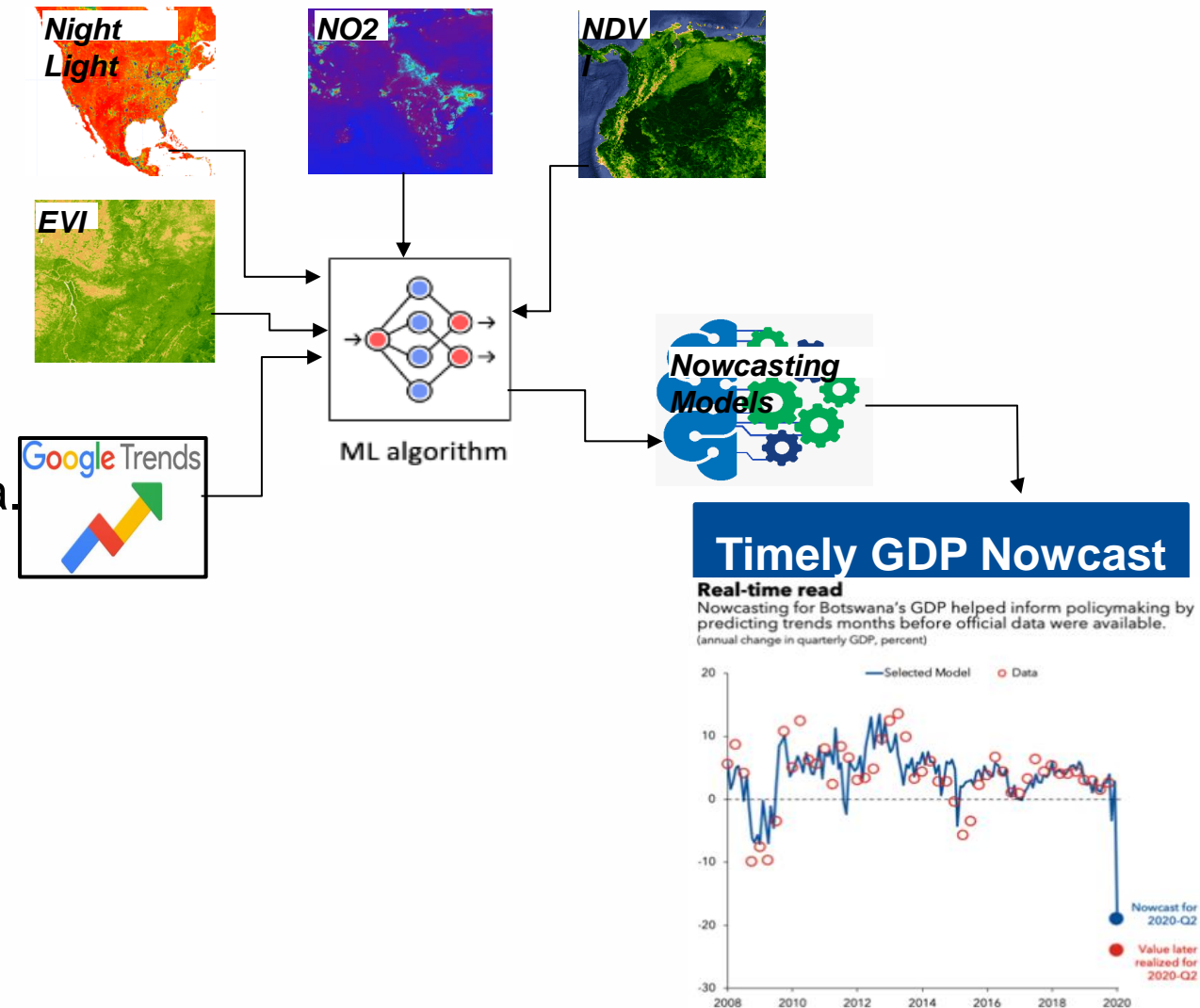
Figure: 7-day disruption at the port of Singapore



- PortWatch has introduced the spillover simulator and climate scenarios tools
- It allows users to explore the risks that climate extremes pose to ports and analyzes the resulting
 - ◆ port downtime
 - ◆ infrastructure damages
 - ◆ trade spillovers
- Present data derived from real time/big data information
- Future projections based on climate scenarios until 2050 by ports are also available

Additional Geospatial Projects at the IMF | GDP Nowcasting

- **Data Challenges:** Many countries, particularly LICs in Africa, do not have frequent, timely, and reliable GDP data
- This information is critical for macro policy analysis, particularly in times of economic volatility (e.g. Covid)
- **Solution:** Geospatial and High Frequency Data
- **GDP Nowcasting** has been highly effective for IMF surveillance activities.
- **IMF AFR Department** Nowcasting Hub Near Realtime GDP nowcasting for sub-Saharan African countries.
- **Examples:** Botswana, Kenya, Nigeria, Ghana.



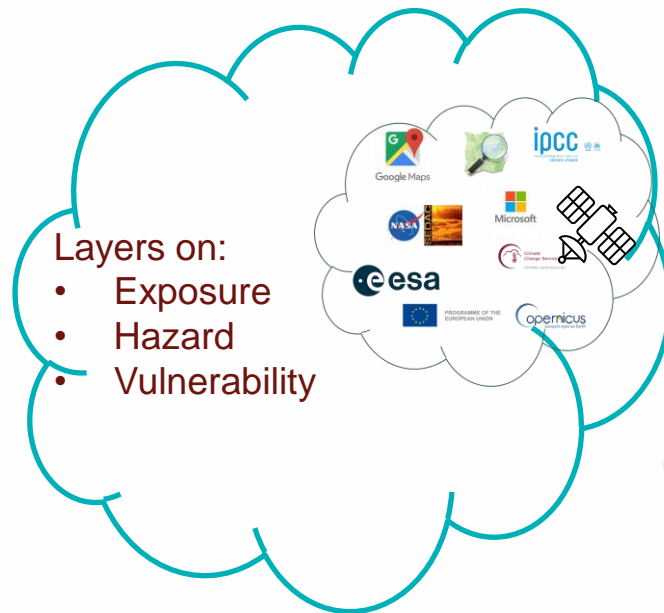
Sources: Botswana authorities; Haver Analytics; and IMF staff calculations.

Source: [Choi and Iyer \(2022\)](#). 23

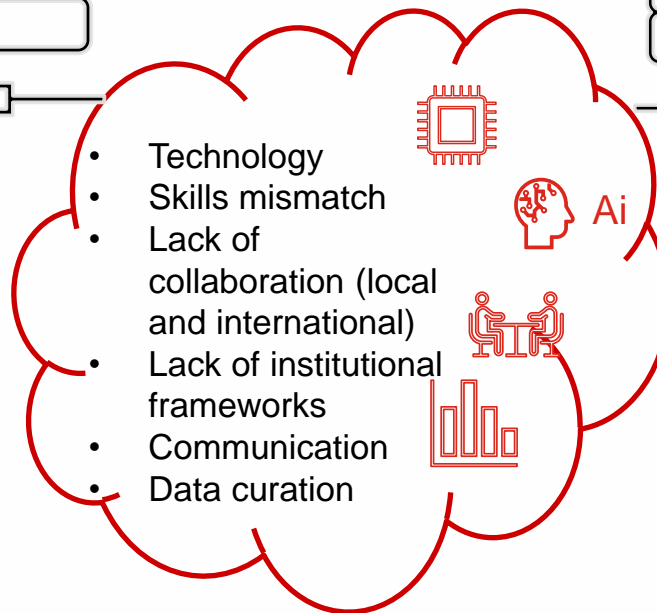
Harnessing the Potential of Geospatial Data

Key Challenges and Next Steps

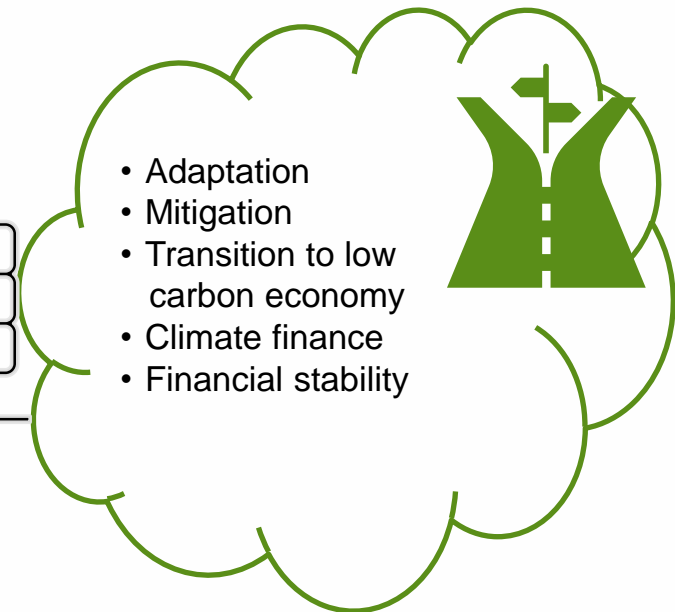
Geospatial Data



Challenges



Better Policies



Thank You!

Questions?

Way Forward

- Climate is a local issue and geospatial data and tools are crucial for closing climate-related data gaps and integrate different data layers
- Financial institutions and regulators are looking to harness geospatial information to enhance integration with economic data for better decision-making
- The growing demand for geospatial solutions has driven both global and national institutions to advance efforts in this area
- However, enhanced collaboration between institutions (global and local) and the development of structured institutional frameworks are essential to maximize the potential of geospatial data
- The IMF is developing a tool that integrates multiple layers of hazard and exposure data to identify high-risk hotspots using publicly available global datasets
- Our goal is to assist countries in creating their own risk estimates, utilizing these global datasets as a starting point

Methodological Framework: Measuring Risk using Geospatial Data

Coverage



1. Physical Events



- Extreme Temperature
- Precipitation
- Drought
- Floods
- Wildfires
- Tropical Cyclones
- Sea Level Rise
- Others

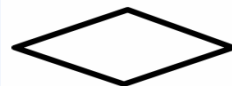


2. Transition Events



- Shifts in Economic Policy (carbon taxation, subsidy regime shifts)
- Technological advancements
- Changes in Consumer and Market Sentiment
- Changes to Legal Frameworks

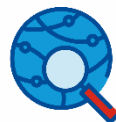
Measuring Risk



Hazard/ Event + Exposure



+ Vulnerability



Risks to:

Population, GDP, built-up areas (properties, public infrastructure etc.), firms, financial sector



Forward-looking estimates based on climate scenarios

Definitions

G20

DATA GAPS INITIATIVE 3

Concept Note: Data Gaps Initiative (DGI 3) Recommendation 5

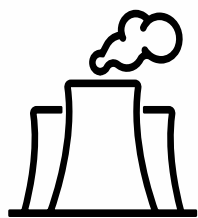
Forward-looking Physical and Transition Risk Indicators

(Preliminary Draft)

I. INTRODUCTION

1. The new [Data Gaps Initiative](#) – DGI 3 – endorsed by the G20 Finance Ministers and Central Bank Governors in November 2022 highlighted the need for robust, comprehensive, and comparable data for the most urgent policy needs. The IMF staff, in close cooperation with the Financial Stability Board (FSB) Secretariat and the Inter-Agency Group on Economic and Financial Statistics (IAG), and in consultation with participating economies, have developed a workplan calling for better data to understand climate change, together with indicators that cover income and wealth, financial innovation and inclusion, access to private and administrative data, and data sharing.

Main Topics of CD Engagement



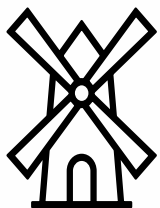
Energy, GHG Emissions and Carbon Footprints

- Air emission accounts
- Energy accounts
- Carbon footprints



Climate Finance

- Taxonomies
- Data collection
- Experimental indicators



Natural Resources Accounting

- Mineral and energy resources
- Renewable energy



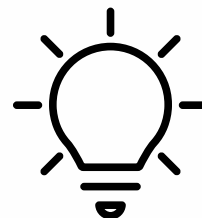
Climate Risk Data

- Physical and transition risk indicators
- Methodological framework
- Climate scenario analysis
- Tools (including geospatial tool)



Climate Mitigation and Adaptation

- Environment and climate related expenditures
- Environmental taxes
- Climate related subsidies



Emerging Areas

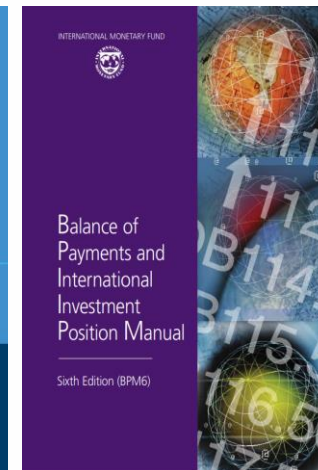
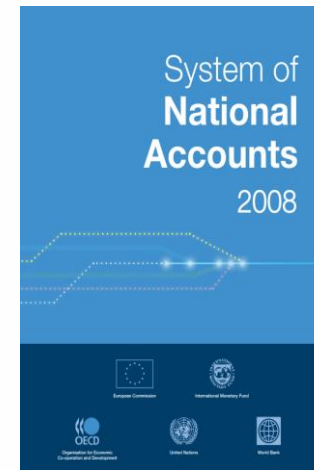
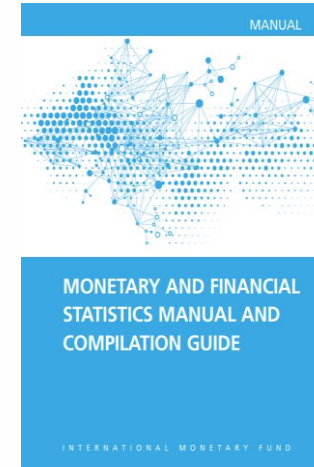
- Land cover/ Water accounts
Energy/Forest/Biodiversity

STA's Initiatives on Statistical Methodology

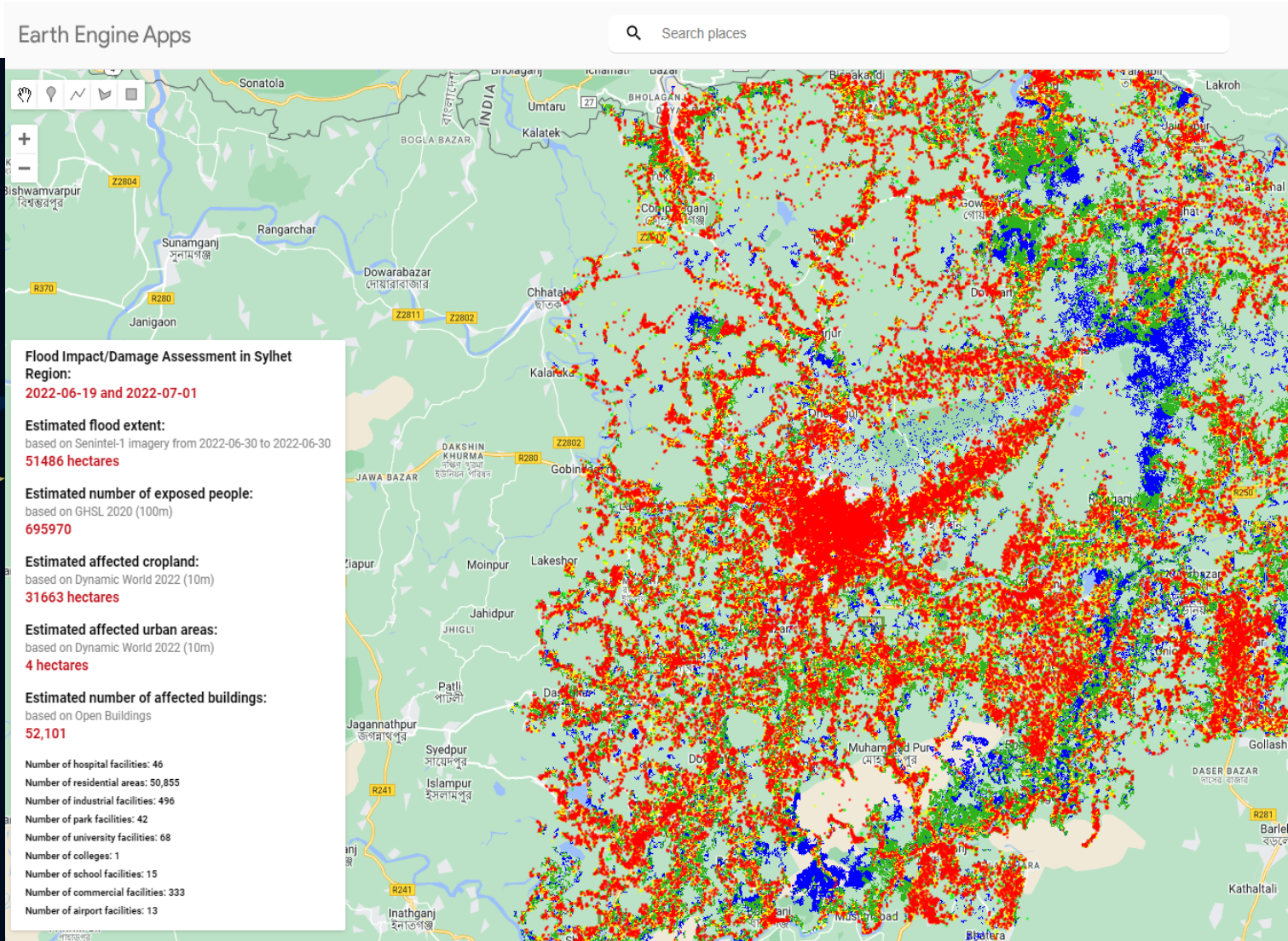
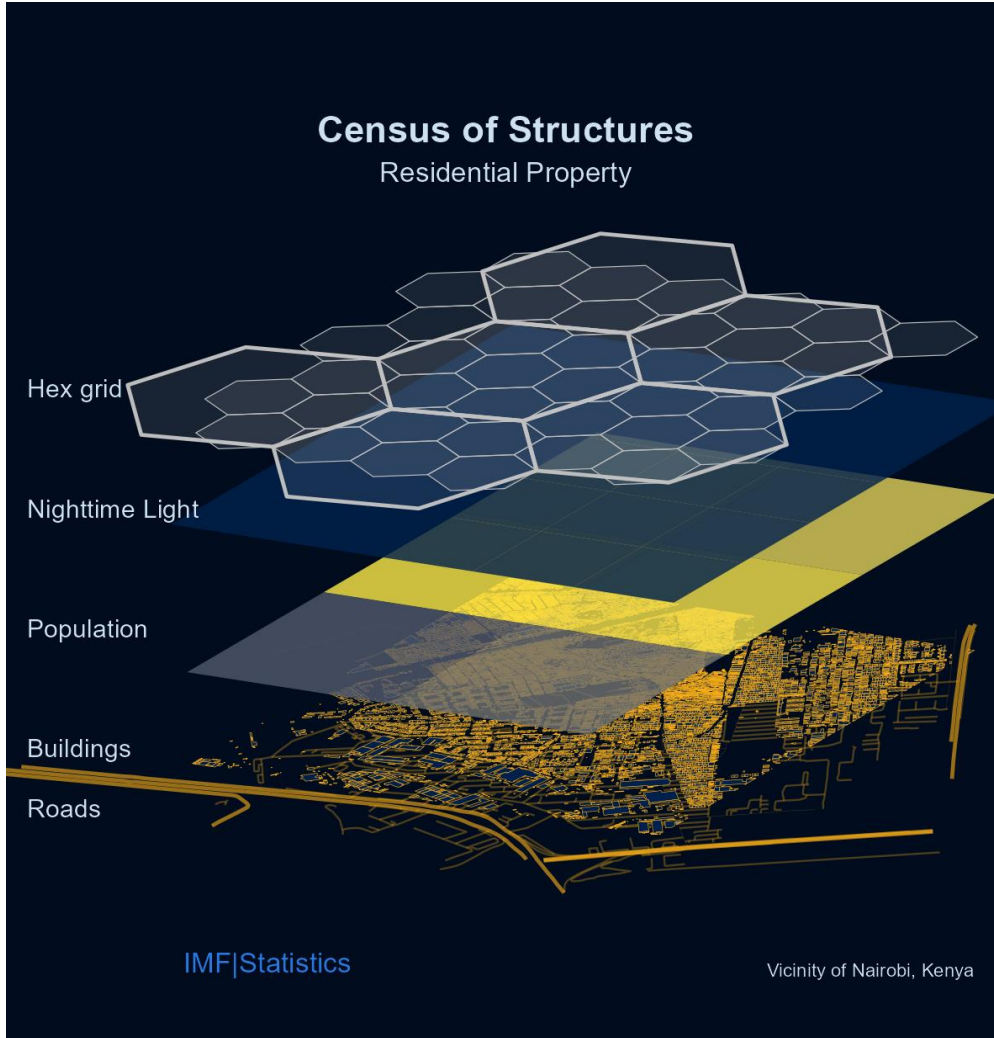
Data Gaps Initiative 3



International statistical standards updates



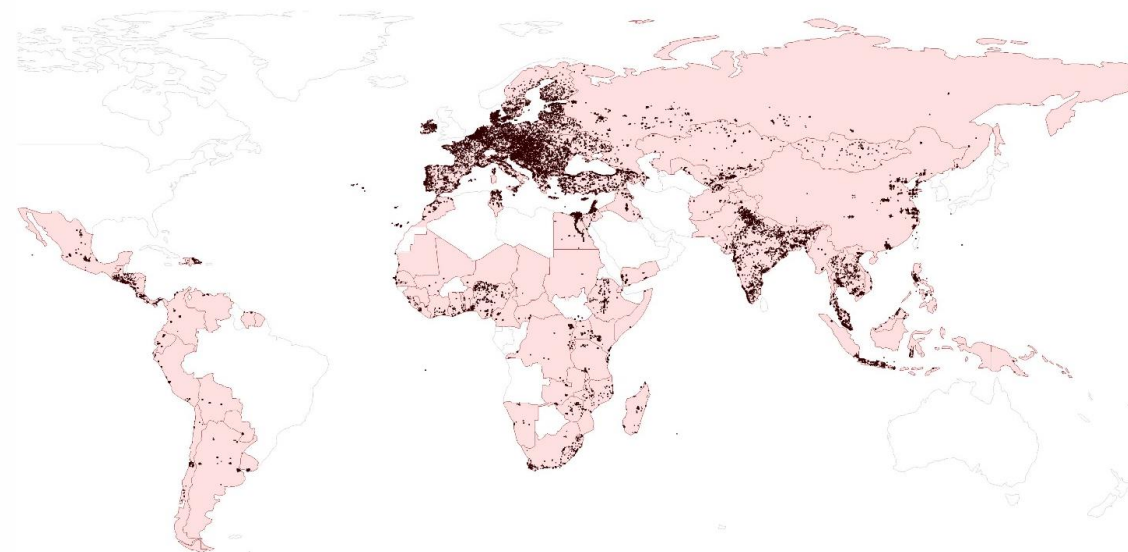
Census of Structures for climate change physical and transition risk indicators



Leveraging Geospatial Data | Firms Exposure

- Climate hazards have detrimental effects on businesses across the globe:
 - Firm performance (productivity, profitability)
 - Labor market dynamics
 - Trade
 - Growth
- Transition risk also has implications for firms
 - Changes in climate policy offer both risks and opportunities
 - Financial sector implications: Carbon footprints of bank loans
- CID provides experimental forward-looking transition risk indicators

Figure: Location of businesses (Enterprise Survey)



Note: These are nationally representative firms from the Enterprise Survey of the World Bank

Leveraging Geospatial Data | Agricultural Exposure

- Agriculture is a key sector for many economies with implications on
 - Export (Forex/BOP)
 - Food Inflation
 - Employment
 - Livelihood & subsistence
- Drought, unpredictable weather are major climate change-related risks affecting agricultural activities.
- Climate risk assessment is therefore necessitating granular geospatial data on
 - Location and size of parcels
 - Crop type
 - Agronomy
 - Irrigation, etc.

Figure: Crop land exposure to drought (in a dying Salton Sea, CA)



Source: [The Salton Sea, an Accident of History, Faces a New Water Crisis - The New York Times \(nytimes.com\)](https://www.nytimes.com)

Global Datasets and Geospatial Tool

Climate Risk Indicators

Work is in progress to develop a tool that integrates different layers on hazards and exposure to identify the hot spots for risk using global data sets

Working with many institutions to develop this information

- World Bank; European Space Agency; Basque Center for Climate Change; UN World Meteorological Organization; others

Support countries to develop its own estimates building on global data sets

Monitoring Trade Disruptions | PORTWATCH

IMF | PORTWATCH
A PARTNERSHIP WITH OXFORD UNIVERSITY

ABOUT US | FEATURED | SIGN UP FOR ALERTS | ACCESS DATA | IMF

PORT MONITOR | RECENT DISRUPTIONS | SPILLOVER SIMULATOR | CLIMATE SCENARIOS

Monitoring Trade Disruptions from Space

PortWatch is an open platform designed to monitor and simulate disruptions to maritime trade flows. The platform helps policymakers and the public assess the impact of realized and future trade shocks, such as natural disasters, based on real-time data sourced from the [UNGP](#).

Access Data: Access all data that power the PortWatch platform [here](#).

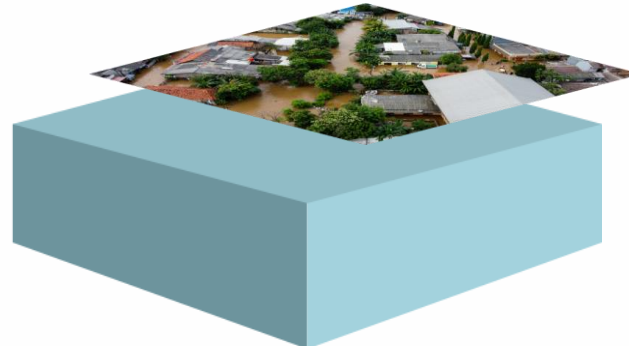
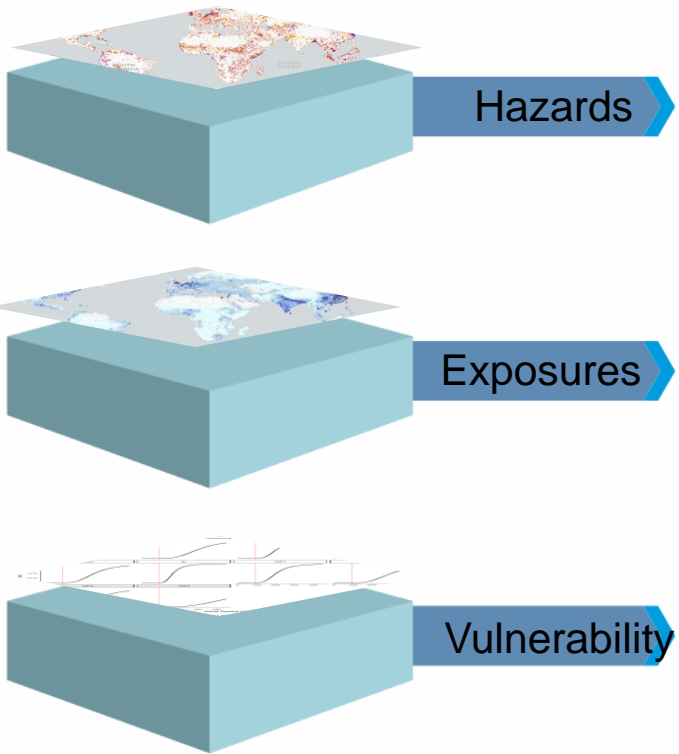
[CURRENT & RECENT DISRUPTIONS](#)

Tropical Cyclone BERYL-24

United States, Mexico, Jamaica: June 28 - July 9, 2023

 Houston, United States Notable Port Explore	 Mineral Products Sector most impacted	 9M Exposed Population
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The screenshot shows a dark-themed website interface. At the top, there is a navigation bar with the IMF logo and 'PORTWATCH' branding, along with a partnership with Oxford University. The main navigation includes 'PORT MONITOR', 'RECENT DISRUPTIONS', 'SPILLOVER SIMULATOR', and 'CLIMATE SCENARIOS'. A secondary navigation bar contains 'ABOUT US', 'FEATURED', 'SIGN UP FOR ALERTS', 'ACCESS DATA', and 'IMF'. The main content area features a large heading 'Monitoring Trade Disruptions from Space' and a descriptive paragraph about the platform's purpose. Below this is a section for 'CURRENT & RECENT DISRUPTIONS' with a featured entry for 'Tropical Cyclone BERYL-24'. This entry includes the affected regions (United States, Mexico, Jamaica) and dates (June 28 - July 9, 2023). A summary table highlights key impacts: Houston, United States as a notable port, Mineral Products as the most impacted sector, and 9 million people exposed. On the right side of the page, there is a large globe visualization with blue lines representing trade routes and orange dots indicating port locations. A 'Play' button and zoom controls are visible over the globe.



Damages

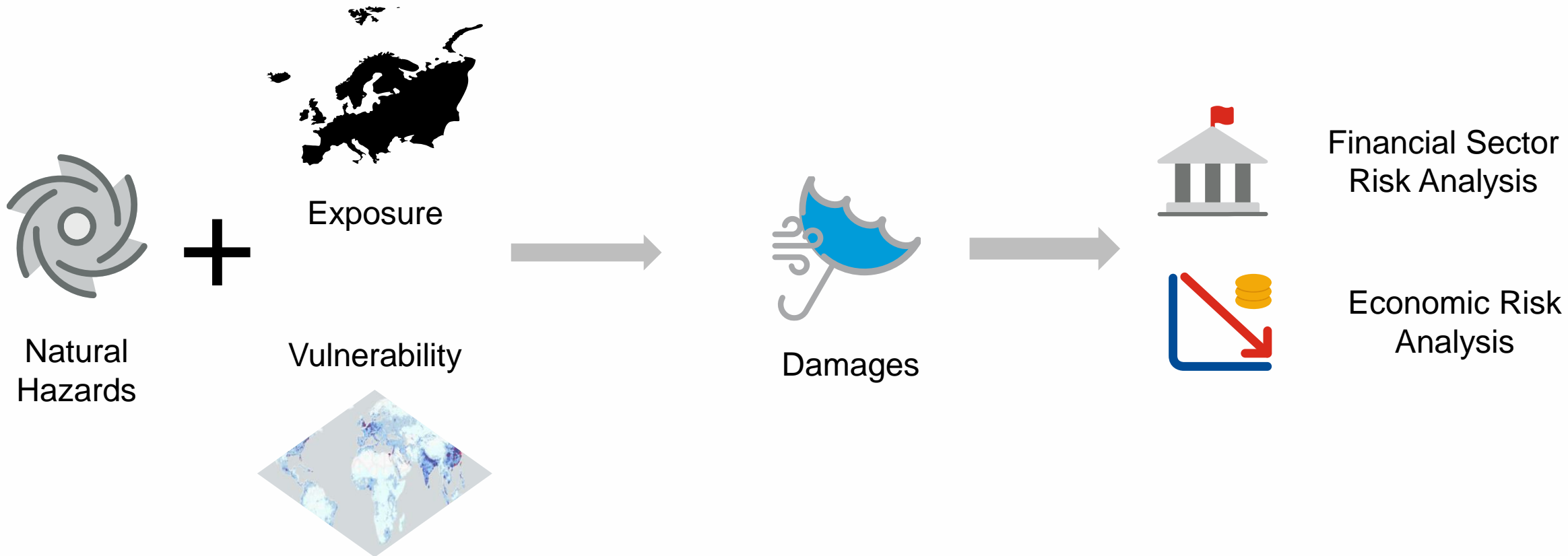


Financial Sector Risk Analysis



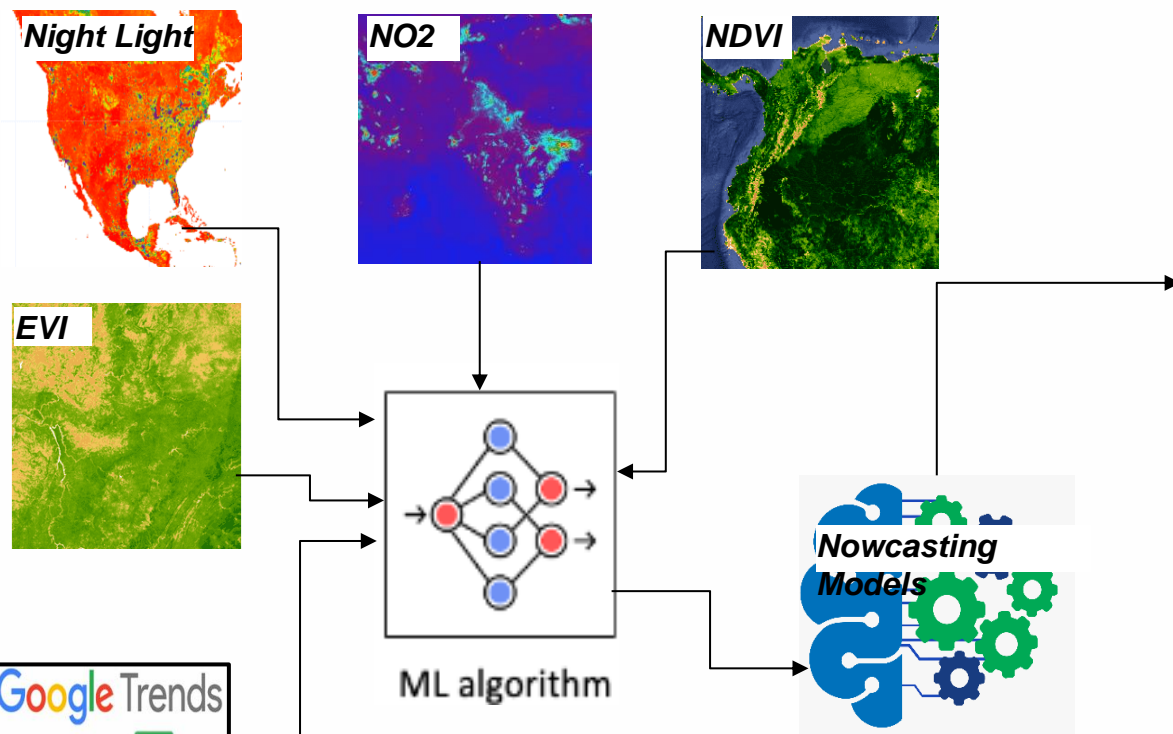
Economic Risk Analysis

Benefits of Geospatial Data for Policy Analysis



GDP Nowcasting

- Role of geospatial data for GDP nowcasting is also critical
- This project leverages big (non-traditional) data to address delays in GDP data dissemination or lack of capacity to publish quarterly GDP data, enriching policy advice.



IMF | GDP Nowcasting Hub

Select a country

Rwanda

date

1/1/2012

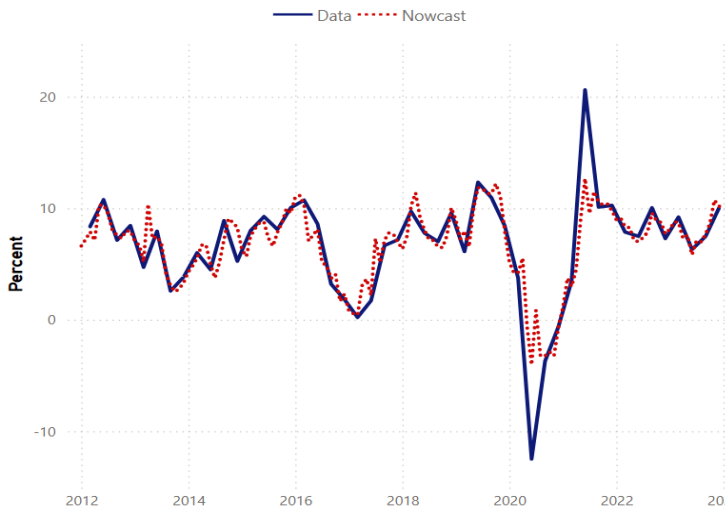
1/1/2024

Export to csv

Year-over-year Rolling Quarterly GDP growth

Shapley Decomposition

Support Vector Machine (RBF) with Variable Selection



Top 5 models

Model	Sum of RMSE
Support Vector Machine (RBF) with Variable Selection	1.24
Gaussian Process (RBF)	1.78
Gaussian Process (RBF) (oneSE)	1.78
Support Vector Machine (RBF)	2.03
Support Vector Machine (RBF) (oneSE)	2.04

DATA TO SUPPORT A BETTER UNDERSTANDING OF FUTURE PHYSICAL RISK

Base layer

- Topographical map

Hazard layer

- Number of days per year with heat index greater than 35°C

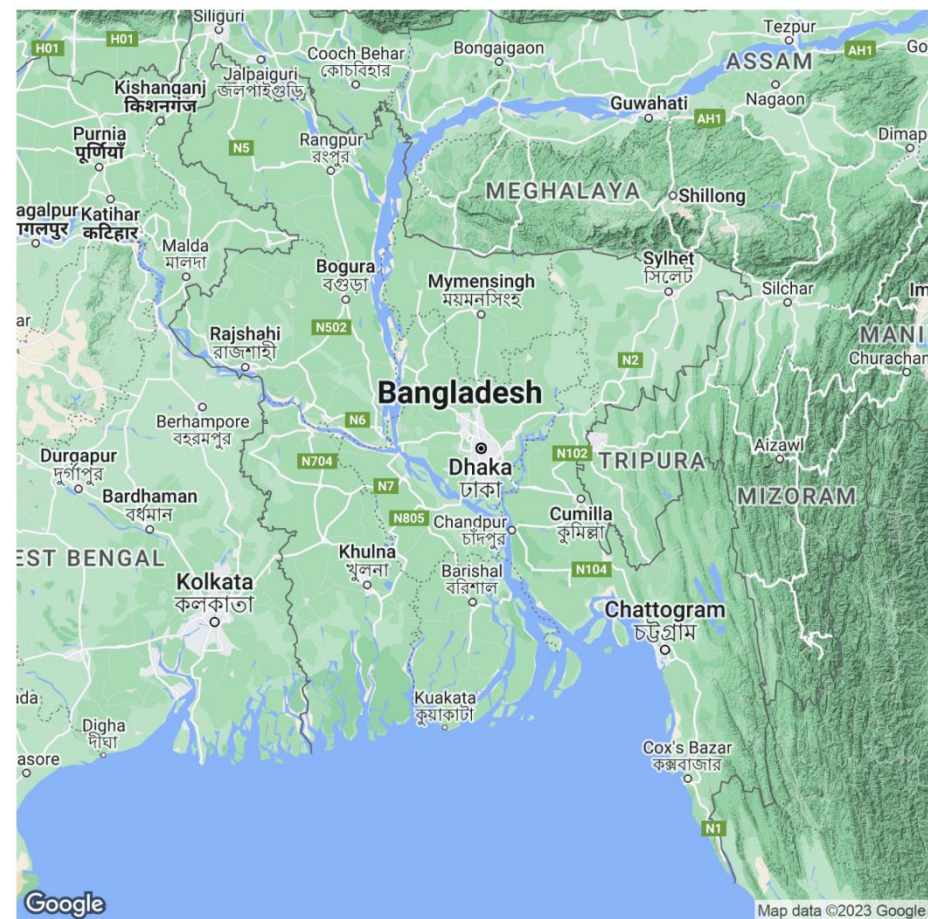
Exposure layer

- Gridded GDP

Vulnerability layer

- Damage functions – not yet

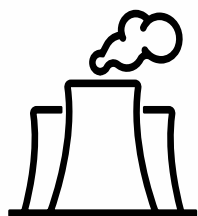
Terrain Map of Bangladesh



Sources: Google (2023), Maps Platform; and GADM (2022), version 4.1.

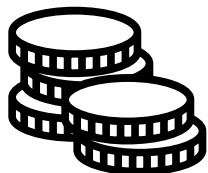
The boundaries, colors, denominations, and any other information shown on maps do not imply, on the part of the IMF, any judgment on the legal status of any territory or any endorsement or acceptance of such boundaries.

Main Topics of CD Engagement



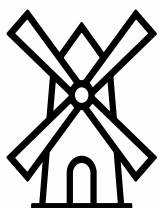
Energy, GHG Emissions and Carbon Footprints

- Air emission accounts
- Energy accounts
- Carbon footprints



Climate Finance

- Taxonomies
- Data collection
- Experimental indicators



Natural Resources Accounting

- Mineral and energy resources
- Renewable energy



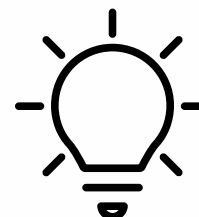
Climate Risk Data

- Physical and transition risk indicators
- Methodological framework
- Climate scenario analysis
- Tools (including geospatial tool)



Climate Mitigation and Adaptation

- Environment and climate related expenditures
- Environmental taxes
- Climate related subsidies



Emerging Areas

- Land cover/ Water accounts
Energy/Forest/Biodiversity

DGI-3 Recommendation 5: Forward-looking Physical and Transition Risk Indicators

- Monitoring risks from frequent and severe climate hazards (e.g., floods, droughts) and the impact of climate policy on populations, national wealth, and firms' stability is essential.
- These indicators help policymakers determine climate policy timing, scope, and support for climate action.

Policy Driver

- **Quantify and monitor forward-looking risks to help prioritize and develop support for climate action.**

Statistical Output

- **Forward looking physical and transition risk indicators (risk to populations, economic growth, financial markets, profits, ecosystems, etc.)**

Co-lead organizations

- **IMF**
- **BIS**
- **ECB**
- **FSB**
- **OECD**
- **World Bank**