



# Asian Actuarial Conference 2025 Bangkok

Enhancing Population Health Resilience to Climate Risks

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**R. Dale Hall**

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# Enhancing Population Health Resilience to Climate Risks

Improving Disaster Resilience in ASEAN

An Open Statistical Toolkit to Modeling Natural Catastrophe Risk

R. Dale Hall, FSA, MAAA, CERA, CFA

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# Climate Change and Health

- WHO has been working on climate change and health for over 25 years
- Advocating, collecting evidence and providing comprehensive support to countries in dealing with health effects of climate change.
- SOA Research Institute
  - Catastrophe and Climate Research Program
  - Health Care Cost Trends Research Program



# Climate Change and Health

- Research on the health impacts of hurricanes
- Immediate risks: drowning and injury
- Long-term effects:
  - Lack of access to healthcare
  - Contaminated water
  - Stress
  - Carbon Monoxide
  - Mold
- Increased hospitalizations for cardiovascular issues, higher emergency room visits for conditions like diabetes, and adverse health outcomes in the weeks and months following a hurricane



# Climate Change and Health

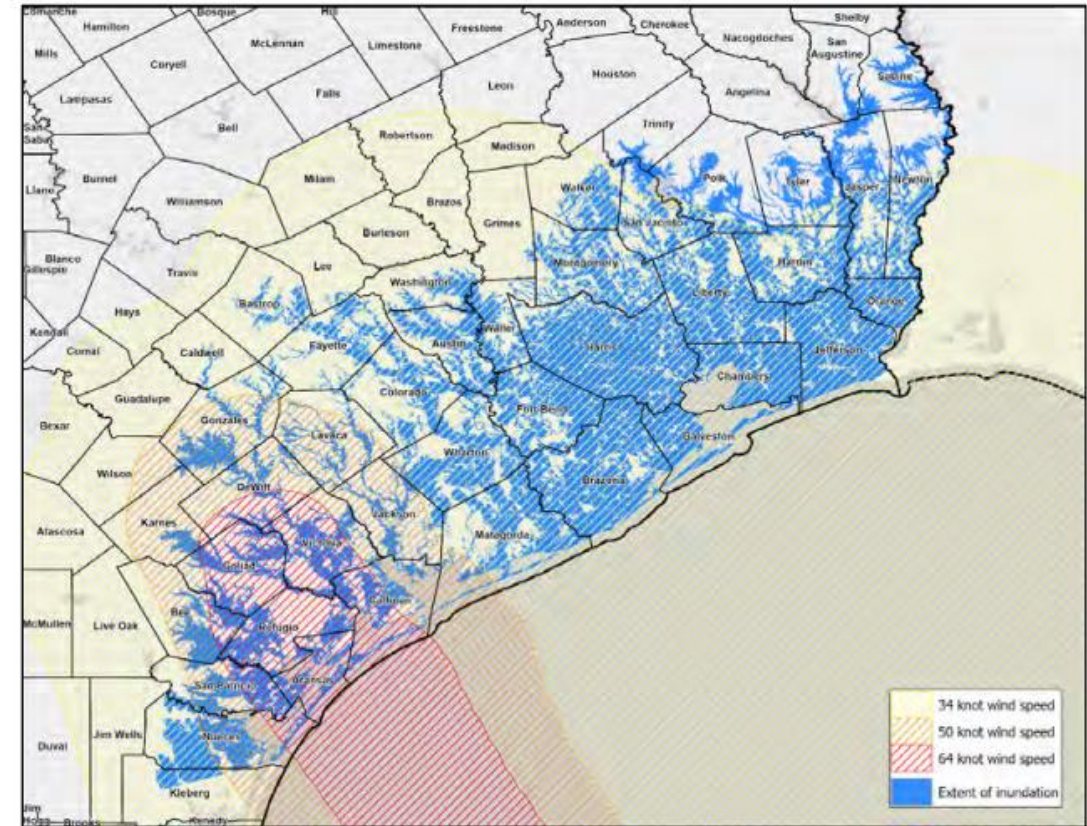


## Health and Hurricanes

Studying Disparate Health Impact of Extreme Climate Events, 2017-2020



COMPARISON BETWEEN WIND SWATH LAYERS AND FEMA INUNDATION LAYERS (FIGURE 3)



# Climate Change and Health

- Climate-transformative leadership and governance
- Climate-smart health workforce
- Assessment of climate and health risks and GHG emissions
- Integrated risks monitoring, early warning, and GHG emissions tracking
- Health and climate research
- Climate-resilient and low carbon infrastructures, technologies, and supply chain
- Management of environmental determinants of health
- Climate-informed health programmes
- Climate-related emergency preparedness and management
- Sustainable climate and health financing



# Presentation Outline

- Background and motivation
- Data
- Exploratory analysis
- Proposed modeling framework
- Ongoing work



# Background of the Project

- An SOA-funded research project
- Led by a team of academic researchers
- Advised by a Project Oversight Group of experienced practitioners
- A strong example of academia–industry collaboration



# Background of the Research

- ASEAN countries sit in a disaster-prone region:
  - 2011 Thailand floods (Thailand; **US\$10 billion**)
  - 2013 Typhoon Haiyan (Philippines; **US\$2.99 billion**)
  - 2020 Central Vietnam floods (Vietnam; **US\$1.57 billion**)
  - 2024 Typhoon Yagi (Philippines, Thailand, Vietnam, etc; **US\$3.3 billion**)
  - 2025 Myanmar Earthquake (Myanmar; **US\$11 billion**)
- Factors intensifying impacts:
  - Climate change
  - Dense populations
  - Rapid urbanization
  - Varying levels of infrastructure resilience





# Motivation

## NAT CAT models support decision-making:

- Insurance industry
- Regulatory authorities
- Public sector agencies

## Commercial platforms:

- Moody's RMS
- AIR Worldwide
- Aon Impact Forecasting
- KatRisk, etc.

## Common limitations:

- Limited transparency for trust building
- Difficult to incorporate with local data
- High financial costs and specialized expertise requirements for small insurers or policy-making agencies



# Goals

- Building an open statistical framework for modeling NAT CAT risk in ASEAN countries.
- Emergency Events Database (EM-DAT):
  - A **publicly available multi-peril** disaster database
  - Since 1900 and systematically since 1988
  - Meeting at least one criterion:
    - $\geq 10$  fatalities
    - $\geq 100$  people affected
    - state of emergency

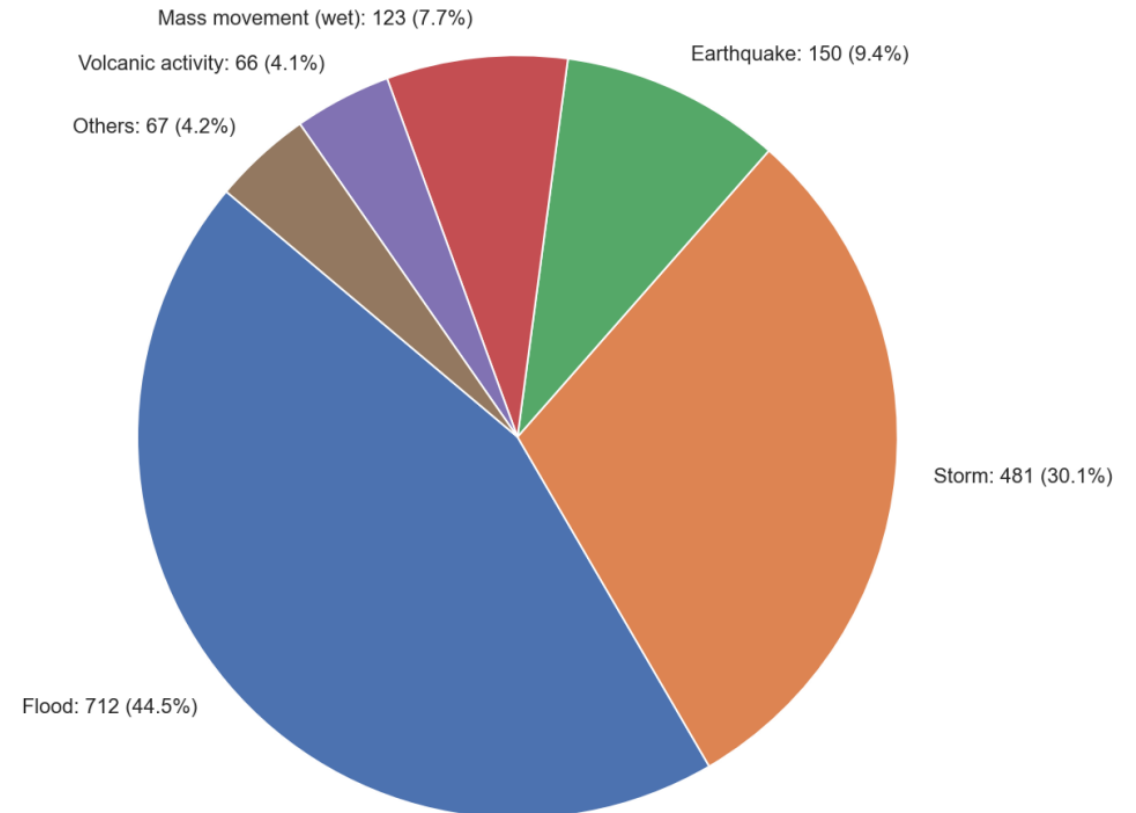


**EM-DAT**  
The International Disaster Database  
Centre for Research on the Epidemiology of Disasters



# Frequency of Disaster Types

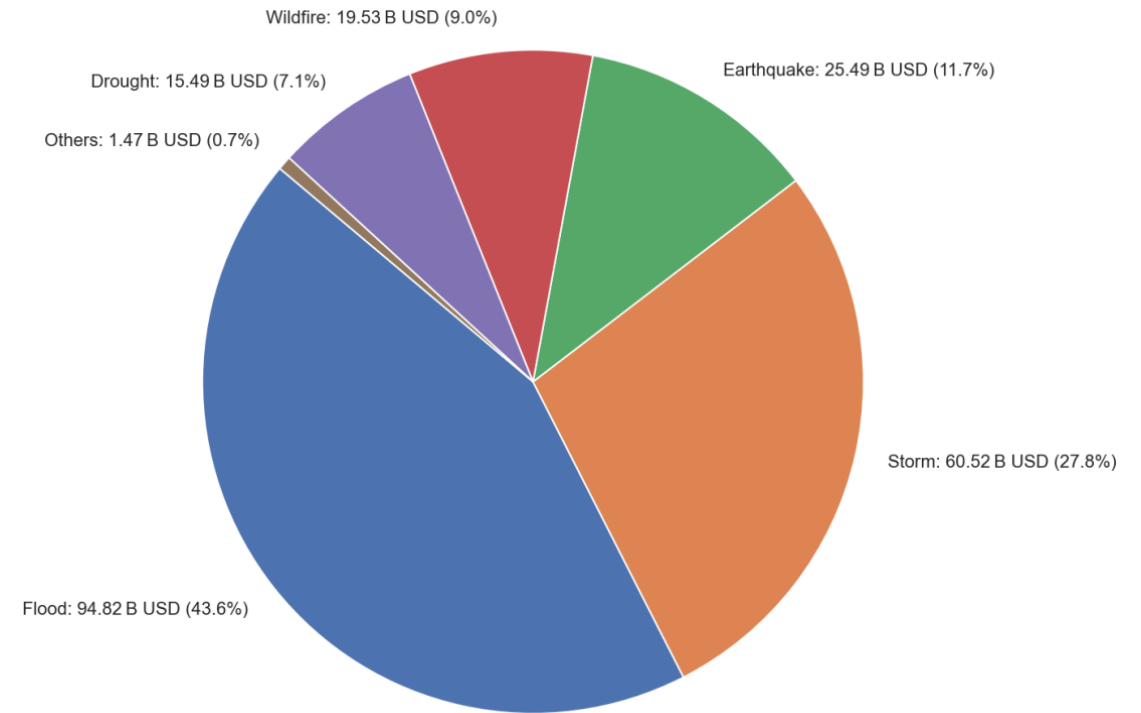
- Most frequent disasters:
  - Floods
  - Storms
  - Earthquakes
- Together: Above 83% of total events





# Total Damages of Disaster Types (CPI Adjusted)

- Most severe disasters:
  - Floods
  - Storms
  - Earthquakes
- Together: About 86% of total events
- The top 3 most frequent disaster types cause the greatest financial damage





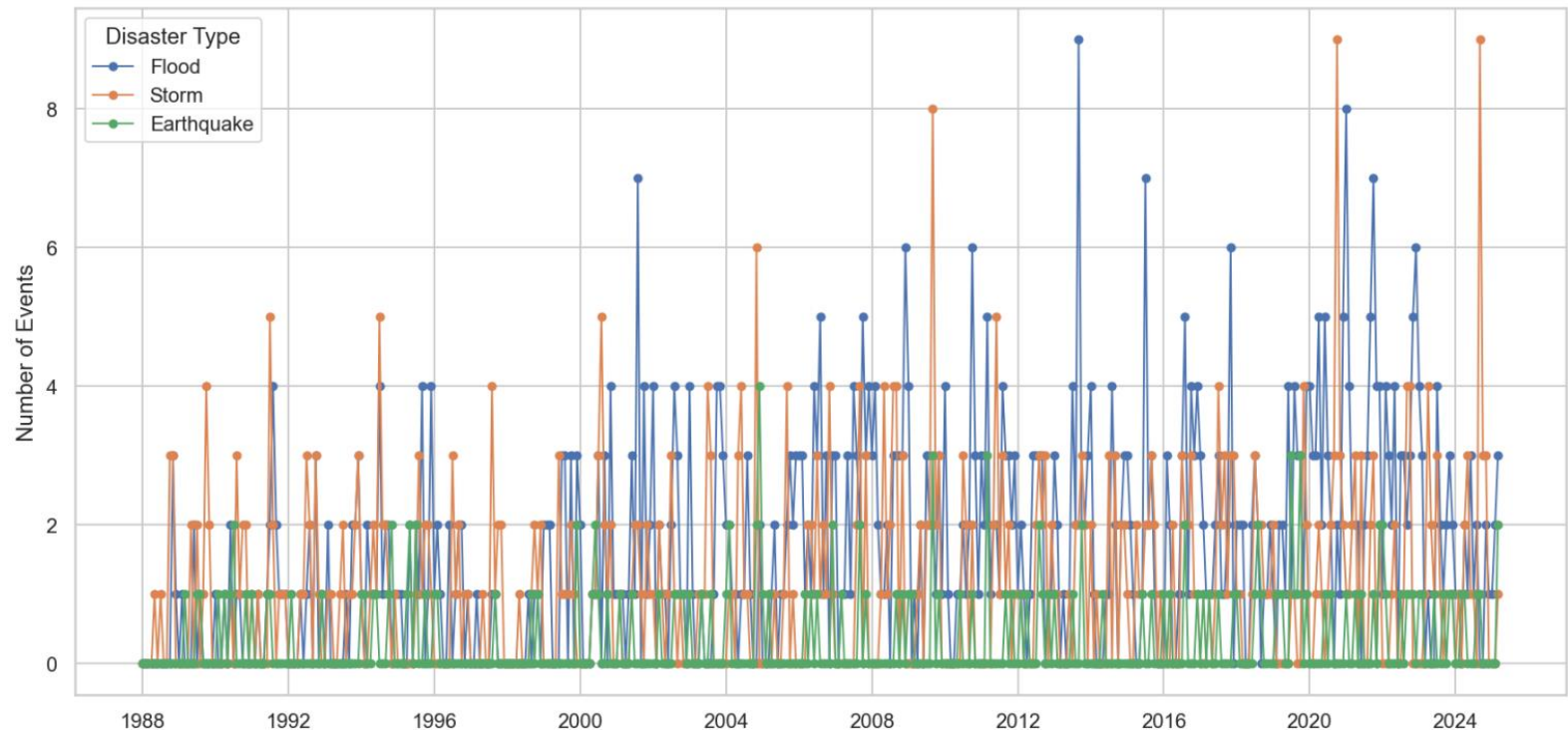
# Trends in Disaster Frequency (Monthly)



Floods and storms appear to be becoming more frequent



Earthquakes have shown a consistent frequency overtime

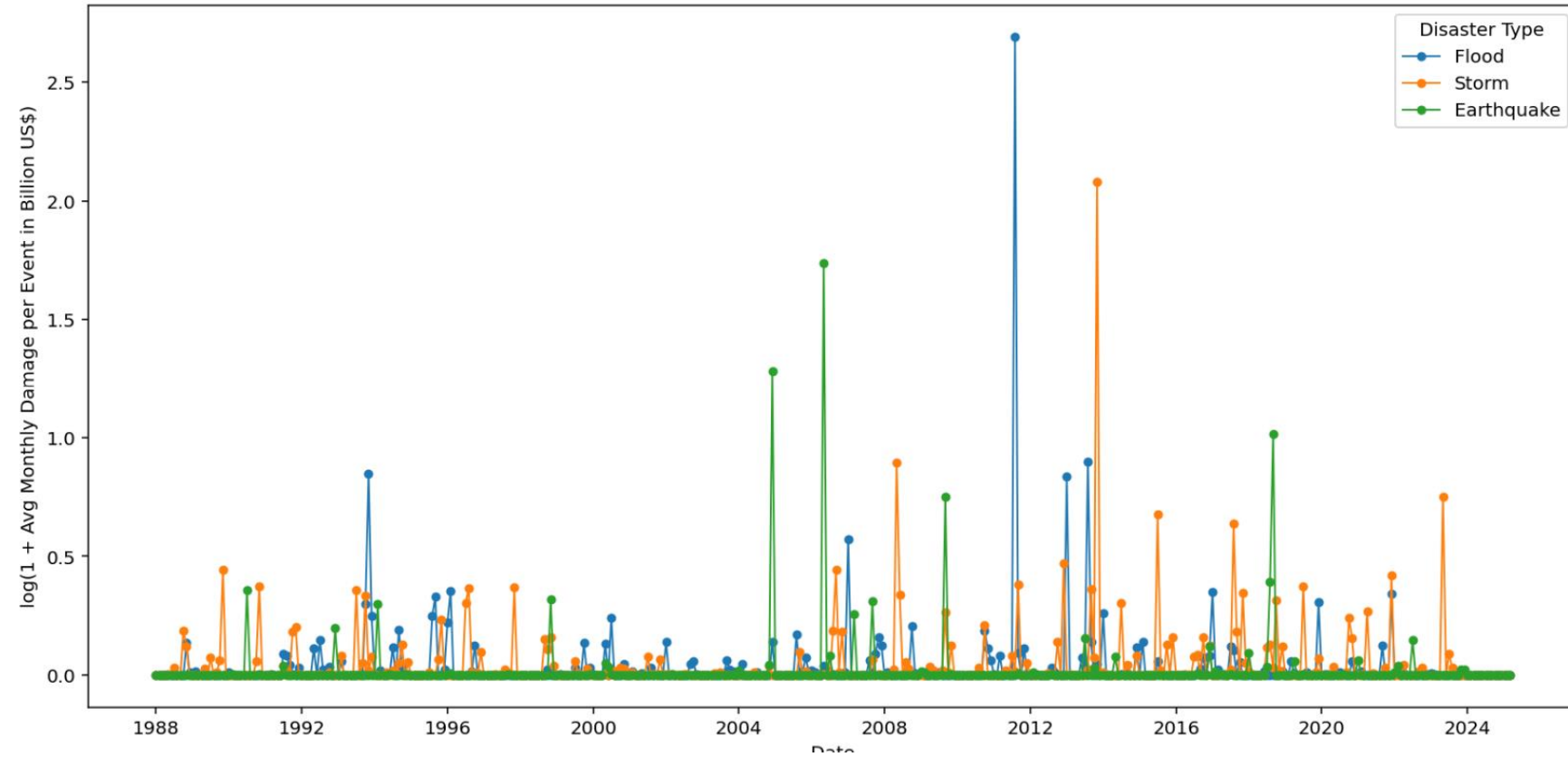




# Trends in Disaster Severity per Event

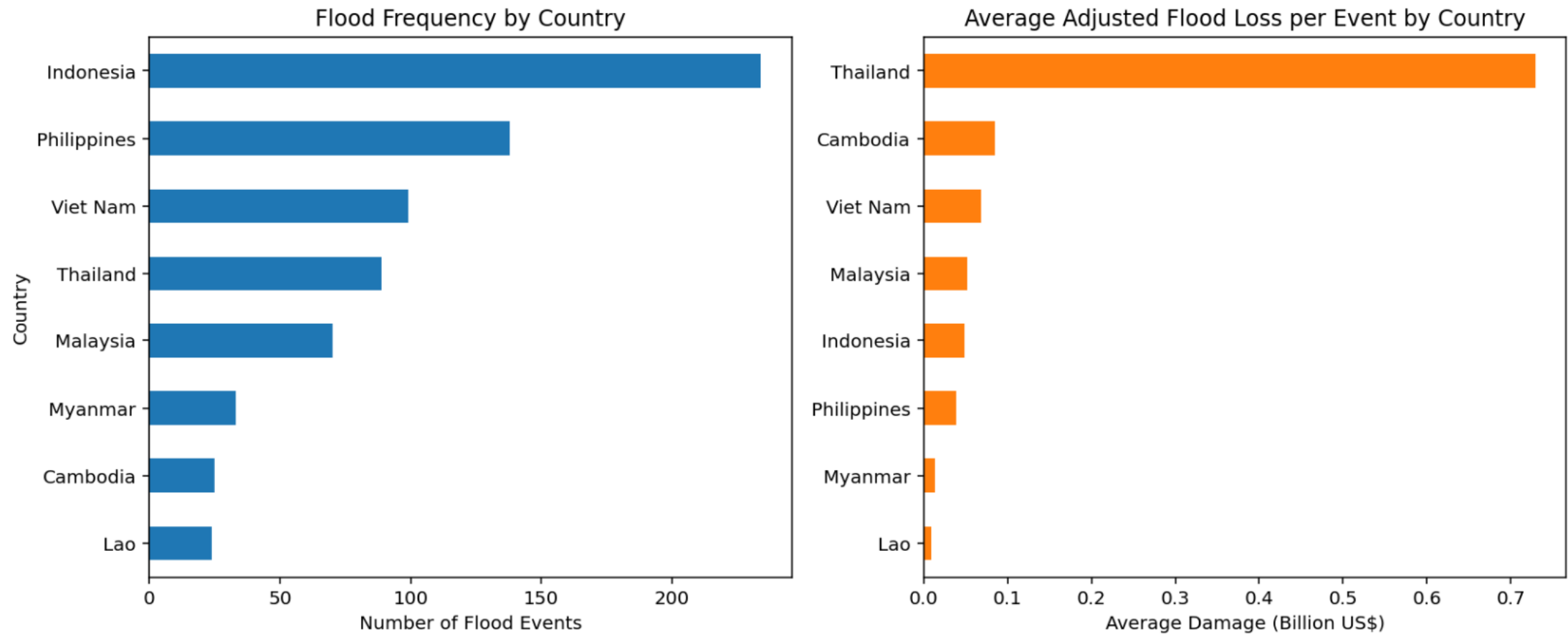


Extreme disasters are occurring more often and with greater severity.



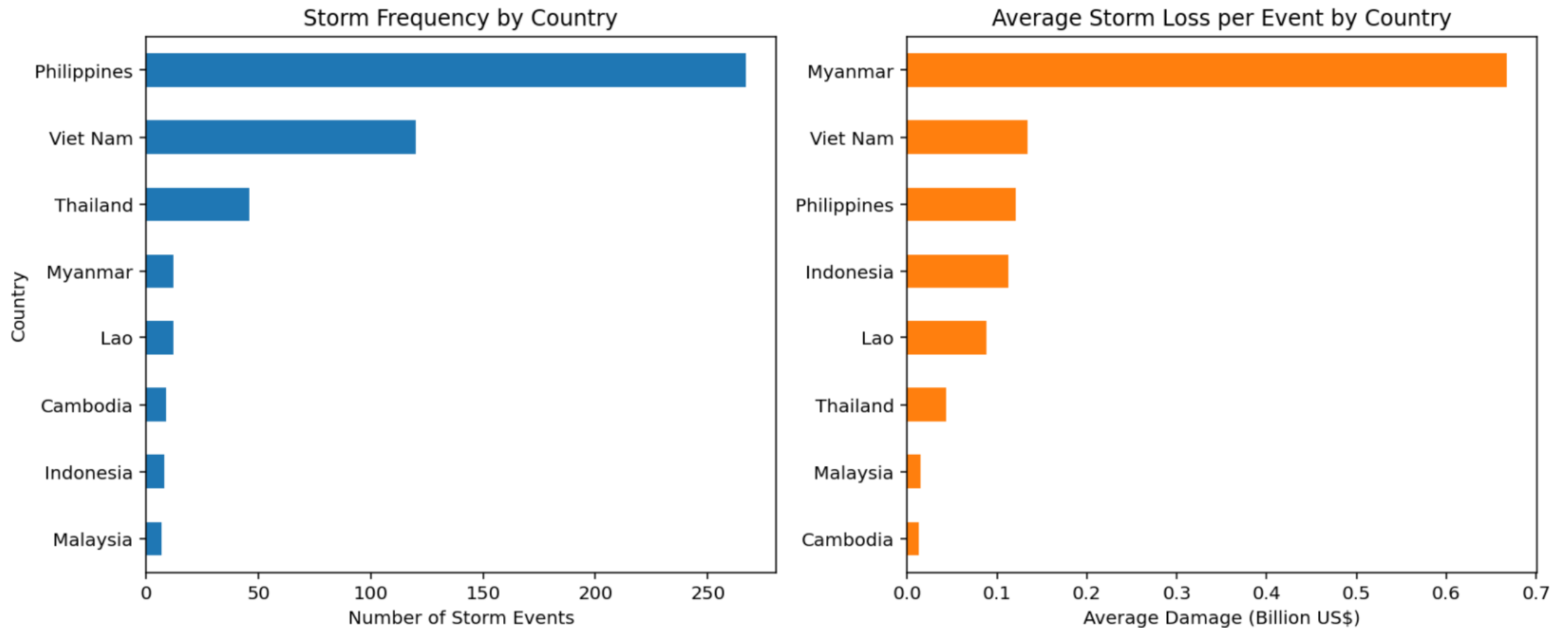


# Country-Level Breakdown: Flood Events



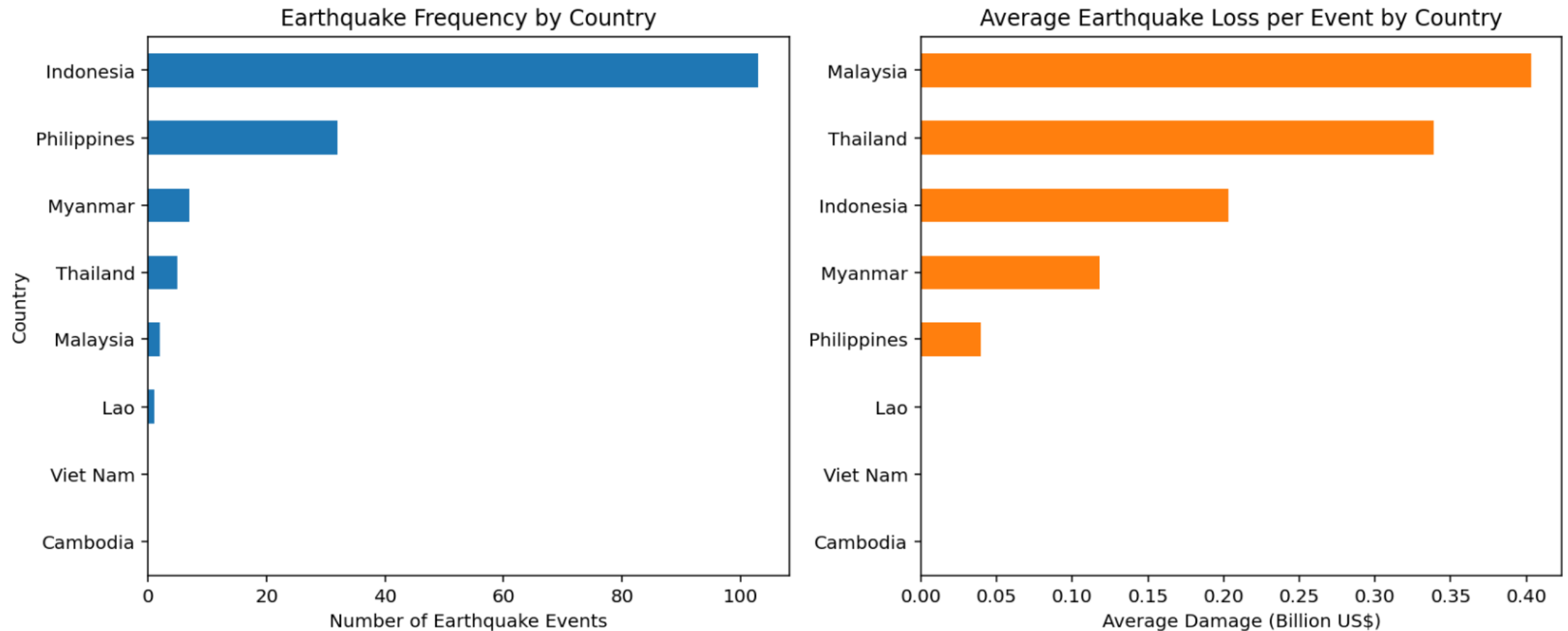


# Country-Level Breakdown: Storm Events



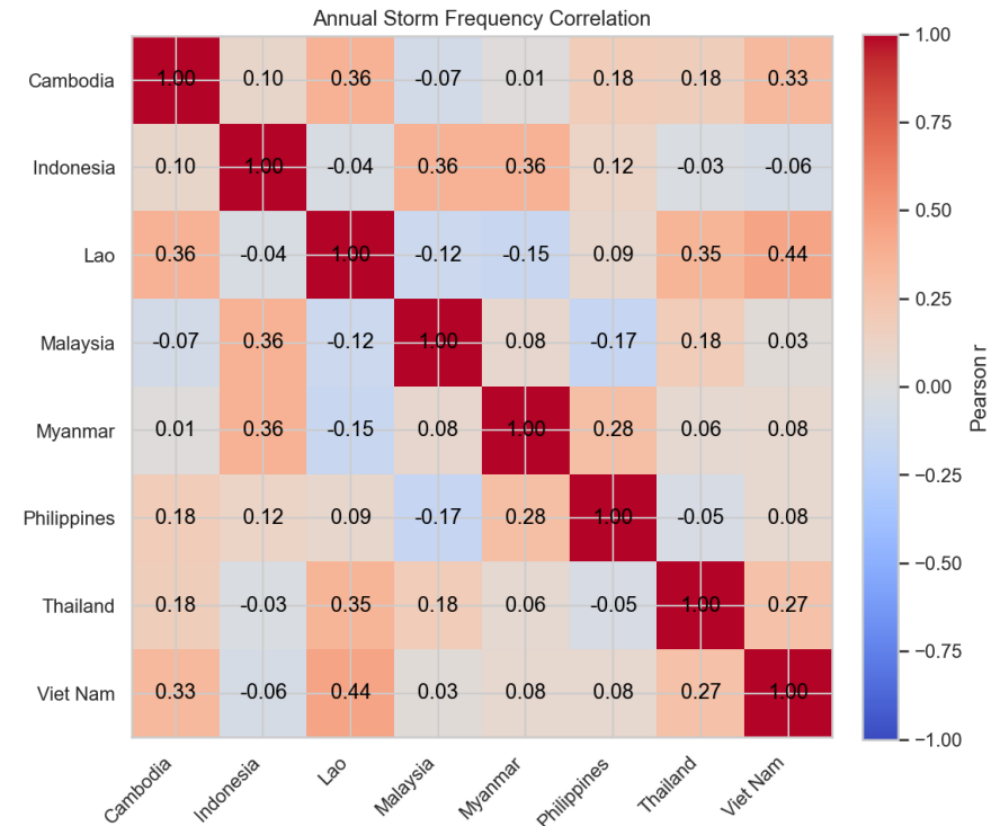
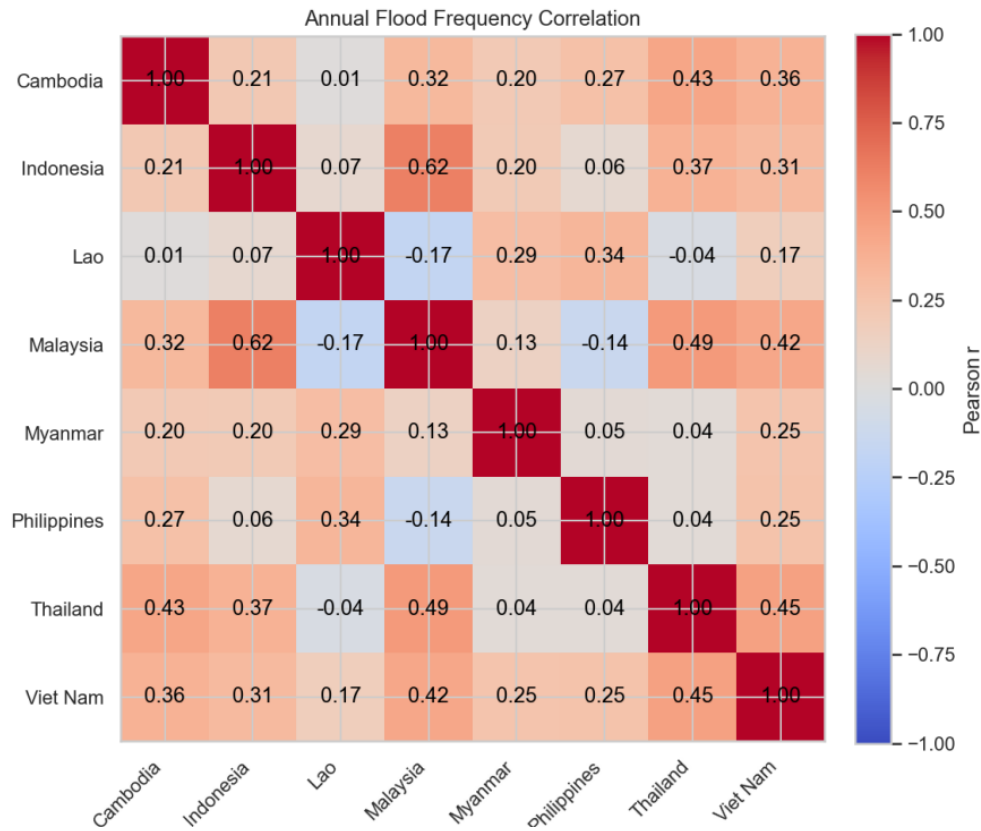


# Country-Level Breakdown: Earthquake Events

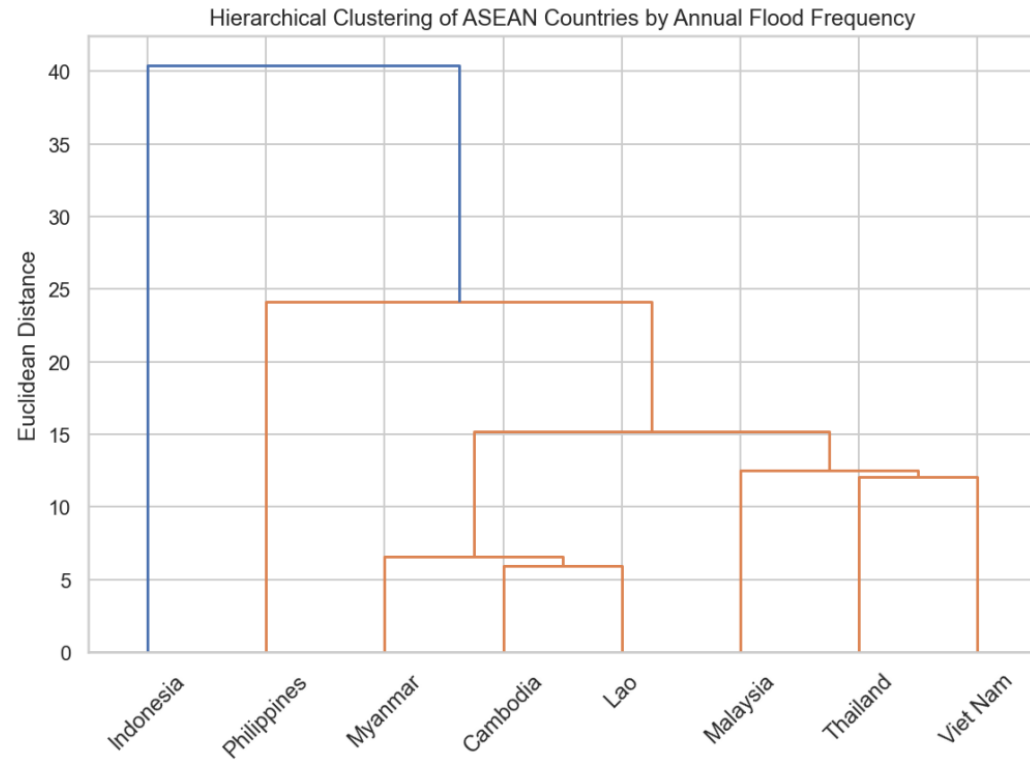




# Spatial Dependencies

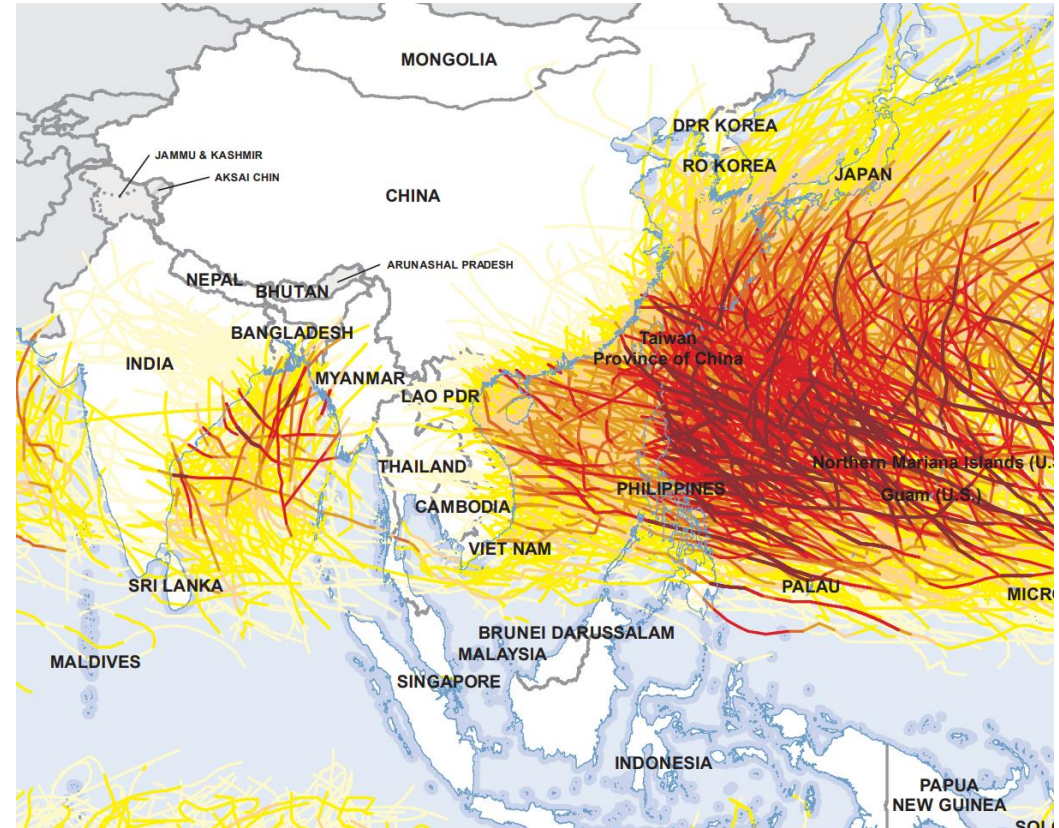
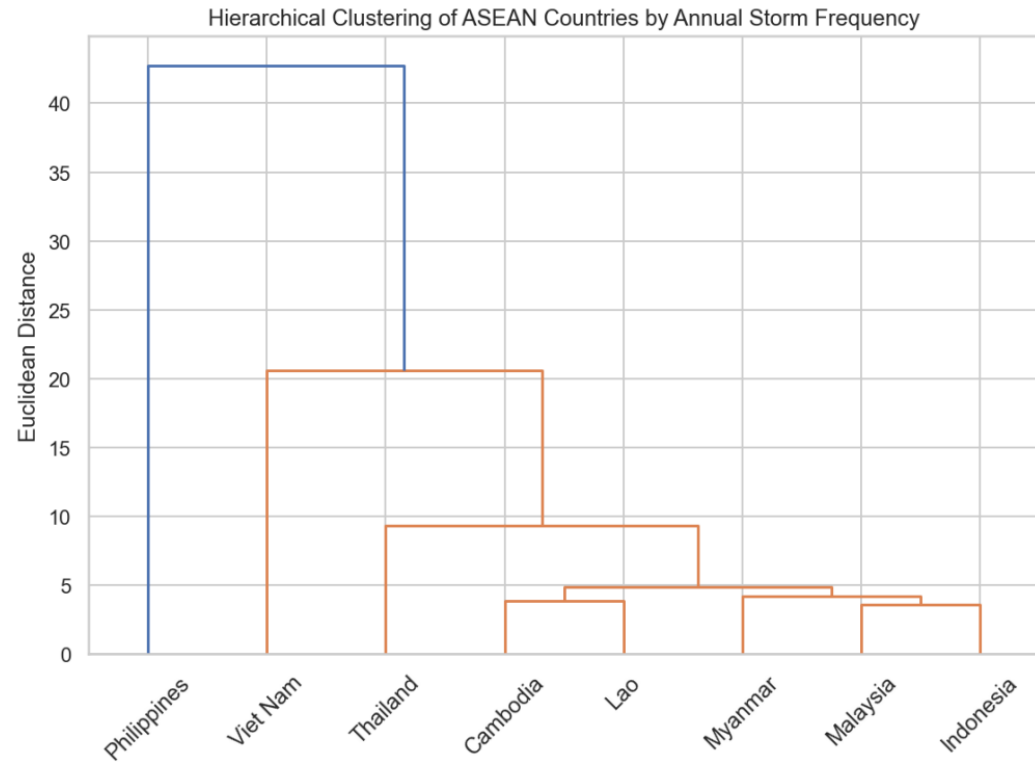


# Spatial Clusters: Flood Frequency





# Spatial Clusters: Storm Frequency



# Takeaways for Model Building

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**Risk profiles vary significantly across countries.**

Each country requires models tailored to its own data characteristics.

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**Country-specific calibration is essential.**

Localized models better capture unique hazard patterns and vulnerabilities.

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**Joint modeling can enable spatial data sharing.**

Estimating models jointly allows for borrowing strength across countries where appropriate.

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**Frequency and severity rankings may differ.**

The most frequent disasters are not always the most severe.

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**Model frequency and severity components separately.**

Treat them as distinct processes to improve accuracy and interpretability.





# Core Statistics Ingredients

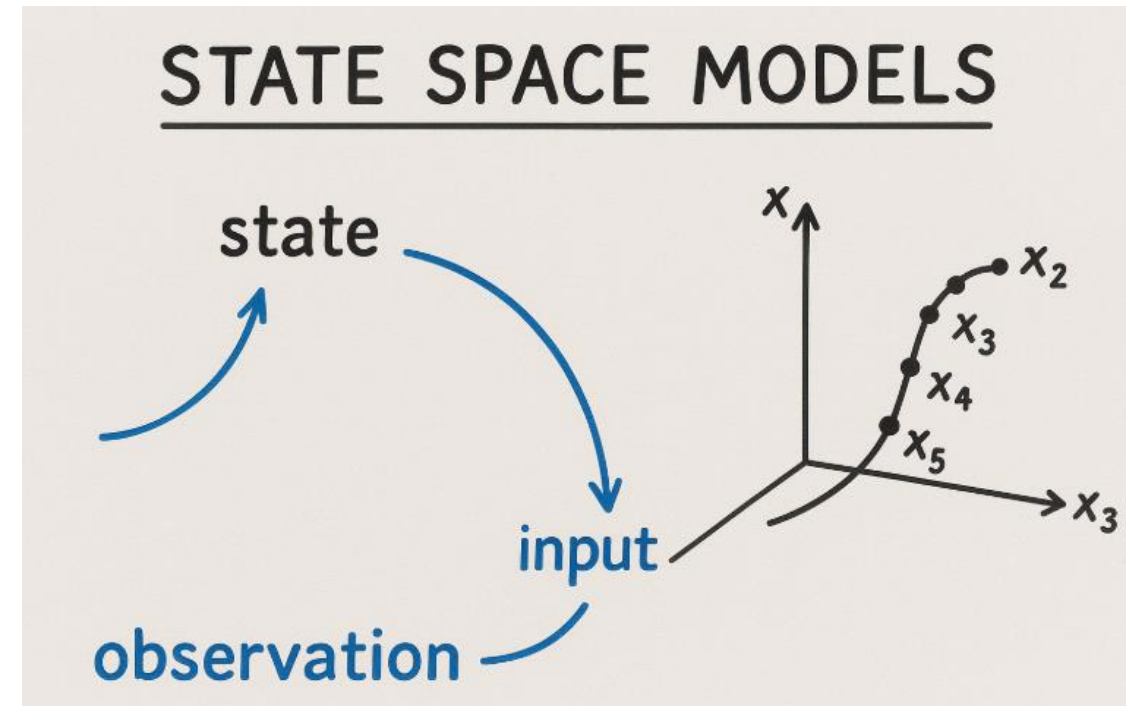
- State Space Models:
  - Time series
  - Exogenous drivers
  - Irregular patterns

- An observation equation:

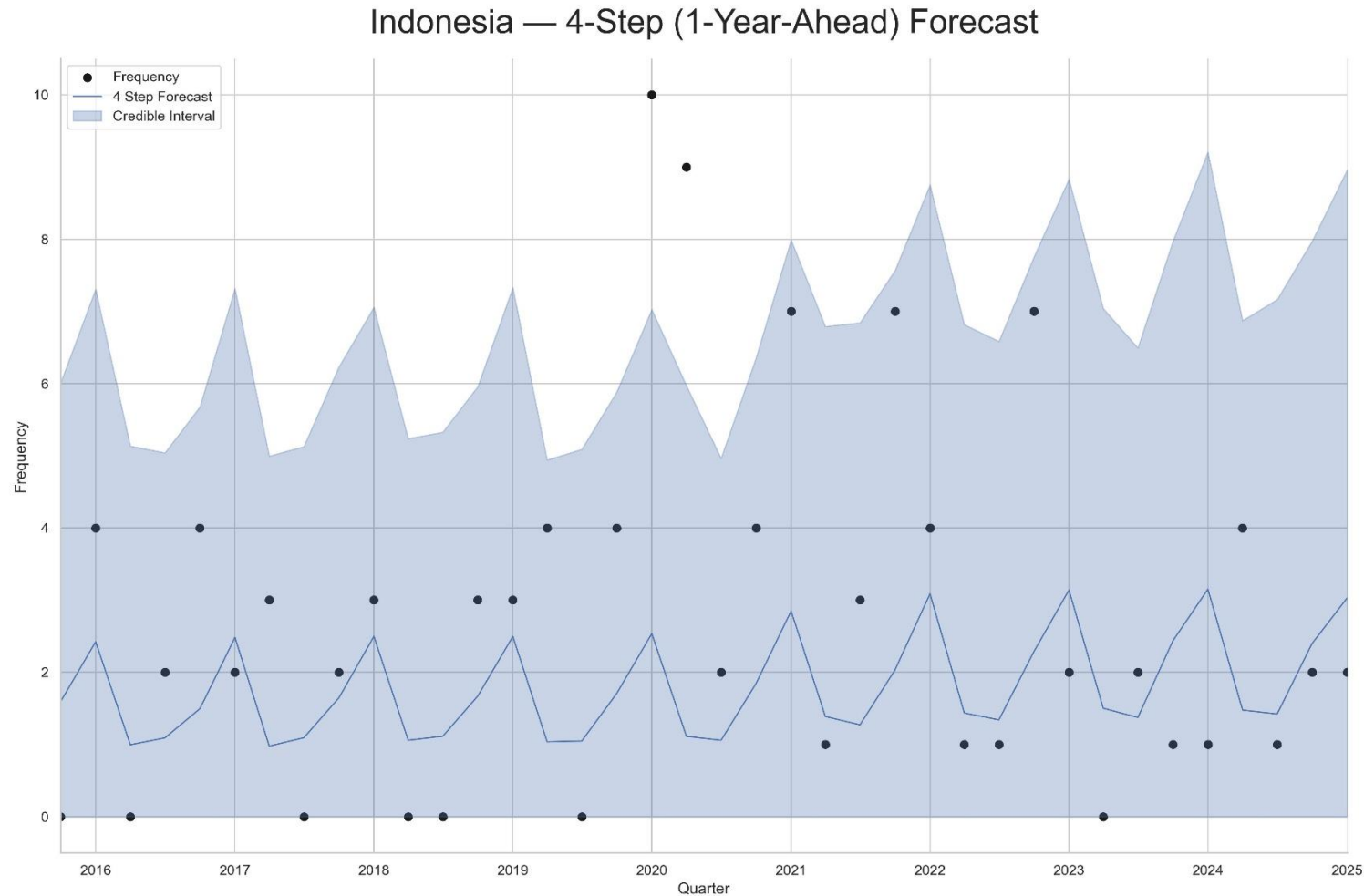
$$g(y_t) \sim \theta_t + X_t + \epsilon_t^O,$$

- A state evolution equation:

$$\theta_t \sim \theta_{t-1} + \epsilon_t^S.$$

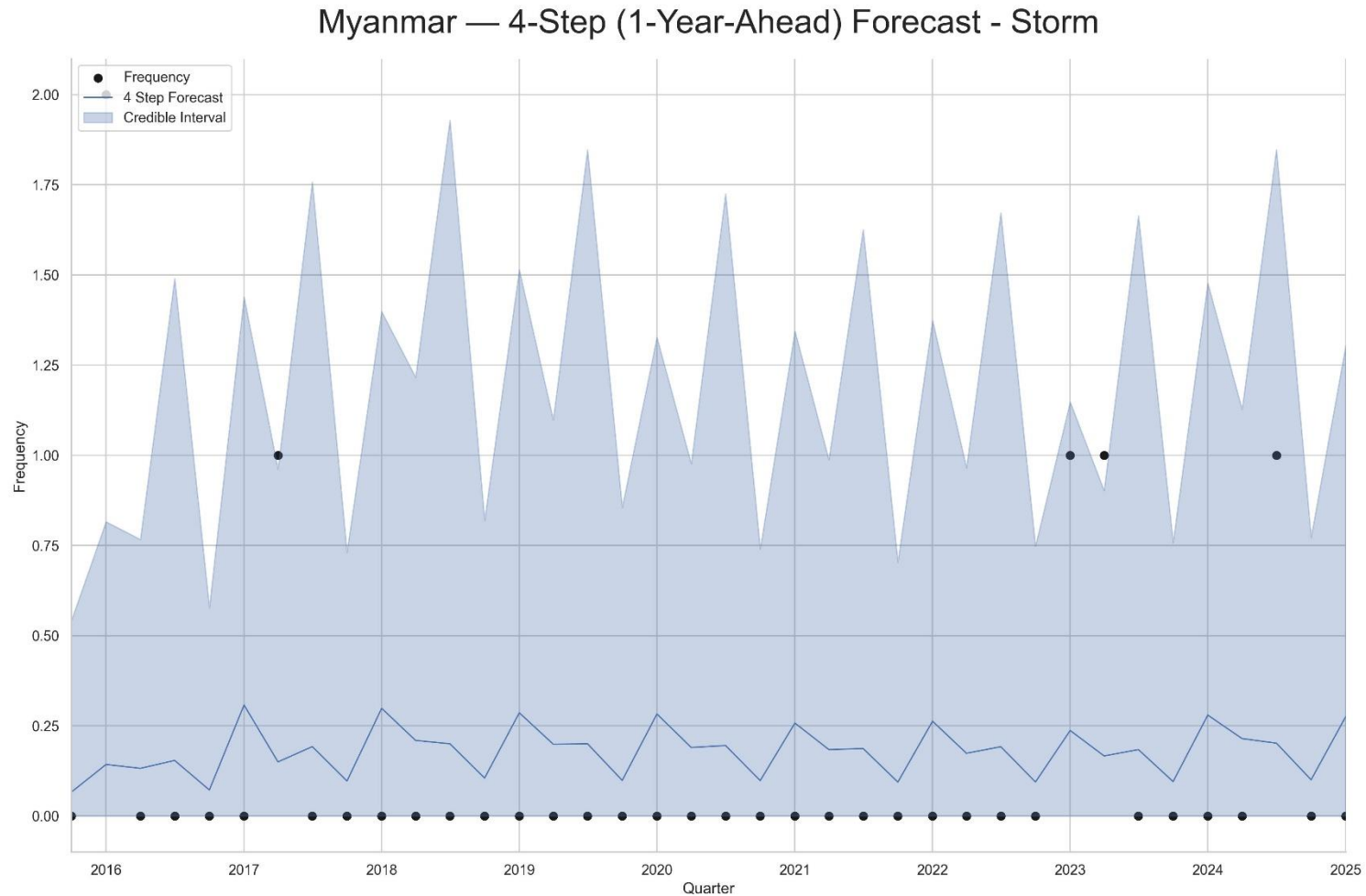


# Mean and 99% Credible Interval Forecast: **High** Frequency Country (Flood)





# Mean and 99% Credible Interval Forecast : **Low** Frequency Country (Storm)



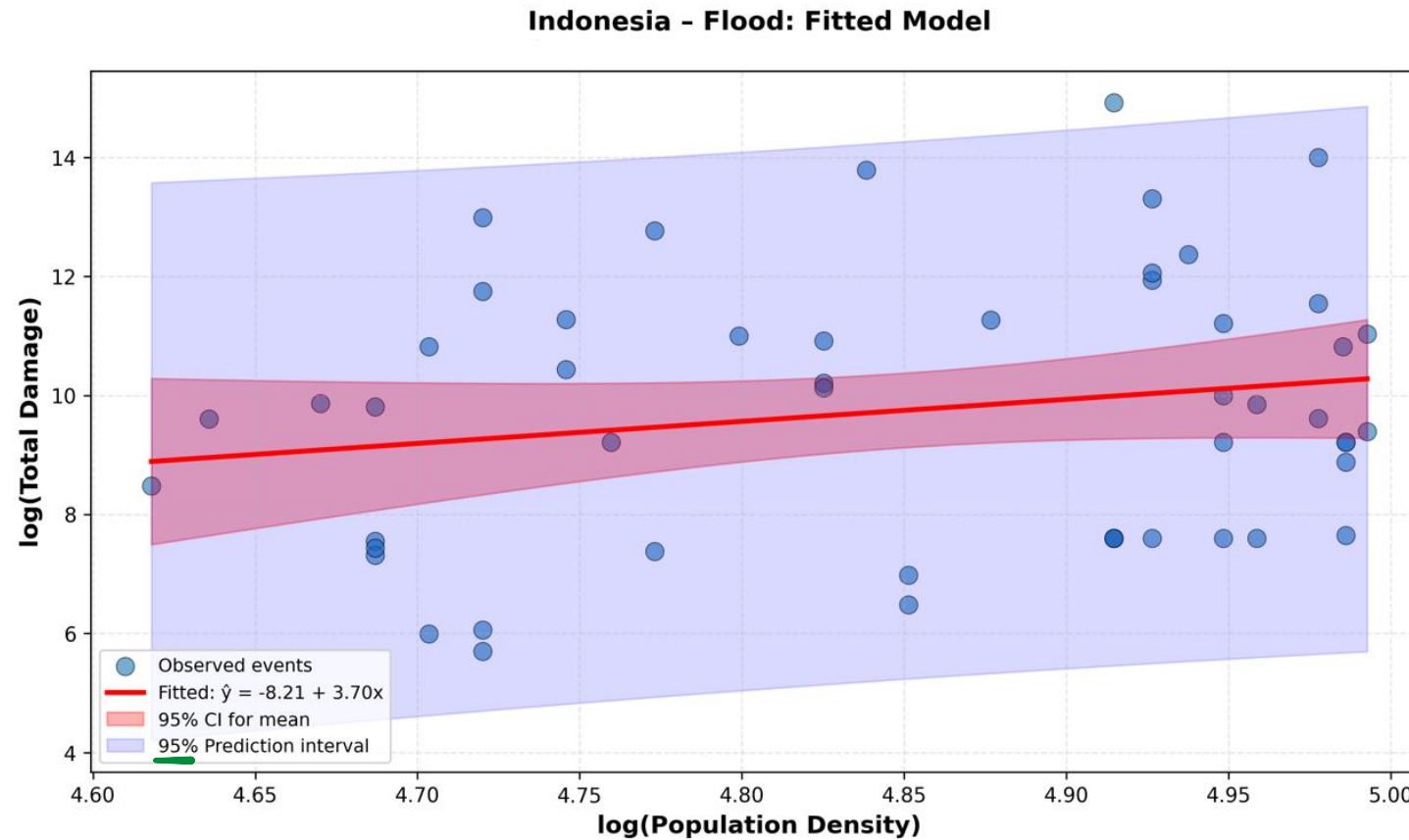
# Severity Modeling

$$\log(\textit{damage}) = \beta_0 + \beta_1 \log(\textit{population density}) + \varepsilon$$

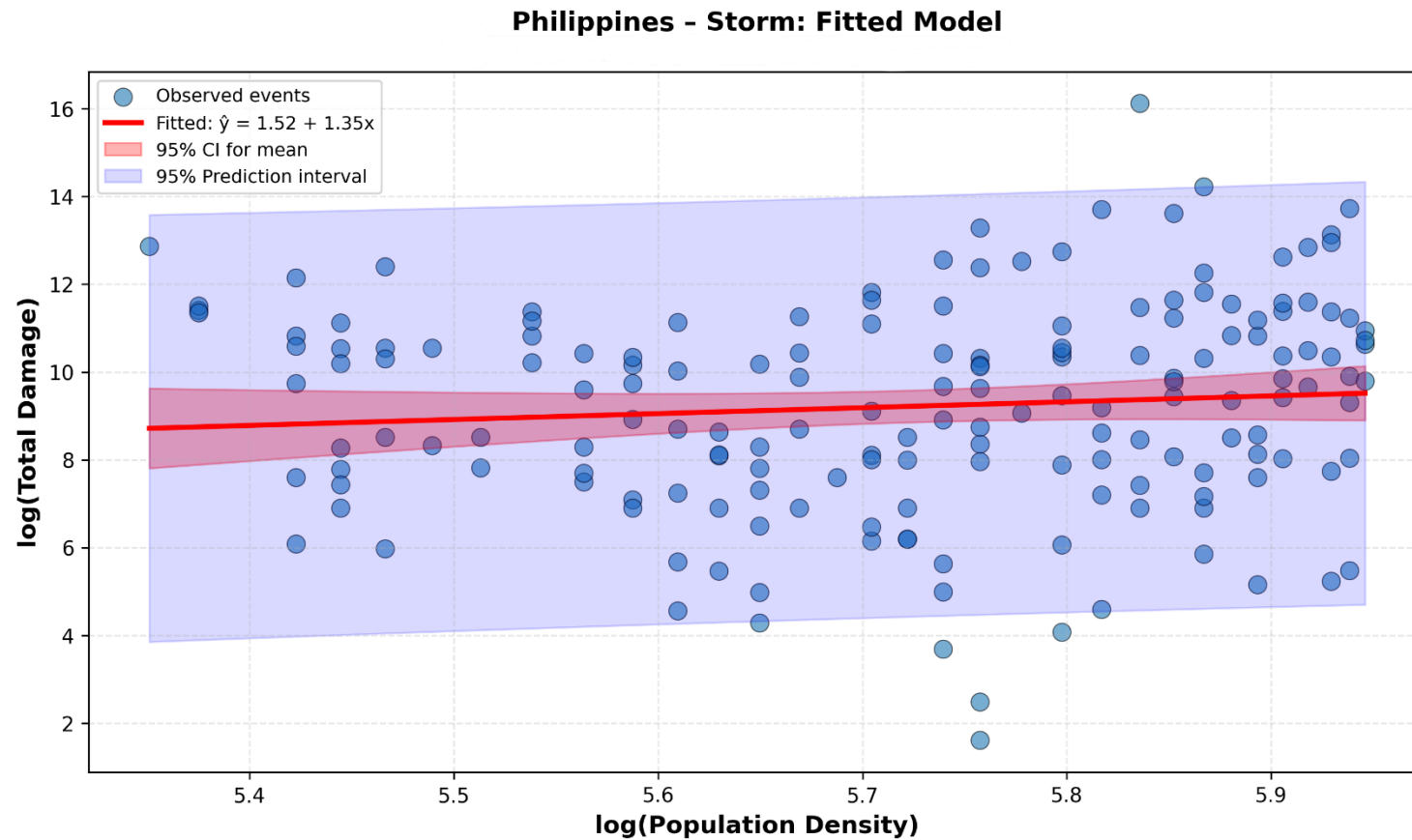
- Damage of each event
  - Country-specific
  - Measured in USD at 2025 price level
- Predicted by population density
  - Of the same country
  - In the year when the event occurred



# An Illustration of Severity Model Performance (Flood)

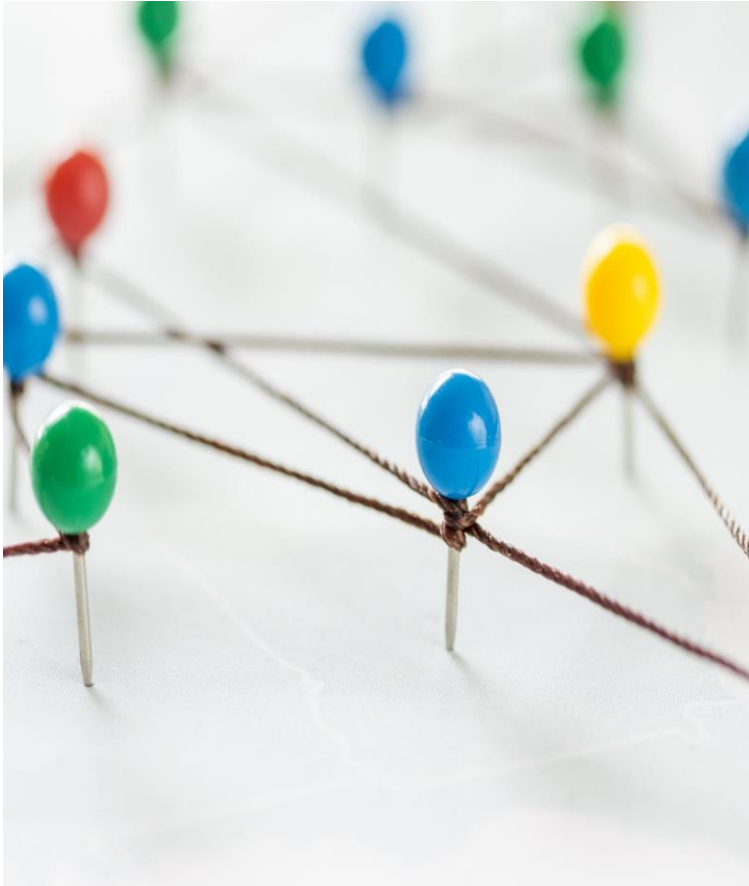


# An Illustration of Severity Model Performance (Storm)





# Cross-region Risk Sharing



- Potential and significance:
  - Diversification of catastrophe risk exposure
  - Enhanced financial resilience
  - Efficient capital utilization
  - Equitable and transparent participation
- A hypothetical coverage structure:
  - Notional amount:  $F$
  - Attachment point:  $b_1$
  - Exhaustion point:  $b_2$
  - Actual loss or parametric trigger:  $L$
  - Coverage function:

$$f(L) = F \times \frac{\max\{0, \min\{L - b_1, b_2 - b_1\}\}}{b_2 - b_1}$$

# Proposed premium principle

- Each country contributes a risk-based premium proportional to its expected coverage:

$$p = (1 + \theta) \times E[f(L)].$$

- The parameter  $\theta$  represents a safety loading to ensure the financial sustainability of the risk sharing fund pool.
- The risk-based contribution framework provides a built-in incentive for risk reduction, as countries with lower expected losses benefit from lower premiums.
- The premiums collected from individual countries/regions will be pooled into a shared fund.



# Management of the share fund

- The shared fund is established to cover losses over a given period (e.g., a quarter).
- If the fund is sufficient, any remaining balance after payouts will be refunded or rolled over to the next period.
- In the event of insufficient fund where multiple regions need radiation, then payouts are allocated proportionally to each country's realized risk exposure:

$$q_i = \frac{f(l_i)}{\sum_j^d f(l_j)},$$

where  $f(l_i)$  denotes country/region  $i$ 's realized loss within the period.

# Goal and approach of the application study

- Assess the model's potential to enhance regional financial resilience and reduce post-disaster funding gaps.
- Simulate quarterly loss realizations across countries with varying disaster frequencies.
- Evaluate fund sufficiency under different correlation and loading  $\theta$  scenarios.
- Compare outcomes with and without risk sharing to measure diversification benefits and capital efficiency.

# Ongoing Research



Continuous model development



Robust model validation



Applications to NAT CAT financing studies



Spreadsheets for prediction outcomes



# Significance for ASEAN Countries

- Vulnerable Region: ASEAN countries are disproportionately affected by natural catastrophes (Nat Cats) including floods, typhoons, earthquakes, and droughts.
- High Economic Exposure: Increasing losses from disasters highlight the urgent need for robust and scalable disaster financing solutions.
- Limited Risk Transfer Mechanisms: Many countries rely heavily on ad hoc government aid, leaving them vulnerable to tail risks and financial volatility.
- Promoting an openly accessible Nat Cat modeling framework for supporting Nat Cat risk management in ASEAN countries

# Key Contributions

## Application 1: Disaster Financing Innovation

- Evaluate the effectiveness of reinsurance vs. CAT bonds using predictive analytics.
- Guide optimal CAT bond designs tailored for ASEAN:
  - Multi-peril & multi-location
  - Indemnity-based & index-based
- Enable data-driven, risk-sensitive investment decisions to enhance financial resilience.

## Application 2: Cross-Country Risk Sharing

- Propose Country-to-Country (C2C) disaster risk pooling mechanisms to promote regional solidarity.
- Compare financial outcomes of local vs. shared risk approaches.
- Support integration of C2C pooling with existing instruments (reinsurance, CAT bonds) for hybrid resilience models.

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