



# Resilience in Supply Chain Transportation Networks

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US Army Corps  
of Engineers®

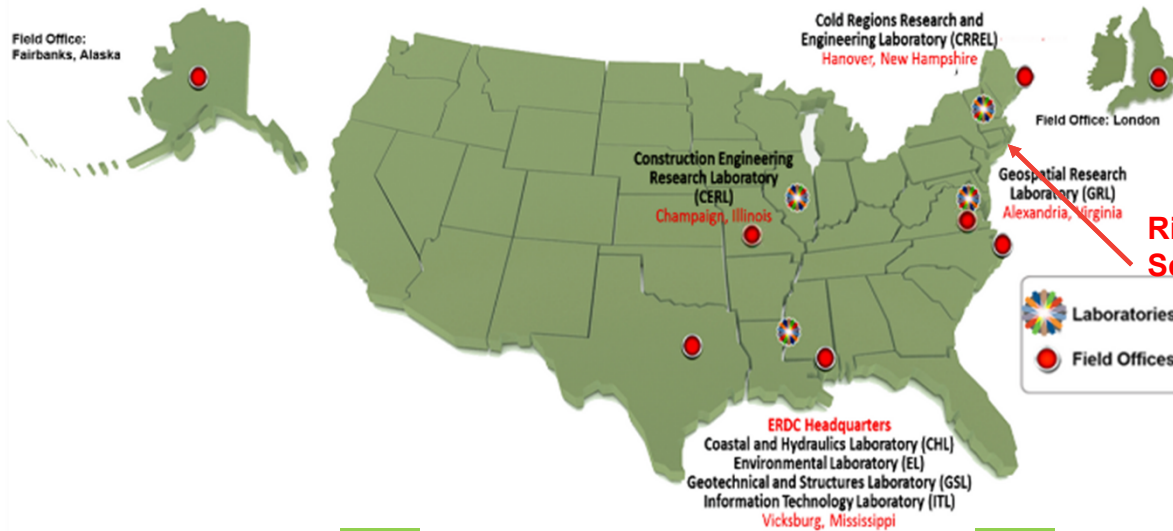
*This presentation does not necessarily reflect the views of the United States Government, and is only the view of the author*



**ERDC**  
ENGINEER RESEARCH & DEVELOPMENT CENTER

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# About Army Engineer R&D Center



**Risk and Decision  
Science Team  
Boston, MA**

## 7 Laboratories

- Coastal and Hydraulics Laboratory (CHL)
- Cold Regions Research and Engineering Laboratory (CRREL)
- Construction Engineering Research Laboratory (CERL)
- Environmental Laboratory (EL)
- Geospatial Research Laboratory (GRL)
- Geotechnical and Structures Laboratory (GSL)
- Information Technology Laboratory (ITL)

Annual Research Program Exceeding  
\$1.3 Billion

### People

2100 Strong  
61% E&S  
71% of E&S with  
Advanced Degrees  
29% of E&S with PhD

### Core Competencies

- Blast and Weapons Effects on Structures and Geo-Materials
- 3-D Mapping and Characterization
- Cold Regions Science and Engineering
- Civil and Military Engineering
- Computational Prototyping of Military Platforms
- Coastal, River, and Environmental Engineering
- Military Installations and Infrastructure

### Partners

All DoD Services  
Army, Navy, Air Force, NASA, DHS, FEMA, DIA, NGA  
Academia  
68 EPAs with top engineering schools  
Industry  
172 CRADAs  
International  
14 international agreements with 7 countries

**US Army Corps  
of Engineers.**



# Supply chain woes caused US auto sales to fall 8% last year

AP | TOM KRISHER  
January 5, 2023, 12:01 PM



## A Resilient Supply Chain Starts With Full Visibility



Dan Shey Forbes Councils Member  
Forbes Technology Council  
COUNCIL POST | Membership (Fee-Based)

Sep 30, 2022, 09:45am EDT

# Gartner Predicts 95% of Companies Will Have Failed to Enable E2E Resiliency in their Supply Chains by 2026.

02/01/2023 | 04:30am EST



## BUSINESS

GULF | MENA | WORLD | BUSINESS | OPINION | CLIMATE | HEALTH | LIFESTYLE | ARTS & CULTURE | TRAVEL | SPORT | PODCASTS | WEEKEND  
n | Economy | Energy | Money | Cryptocurrencies | Property | Banking | Technology | Markets | Travel and Tourism | Start-Ups | Future | Comment

## Rebuild supply chains with greater resilience and open trade, Davos panellists say

# How leveraging connected experiences in logistics can build resilient supply chains

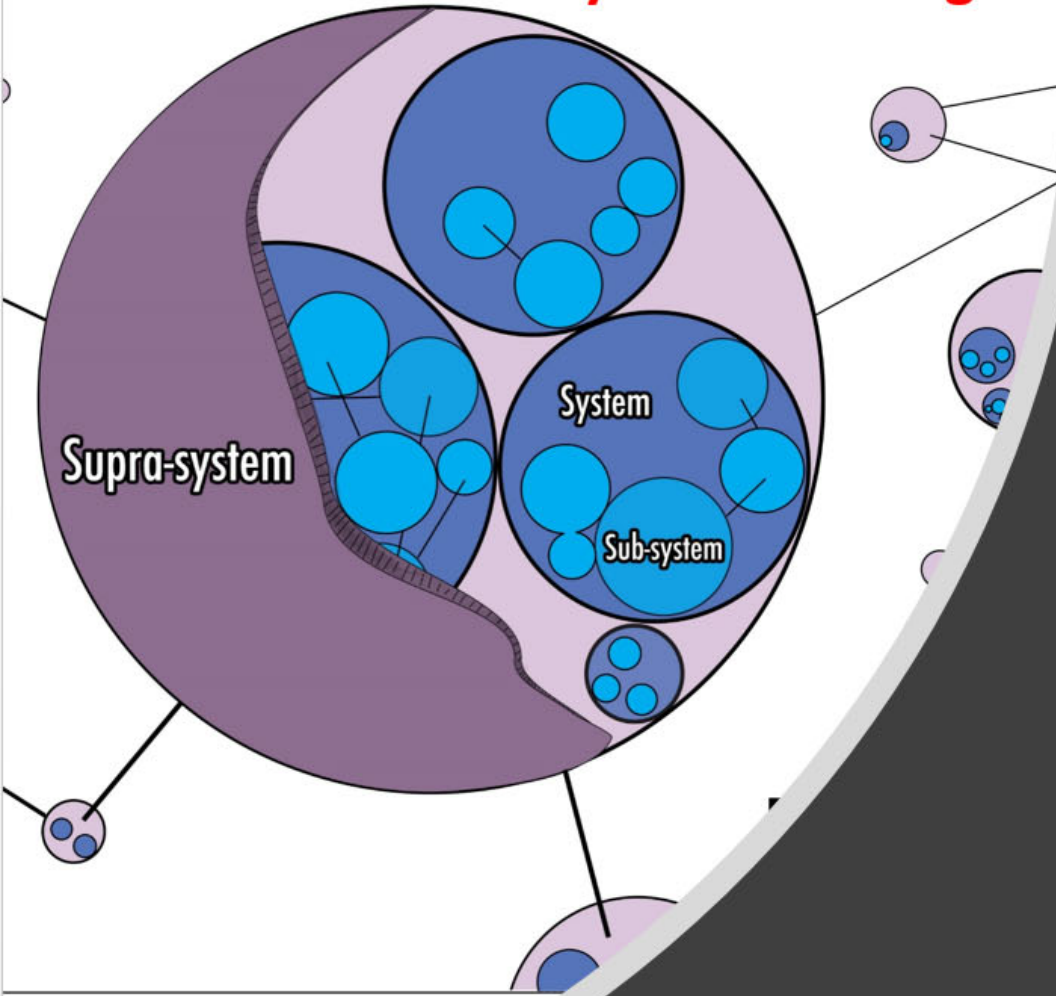
Advances in cloud data storage, artificial intelligence and cellular networks are all collectively driving a more connected experience in transport and logistics



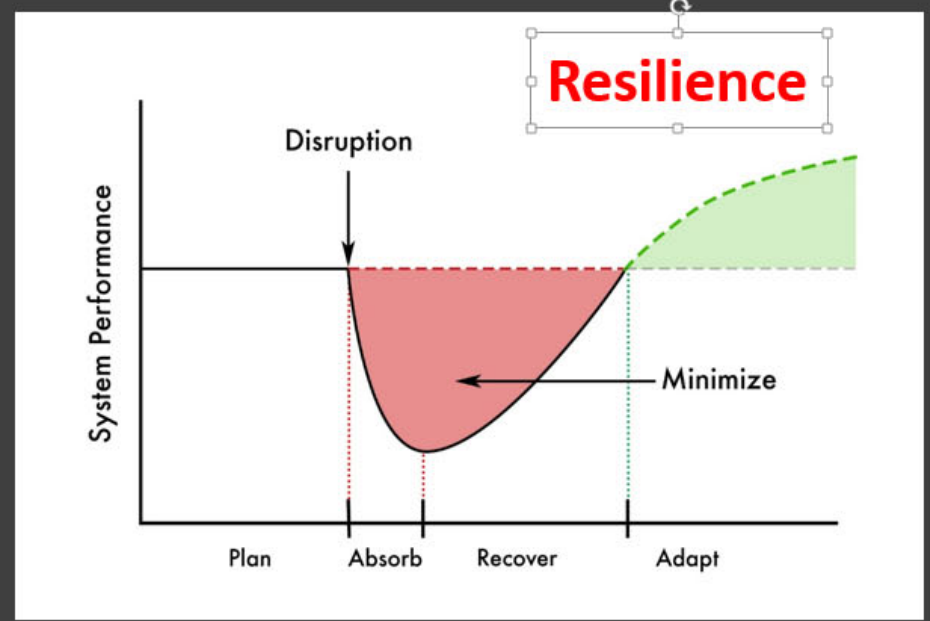
BY BURAK ERTUNA  
OCTOBER 1, 2022



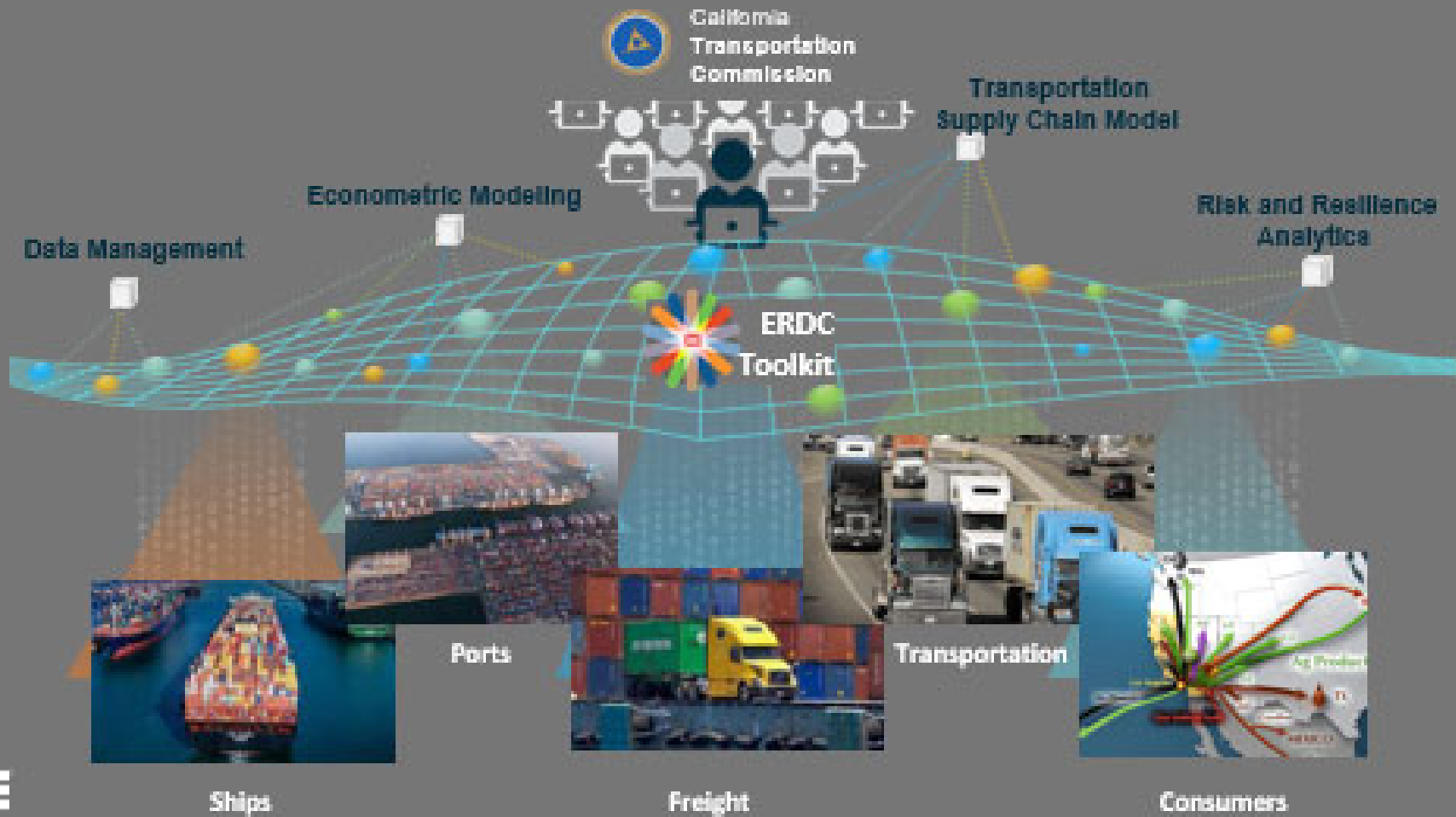
## System Thinking



What Makes Complex Systems (Communities) Susceptible to Threat?



After Linkov and Trump, 2019



**Risk** -- “a situation involving exposure to danger [threat].”

**Security** -- “the state of being free from danger or threat.”

**Resilience** -- “the capacity to recover quickly from difficulties.”

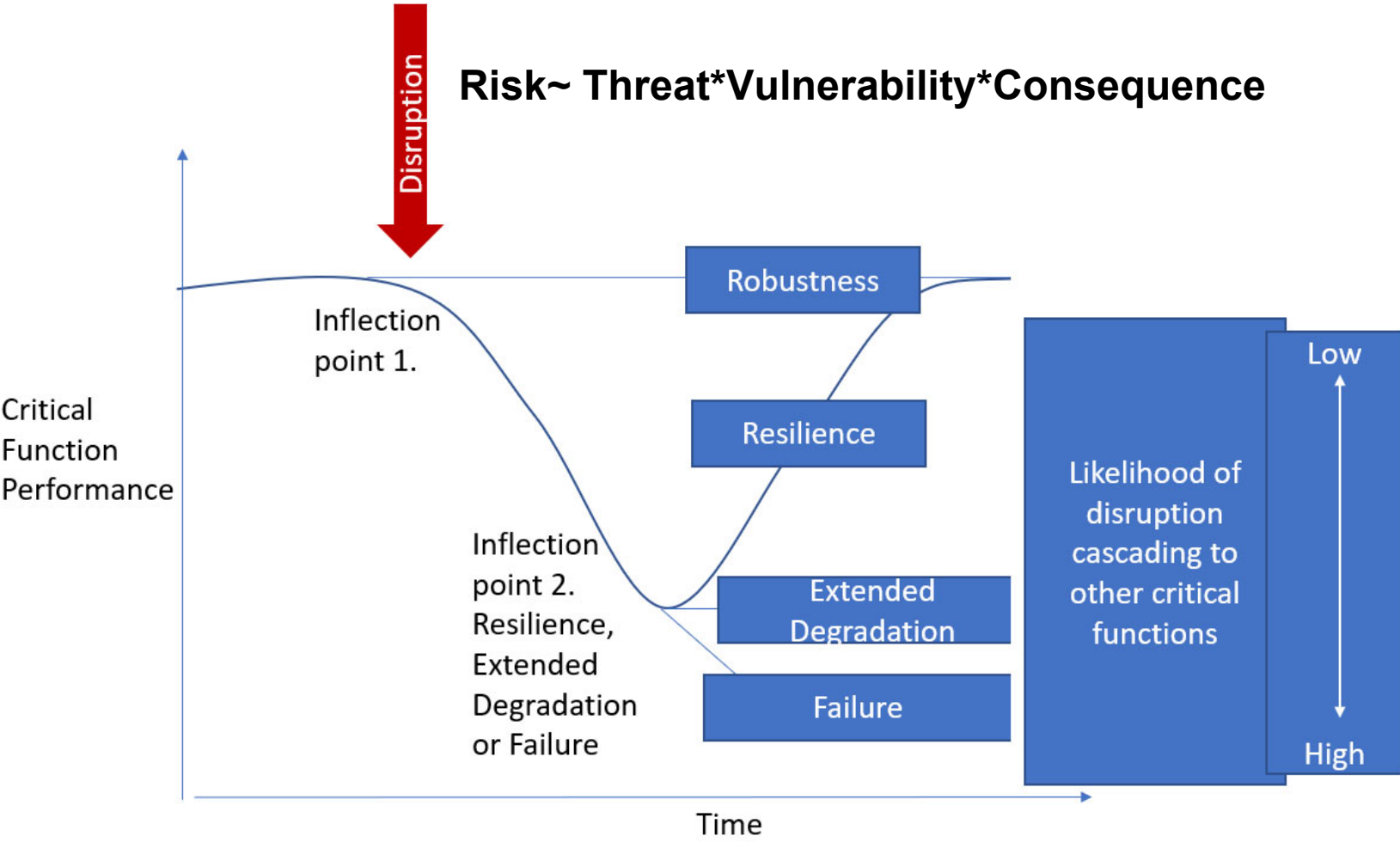
**Don't conflate risk and resilience**

'Risk' and 'resilience' are fundamentally different concepts that are often conflated. Yet maintaining the distinction is a policy necessity. Applying a risk-based approach to a problem that requires a resilience-based solution, or vice versa, can lead to investment in systems that do not produce the changes that

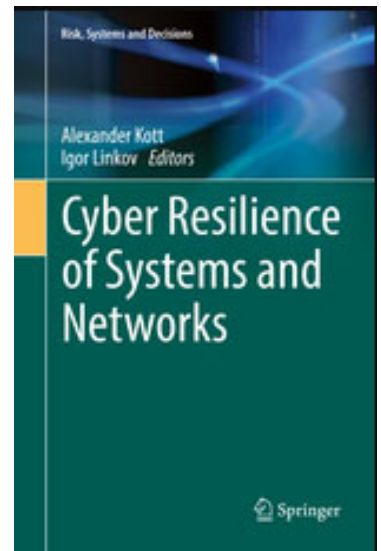
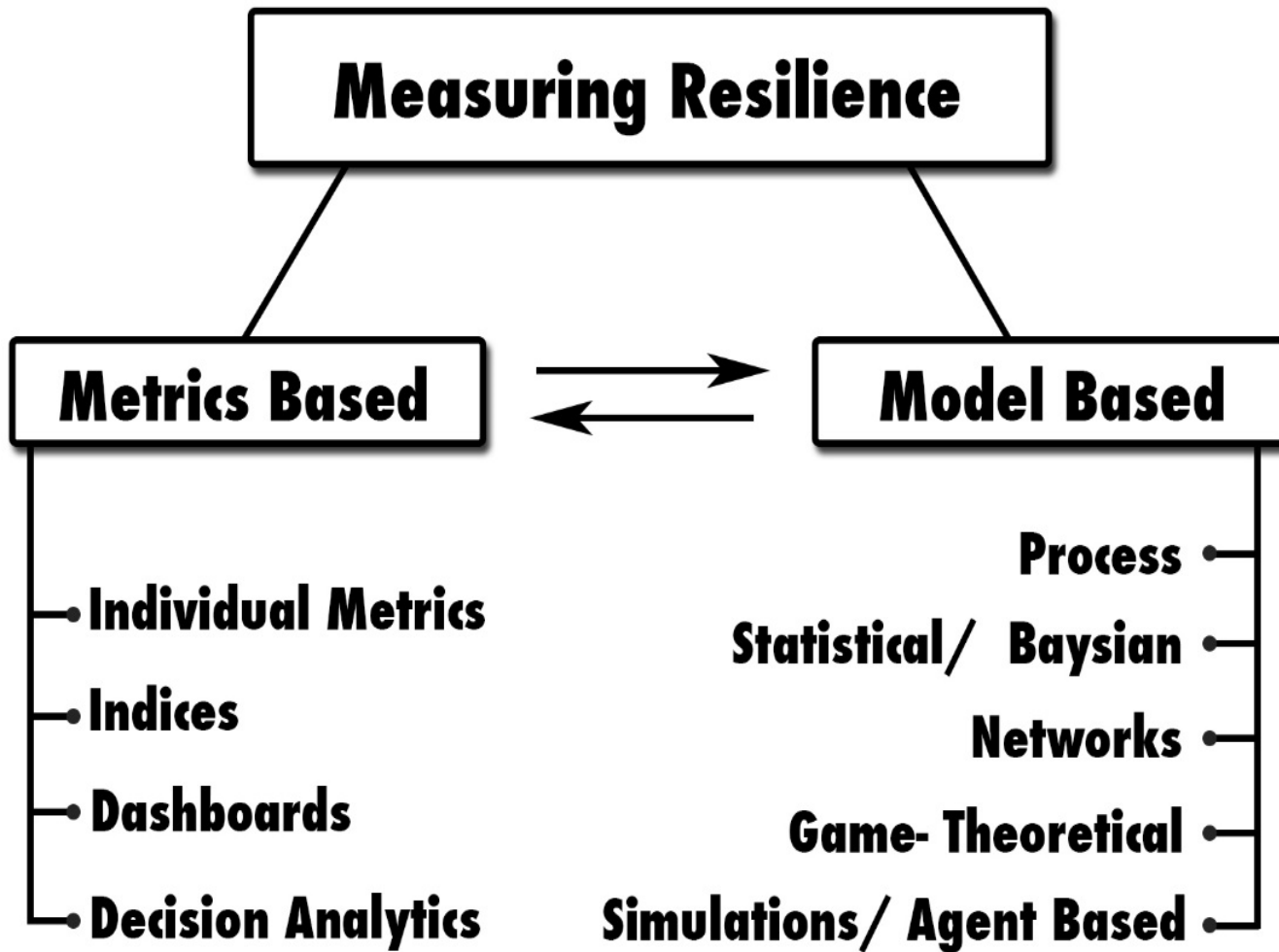
Igor Linkov, Benjamin D. Trump  
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Jeffrey Keisler *University of  
Massachusetts Boston, USA.*  
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**Definitions by Oxford Dictionary**

# Crisis Management, Risk and Resilience



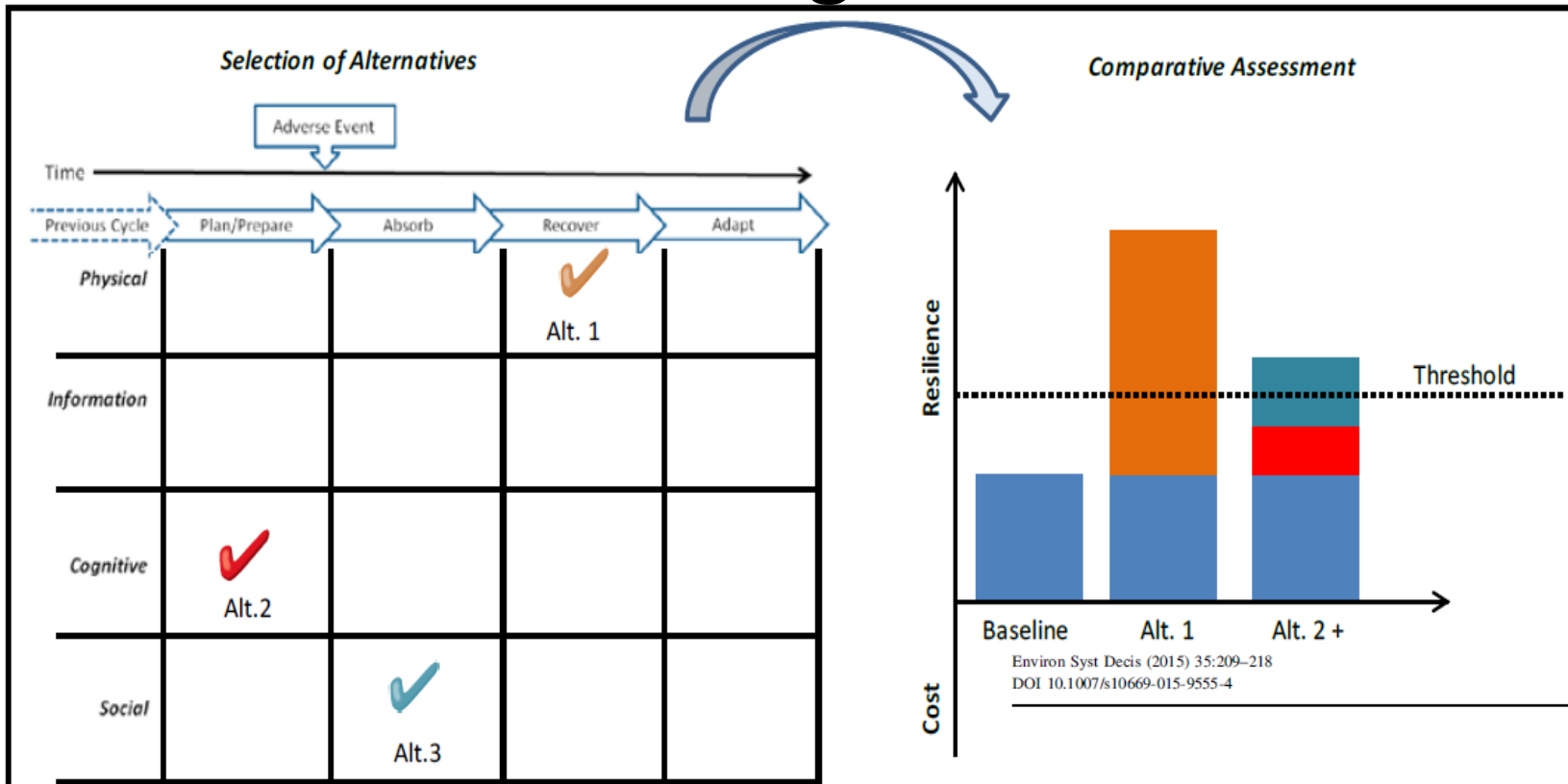
After Galaitsi, Linkov et al, 2022



After 2019



# Assessment using Resilience Matrix



**Use resilience metrics to comparatively assess the costs and benefits of different courses of action**

**A matrix approach to community resilience assessment: an illustrative case at Rockaway Peninsula**

Cate Fox-Lent<sup>1</sup> · Matthew E. Bates<sup>1</sup> · Igor Linkov<sup>1</sup>

# Network-based Resilience Theory?

System's *critical functionality* ( $K$ )

Network topology: *nodes* ( $\mathcal{N}$ ) and *links* ( $\mathcal{L}$ )

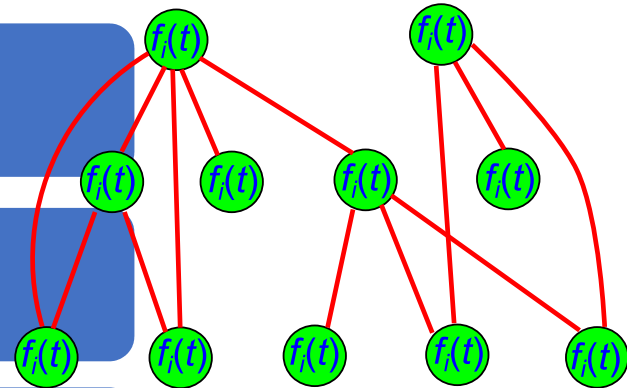
John K. Baker, P.E.

1st degree connection

Director of Operations (G-3/5/7) at U.S. Army Installation Management Command

Network *adaptive algorithms* ( $\mathcal{C}$ ) defining how nodes' (links') properties and parameters change with time

A set of possible damages stakeholders want the network to be resilient against ( $E$ )



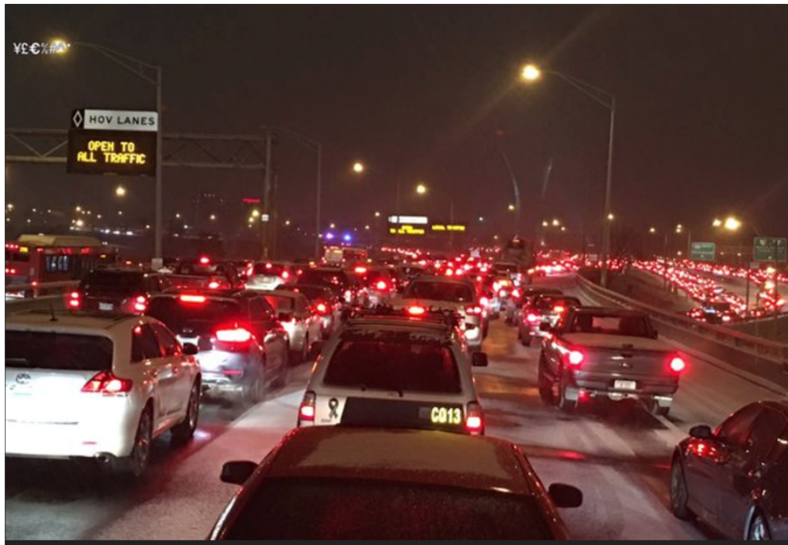
After Ganin et al., 2016

$$R = f(\mathcal{N}, \mathcal{L}, \mathcal{C}, E)$$

## Poor Efficiency:

System cannot not accommodate a large volume of commuters driving at the same time.

Traffic congestions are predictable and are typically of moderate level.



## Lack of Resilience:

System cannot recover from adverse events  
(car accidents, natural disasters)

Traffic disruptions are not predictable and of variable scale.

Science

Decision  
Analysis

Business  
Case

# Transportation Network Model + Regional Economic Models, Inc.



Contents lists available at [ScienceDirect](#)

Transportation Research Part D

journal homepage: [www.elsevier.com/locate/trd](http://www.elsevier.com/locate/trd)



Lack of resilience in transportation networks: Economic implications



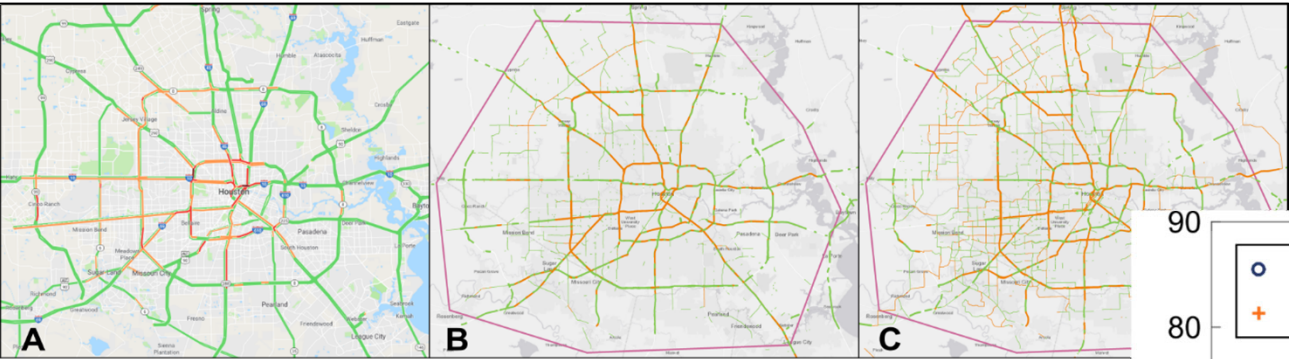
SCIENCE ADVANCES | RESEARCH ARTICLE

NETWORK SCIENCE

## Resilience and efficiency in transportation networks

Alexander A. Ganin,<sup>1,2</sup> Maksim Kitsak,<sup>3</sup> Dayton Marchese,<sup>2</sup> Jeffrey M. Keisler,<sup>4</sup>  
Thomas Seager,<sup>5</sup> Igor Linkov<sup>2\*</sup>

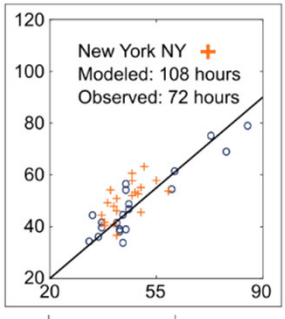
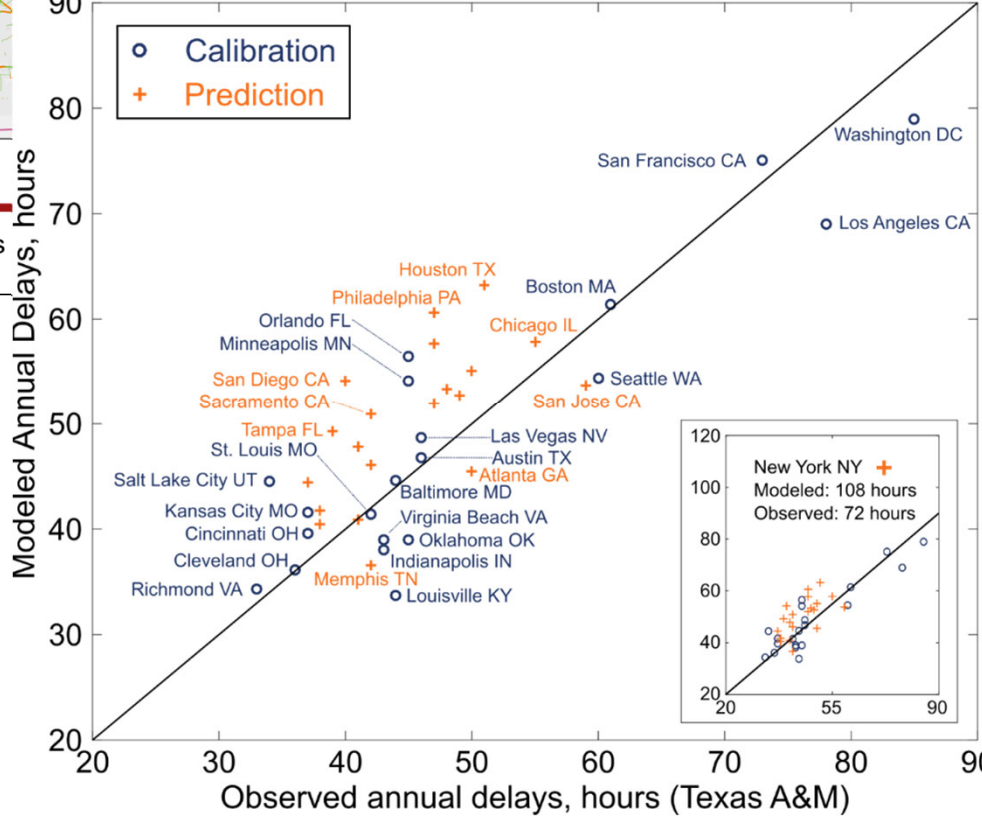
# Transportation Network Model



**A** Google Map typical traffic at 8am  
**B, C** Modeled delay per km (min): — < 1.2 — 1.2 - 12 — 12 - 24 — > 24  
 Highways  Other roads  
 Approximating urban area boundary polygon

- 1) Build networks comprise of road links and intersection nodes
- 2) Assign travelers and routes
- 3) Calculate free flow travel times and actual travel times
- 4) Calculate normal delay
- 5) Calibrate model to data

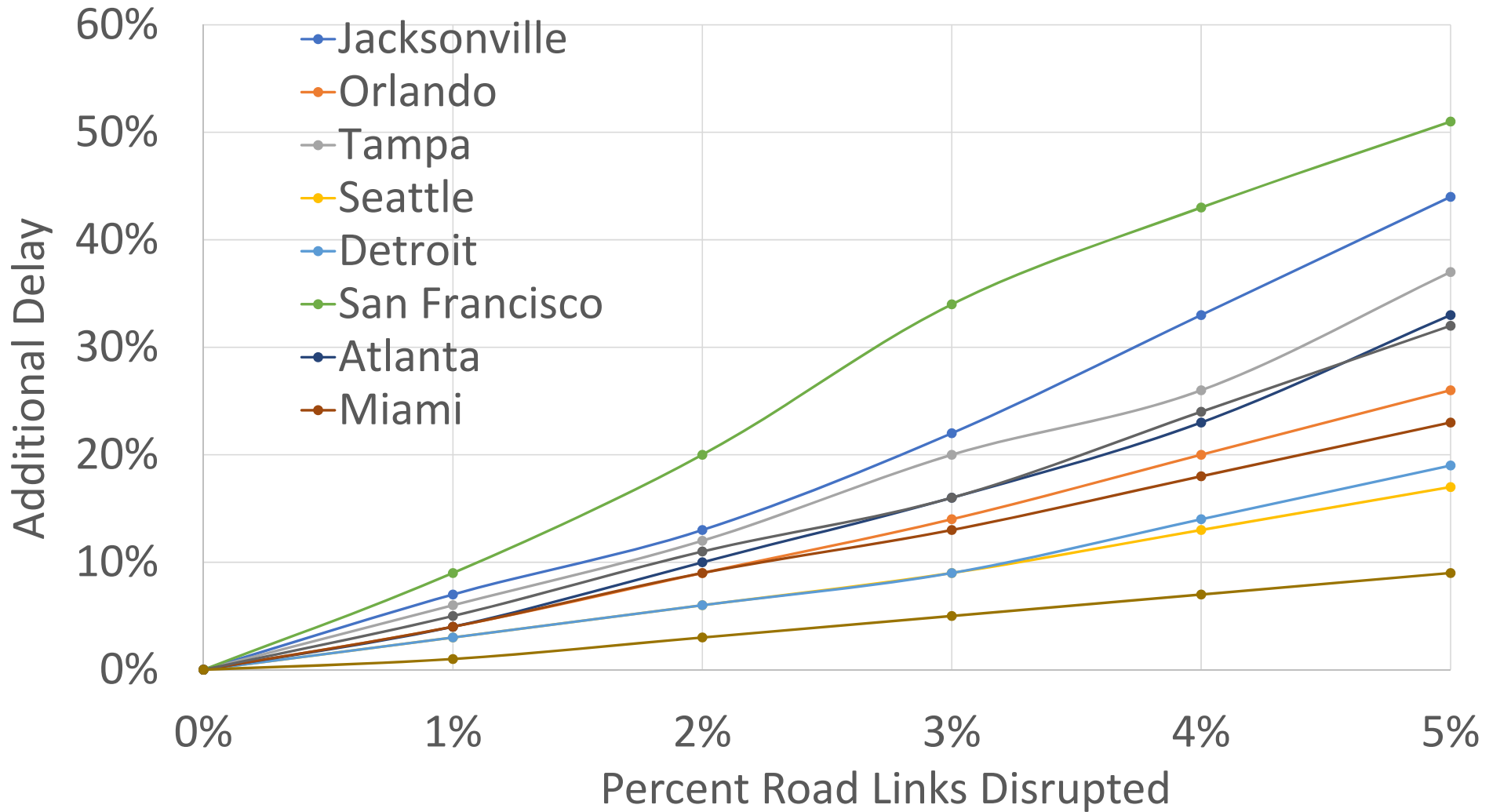
$$\langle \Delta T \rangle = \frac{1}{N_c} \sum_{\{ij\} \in \text{all roads}} L_{ij} l_{ij} \left( \frac{1}{v_{ij}} - \frac{1}{v_{ij}^0} \right)$$



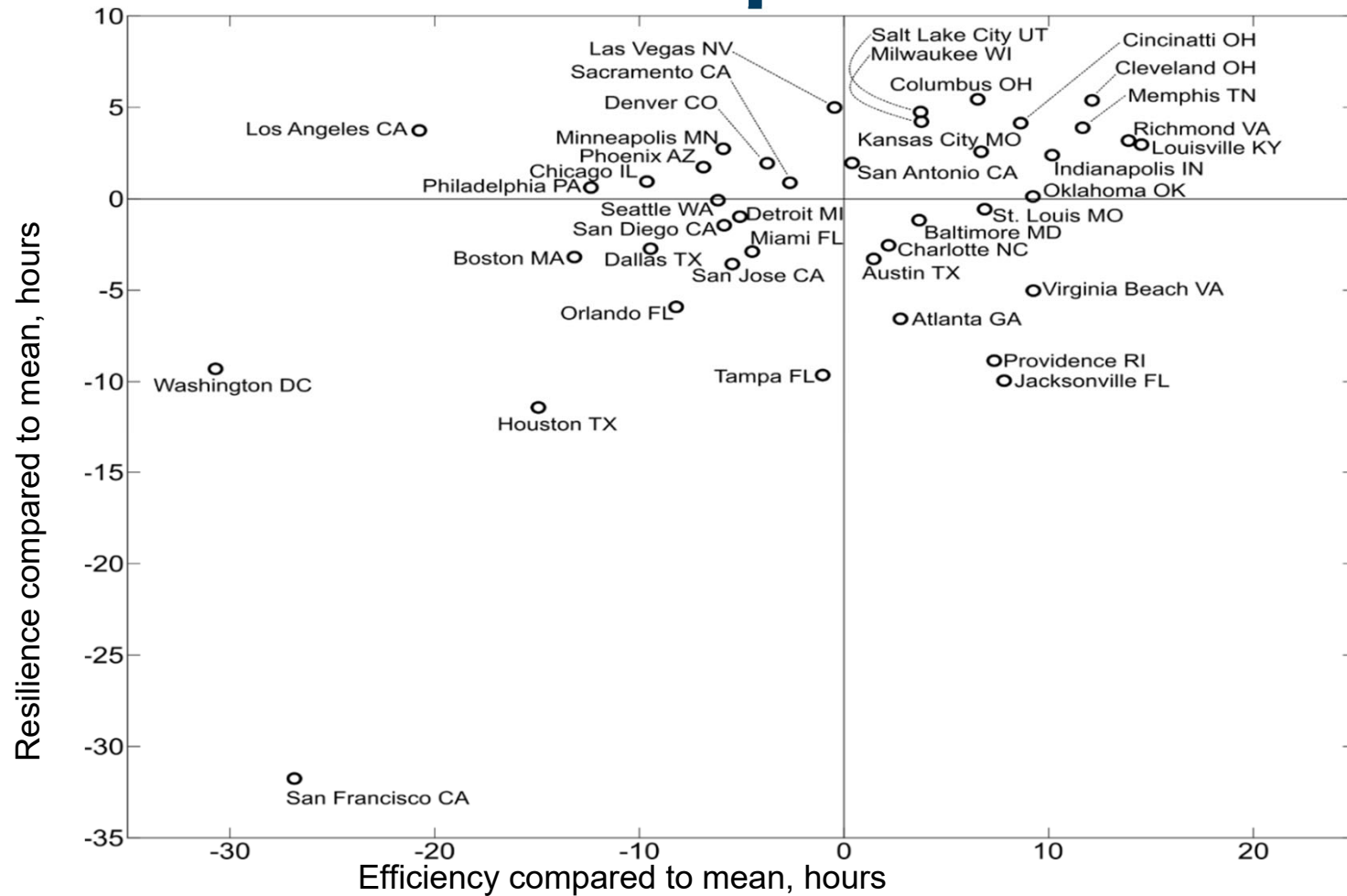
# Modeling Disruptions

Case I Natural Disasters	Case II Random Disruptions	Case III Attacks Disabling Traffic Control	Case IV Attacks Locking Traffic Control
Links (Roadways) Only	Links (Roadways) and Nodes (Intersections)	Nodes (Intersections) Only	
<b>Modeled Fractions of Affected Nodes/Links</b>			
From 5% to 100% with the step of 5%			
<b>Selection of Nodes/Links Affected by a Disruption</b>			
Proportionally to Length at Random	Uniformly at Random Deterministically by Length, Load, and Betweenness		
<b>Disrupted Roads and/or Intersections</b>			
Speeds reduced to 1 km/h		Speeds reduced by 50%	Half of speeds are reduced 80%, the other half is increased 20%

# Impact of Transportation Network Disruptions on Travel Time

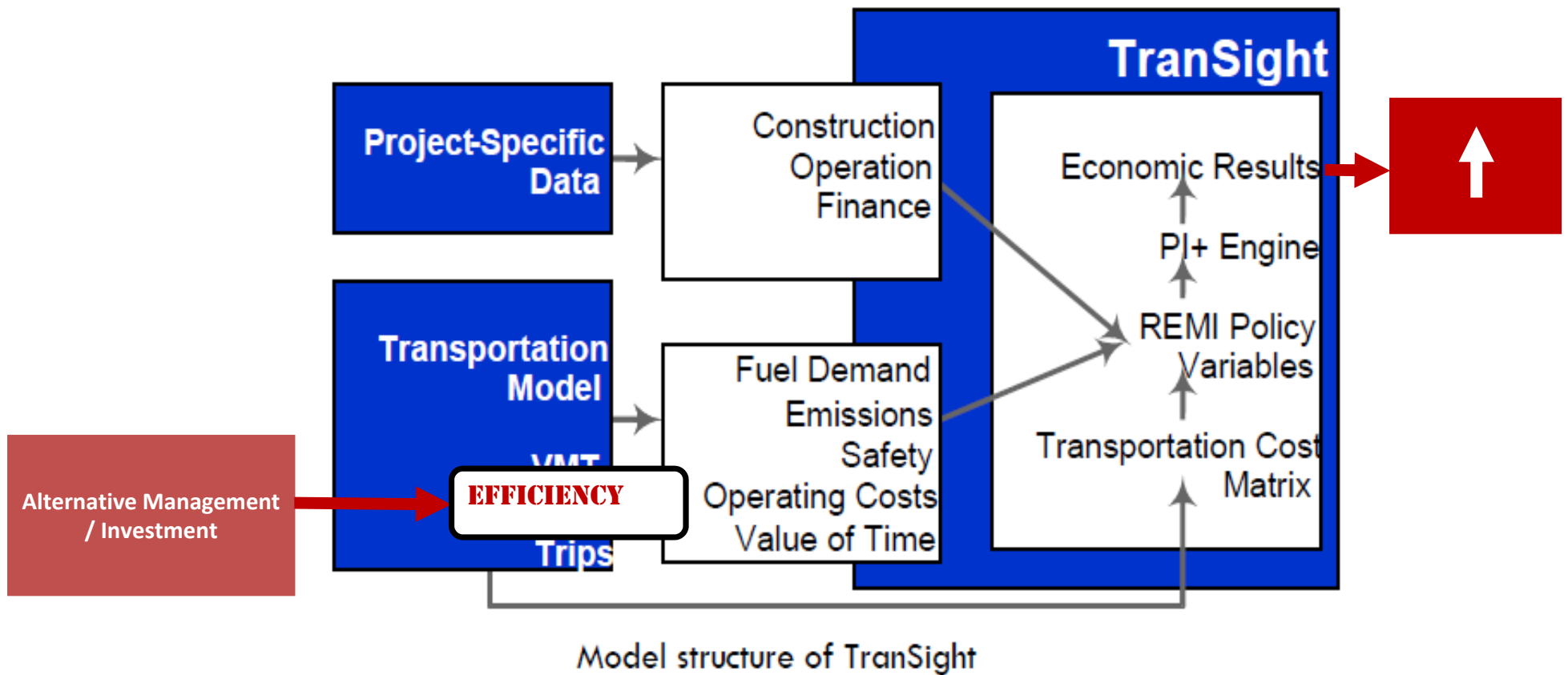


# Resilience vs Efficiency at 5% disruption

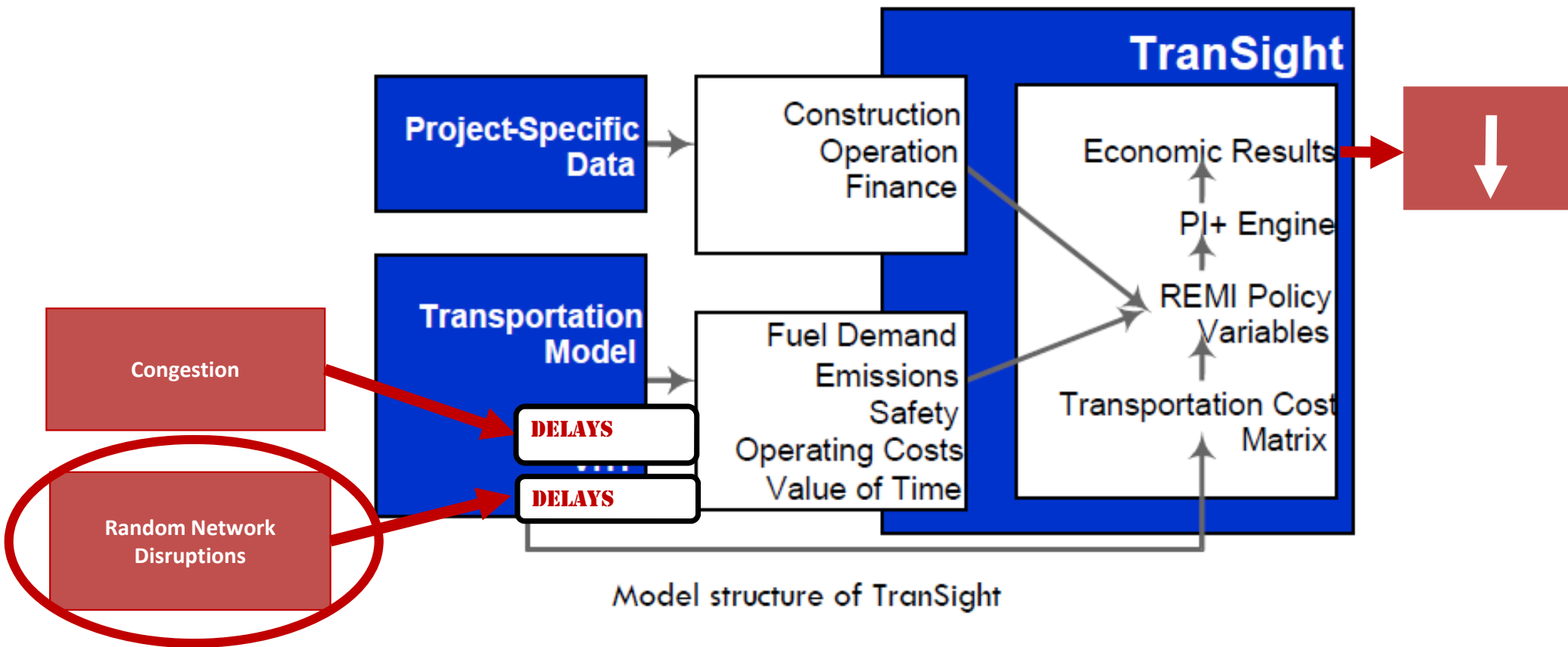




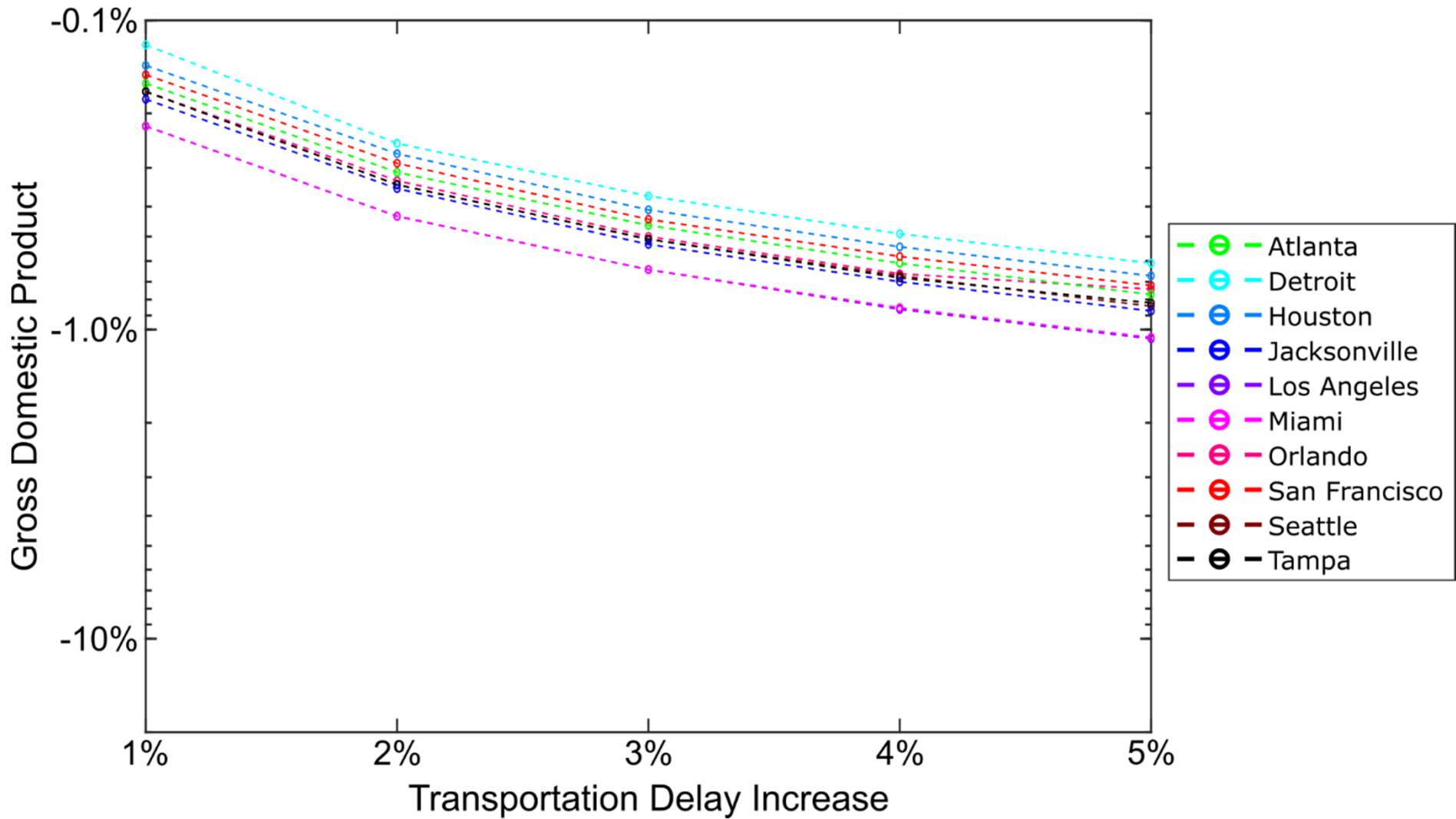
# Integrating REMI Model



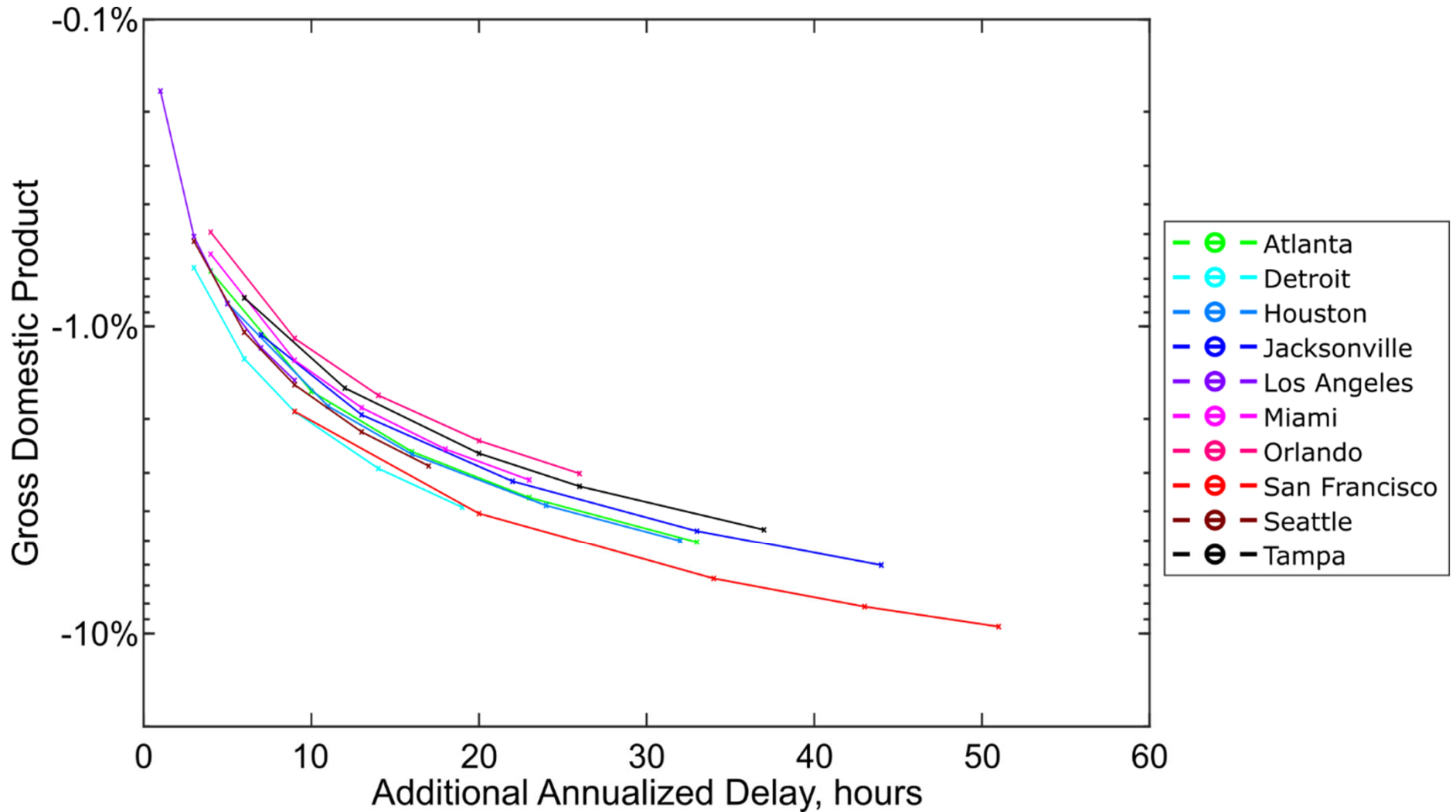
# Repurpose to Study Economic Implications of Resilience (or lack thereof)



# Impact of Efficiency-Related Delays

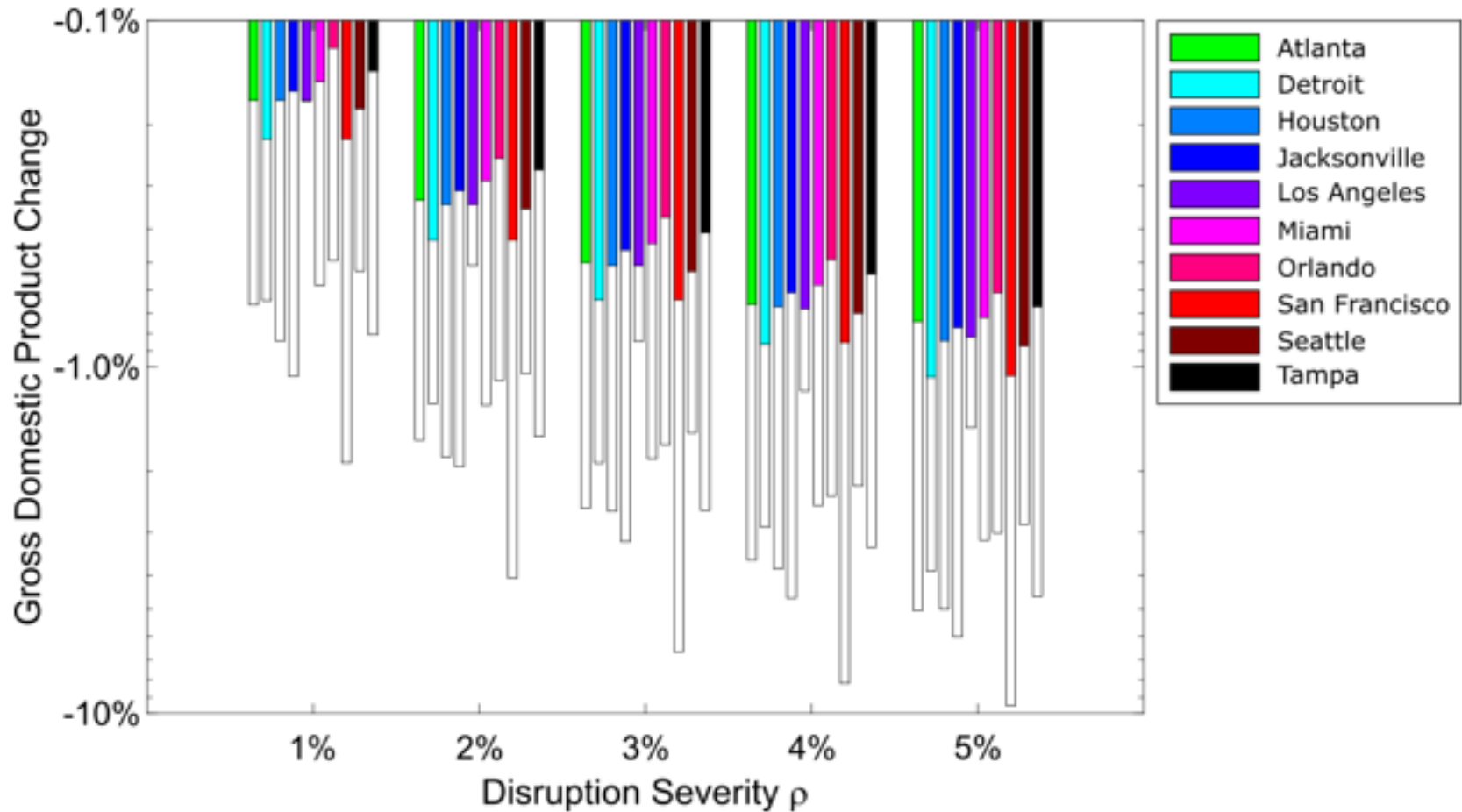


# Impact of Resilience-Related Delays



# Lack of Resilience: Impact on GDP

*Random Disruptions are Much More Consequential*





# Economic Impact – Travel Sector in Georgia



## Results

### Shock to Commodity Access and Output for the Travel Sector

- 1% decrease in Commodity Access
- 1% decrease in Output for:
  - Air Transportation
  - Amusement, gambling, and recreation
  - Accommodation
  - Food services and drinking places

Commodity Access and Output  
-1%

Commodity Access increase from resilience measures  
+0.1%

### Immediate Effect (2025) (Change from Baseline)

In the short run, the decreased Commodity Access and Output causes the following:

Change in GDP  
-\$652 Million

Change in Employment  
-6,892 Jobs

Change in Compensation by Quintile  
-0.01% to -0.56%

Increase in Unemployment Rate  
0.095% to 0.100%

### Long Term Effect (2060) (Change from Baseline)

In the long run, socio-economic indicators reach their new market equilibrium and are measured in 2060

Change in GDP  
+526 Million

Change in Employment  
+2,868 Jobs

Change in Compensation by Industry Quintile  
+0.022% to 0.061%

Participation Rates by Race  
+0.002% to 0.024%

what does REMI say?<sup>sm</sup>

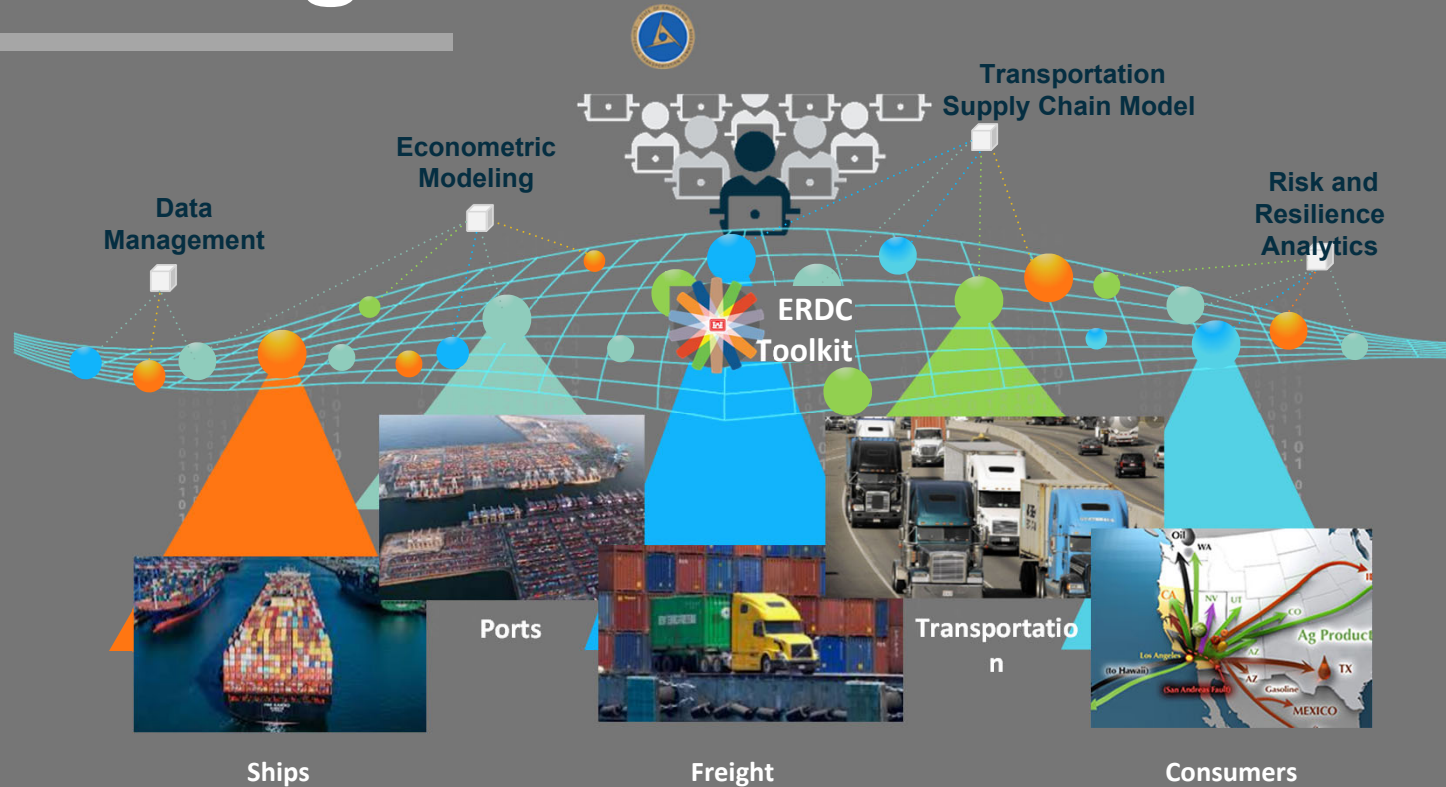
# Freight Modeling in CA

## 1. Data Connections

- Identify Interconnections

## 2. Data Confidence

- Derive known commodity flows from data

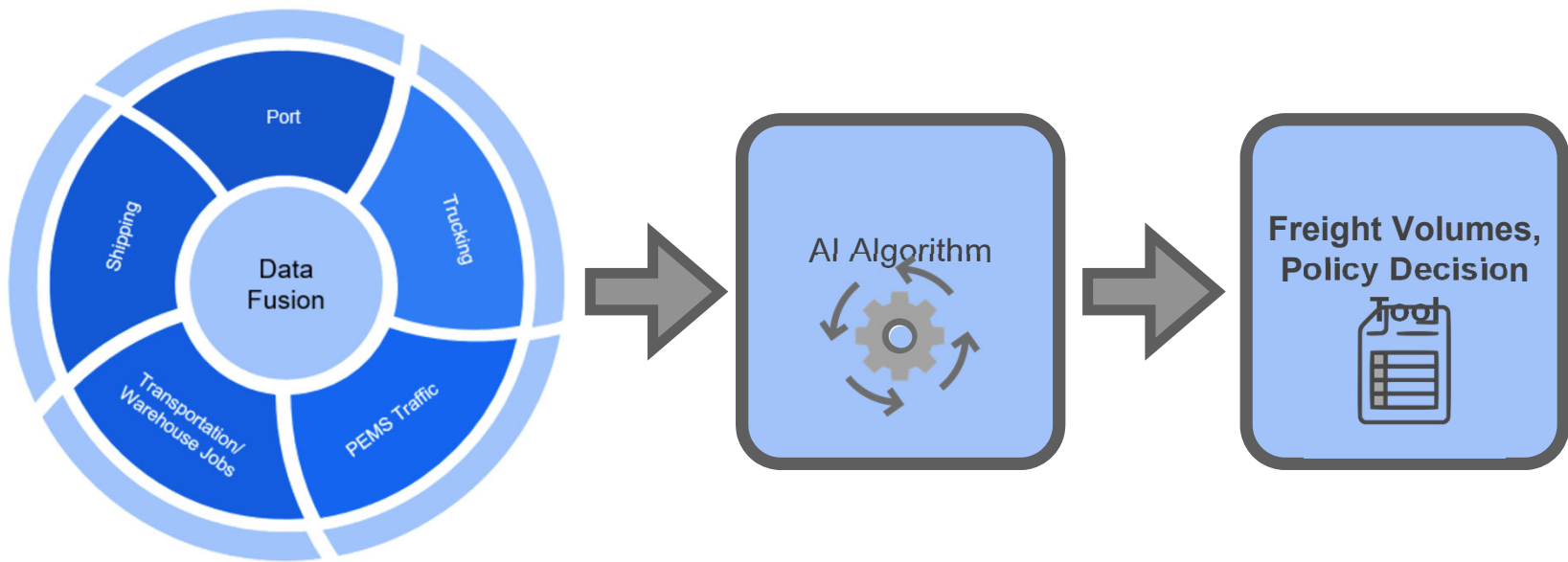


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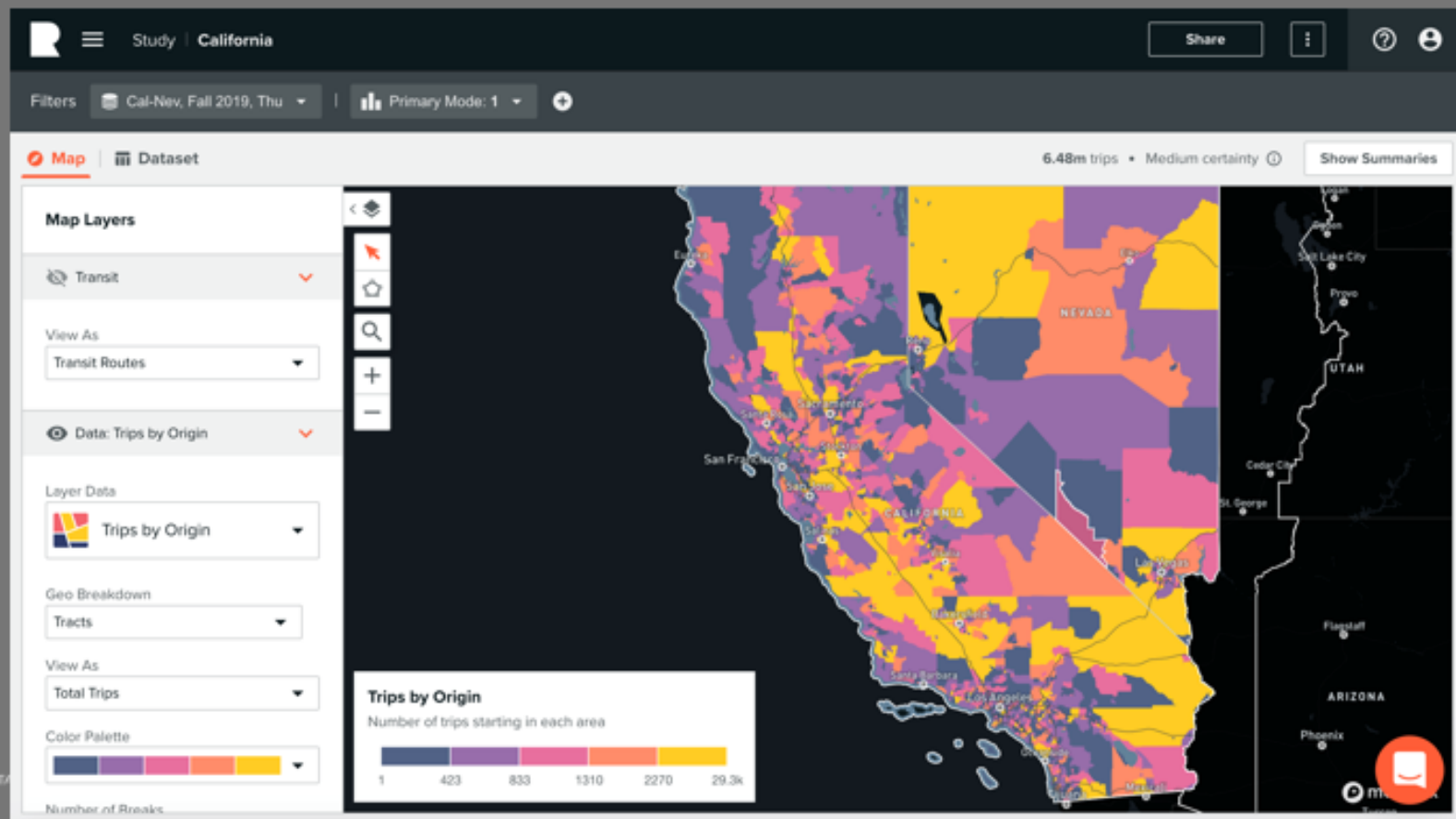


# Data Fusion and Optimization Using AI and Resilience Modeling

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# Replica Data: Connecting Entry Points, Warehousing and Consumers



# Presentation Overview

- Tools:
  - Freight Volumes
  - Scenario Comparison Tool
- Problems we are addressing:
  - I. Supply Chain Resilience Quantification
  - II. Natural Disaster Risk and Resilience
  - III. Zero-Emission Refueling Station Prioritization
  - IV. Multi-Objective Equity Optimization

## Supply Chain Resilience



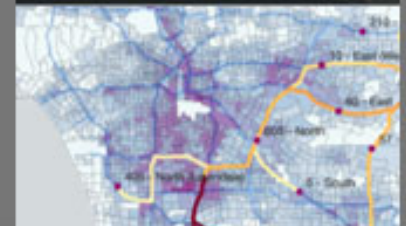
## Natural Disaster Risk and Resilience



## Zero Emission Refueling Station

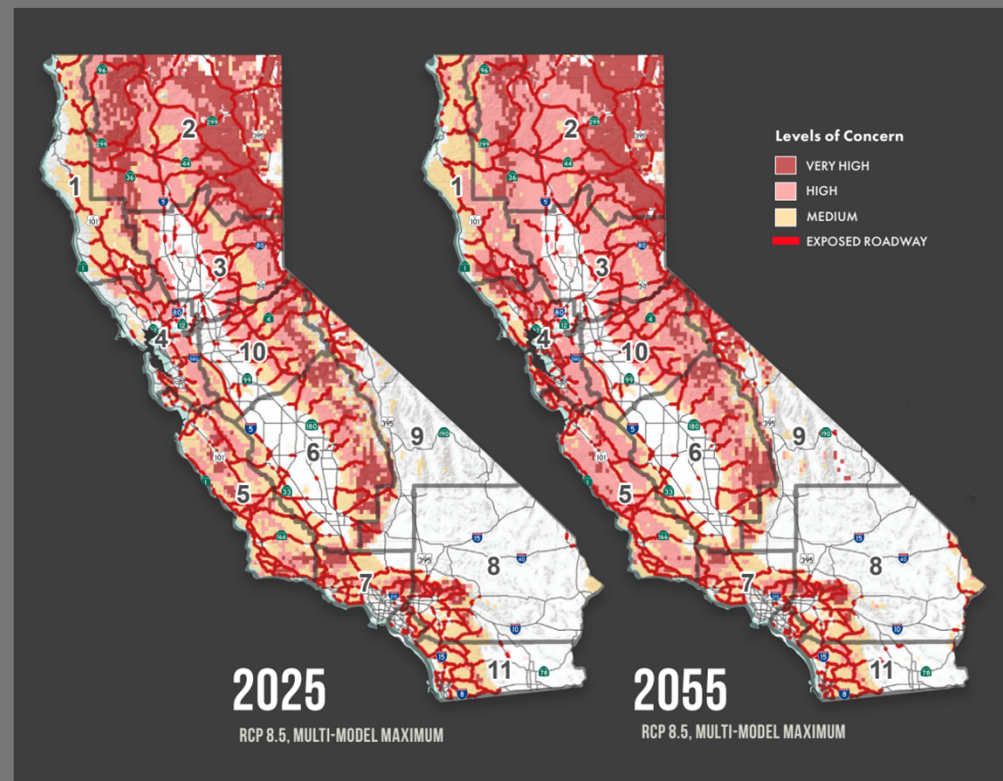


## Multi-Objective Equity Optimization



# Multi-Treat Natural Disaster Resilience Quantification

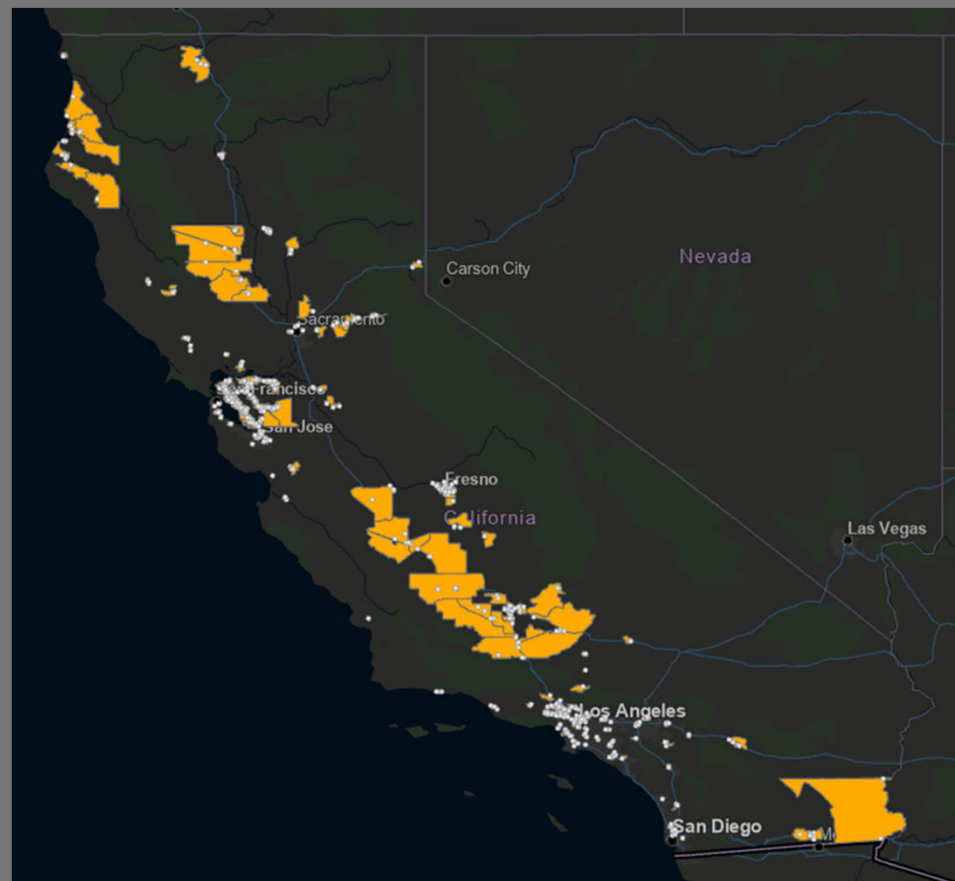
- Climate events will be simulated based on existing road vulnerability assessments:
  - Precipitation
  - Wildfire
  - Sea level rise
  - Storm Surge
  - Cliff Retreat
  - Earthquakes



Changing Level of Wildfire Concern |  
Caltrans Climate Change Vulnerability Assessment

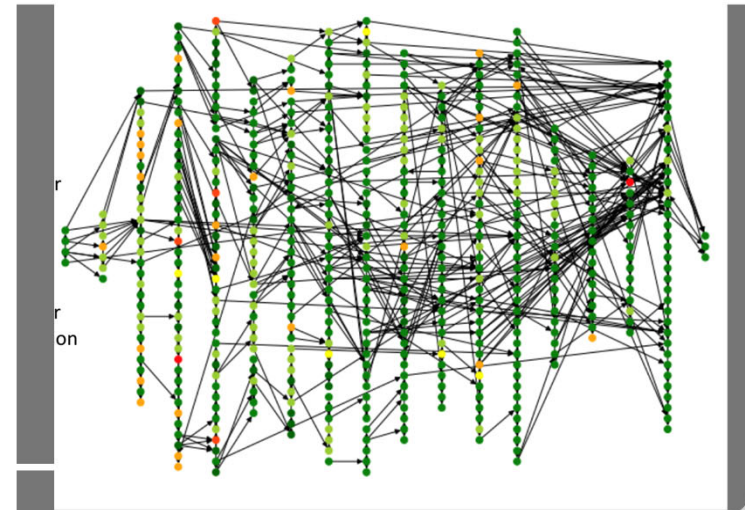
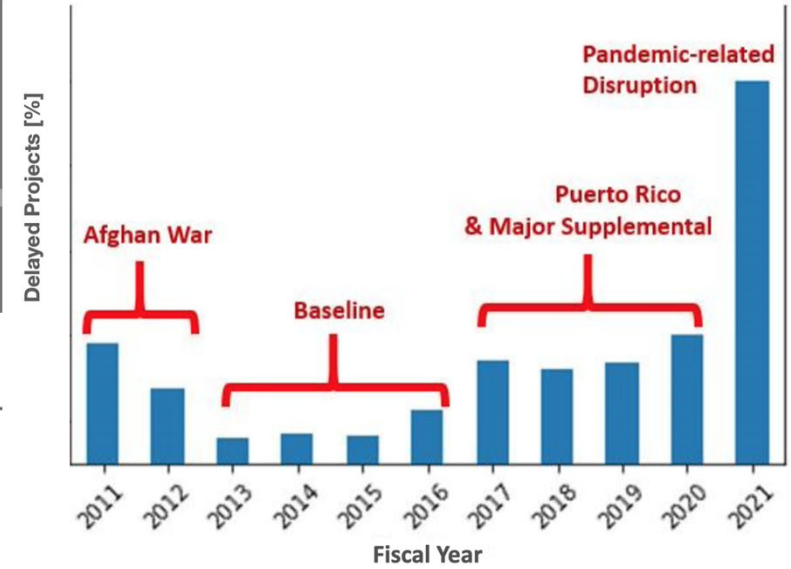
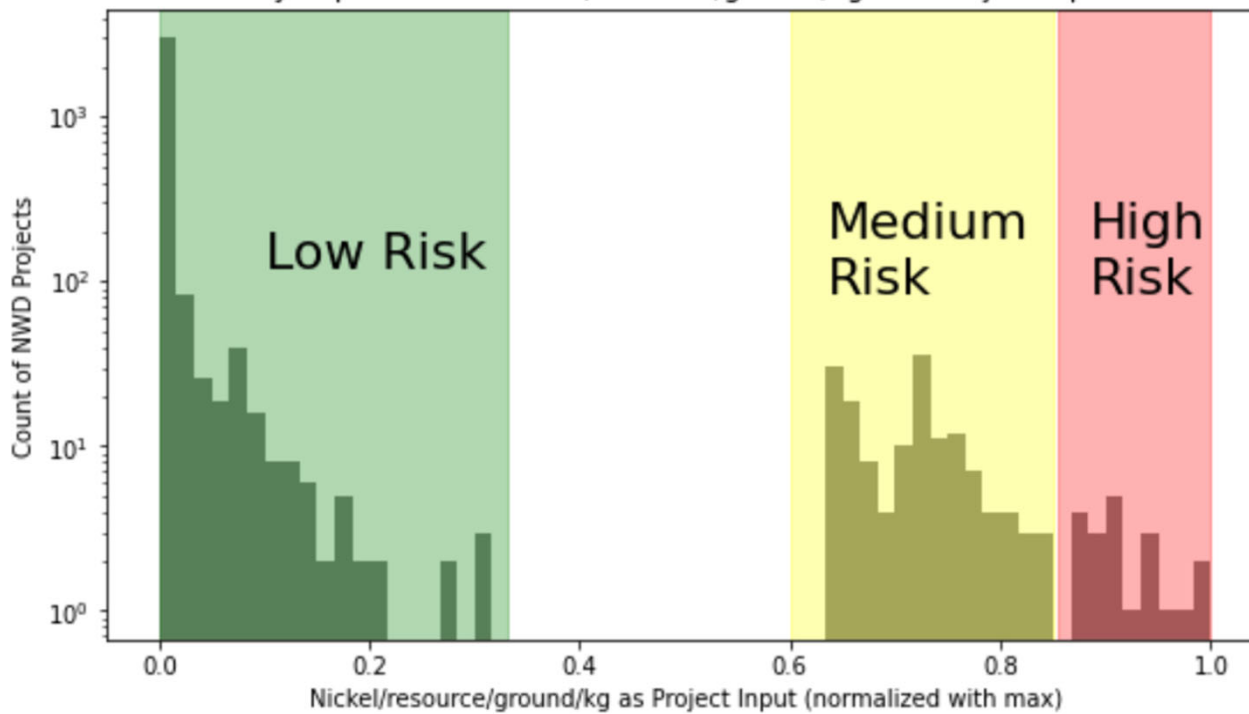
# Hydrogen Refueling Stations: Candidate Locations

- **Identified:**  
500 Candidate Census tracts which, together minimize freight diversion
- **Details:**
  - 500 tracts were identified based on CTC input
  - Gas and Service stations within census blocks were also identified

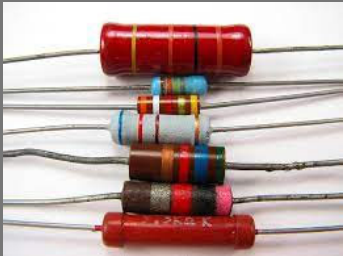


# USACE Project Reliance on Foreign-Sourced Minerals

Classification of USACE NWD Projects (2000-2020) by Importance of Nickel/resource/ground/kg as a Project Input



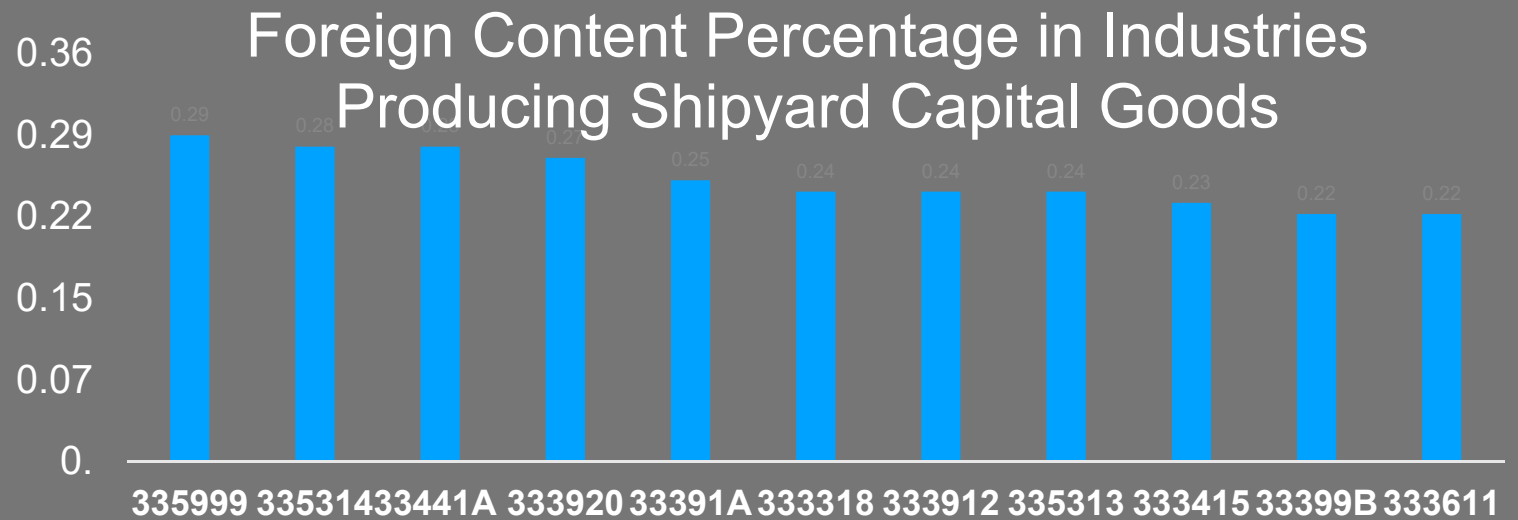
# Estimates of Foreign-Sourced Content in Capital Goods



Item Level



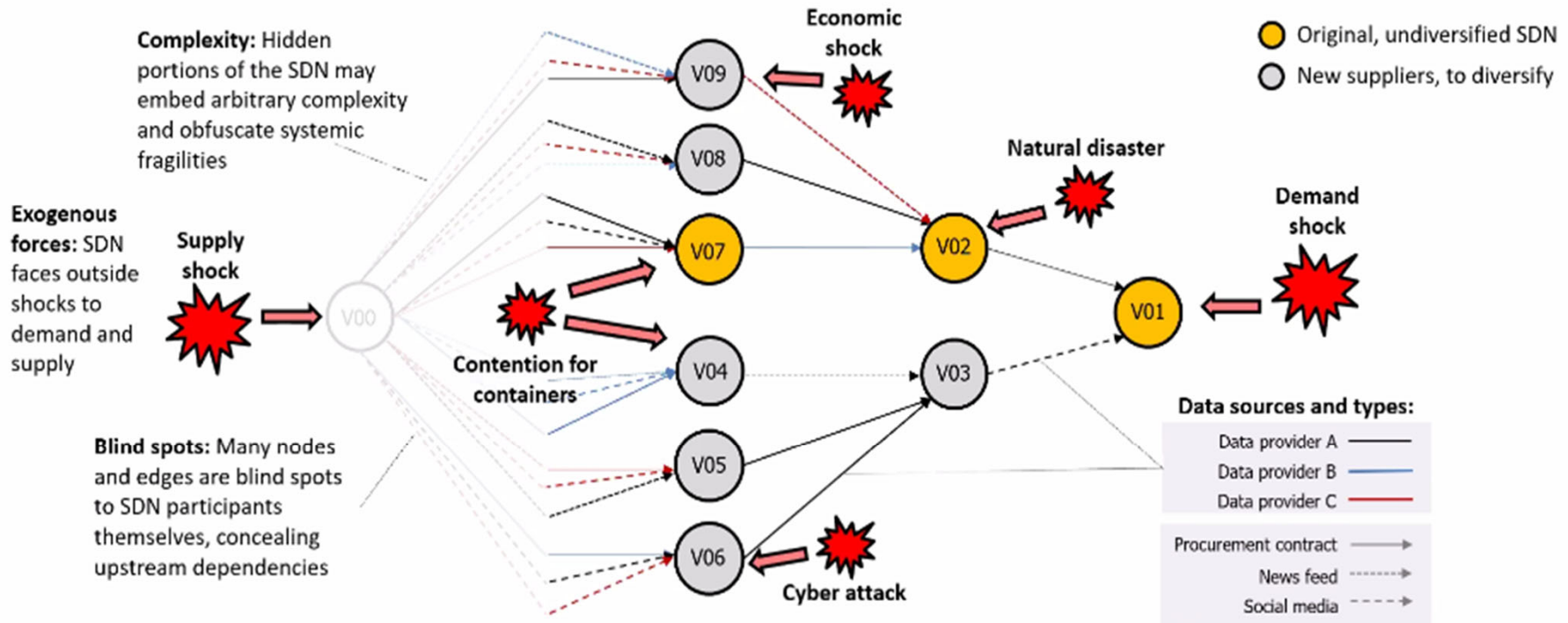
System Level





# Supply-and-Demand Networks – challenges

**SDNs operate as engines for strategic surprise – many critical vulnerabilities emerge only at the system level**



**RSDN will explore SDN fragilities and possible mitigations – e.g., procurement policies, strategic reserves, etc.**

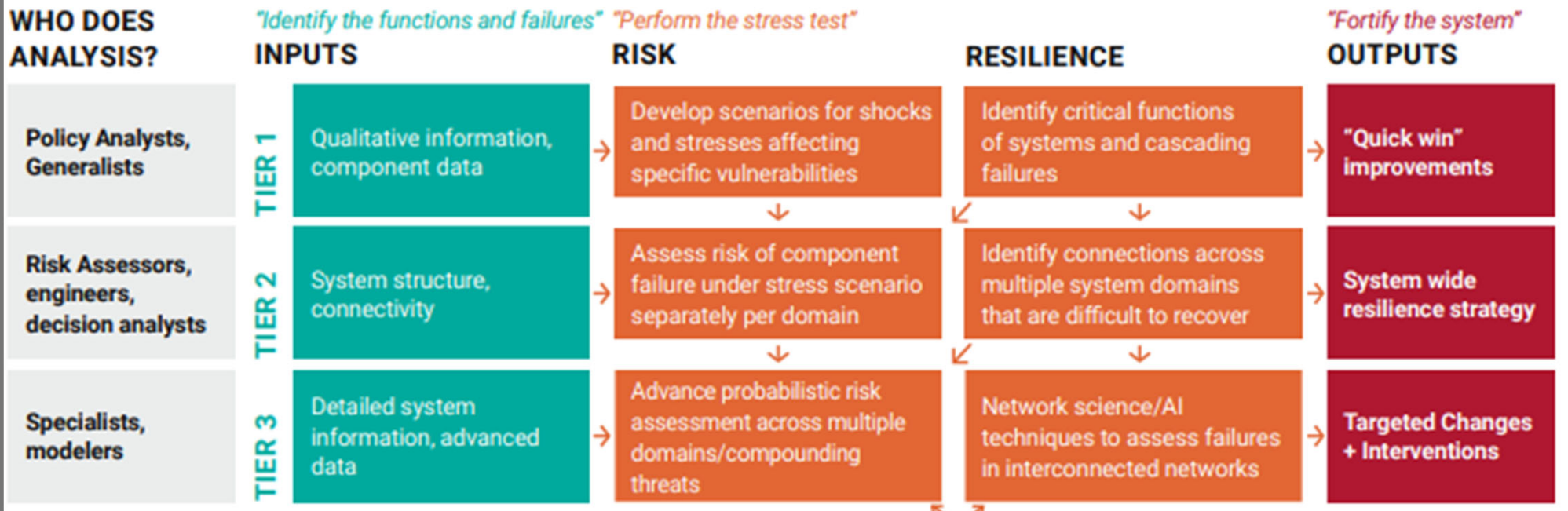


# Resilience Stress Testing



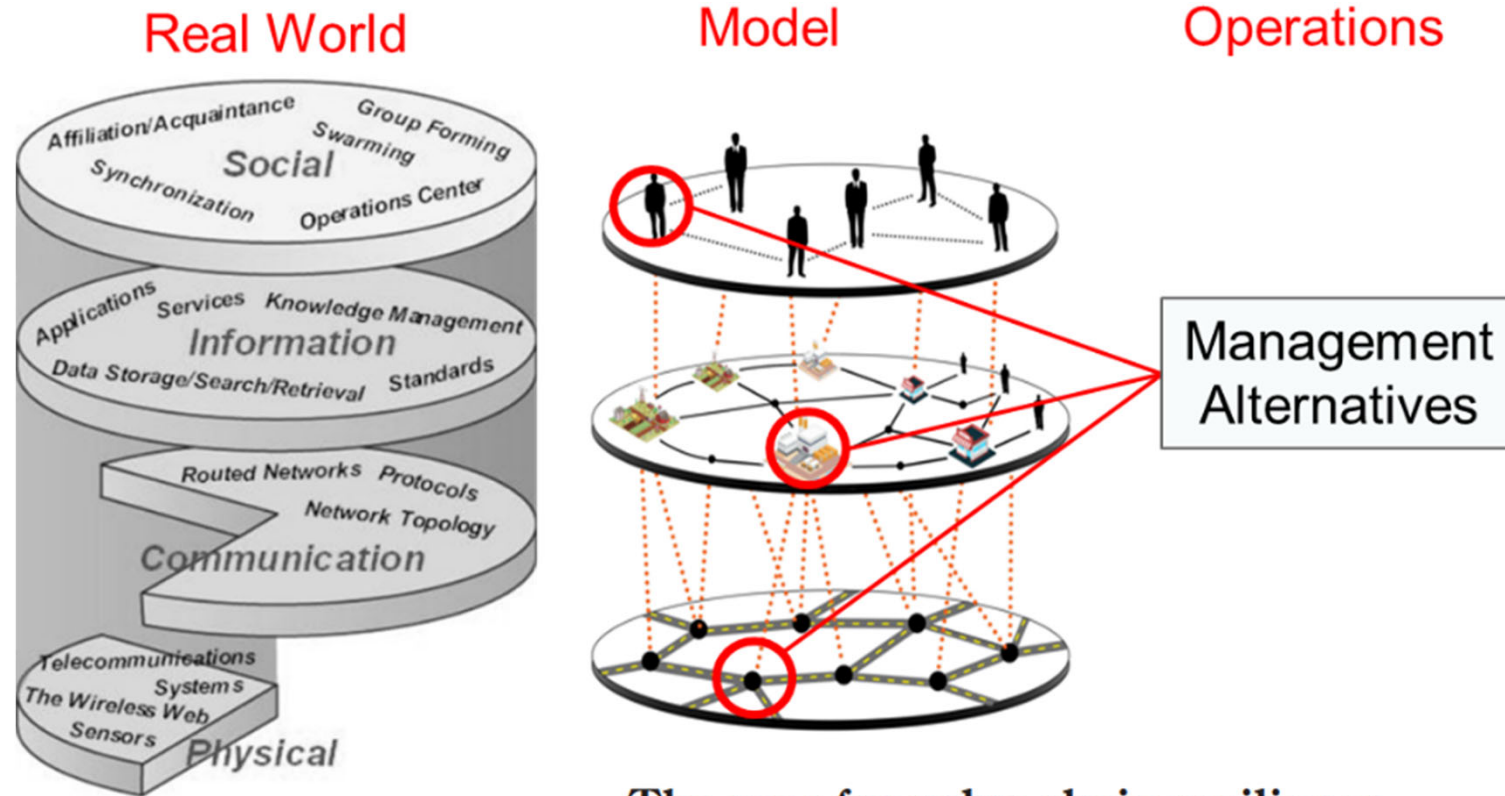
## INTEGRATED RISK/RESILIENCE STRESS TESTING

578 | Nature | Vol 603 | 24 March 2022



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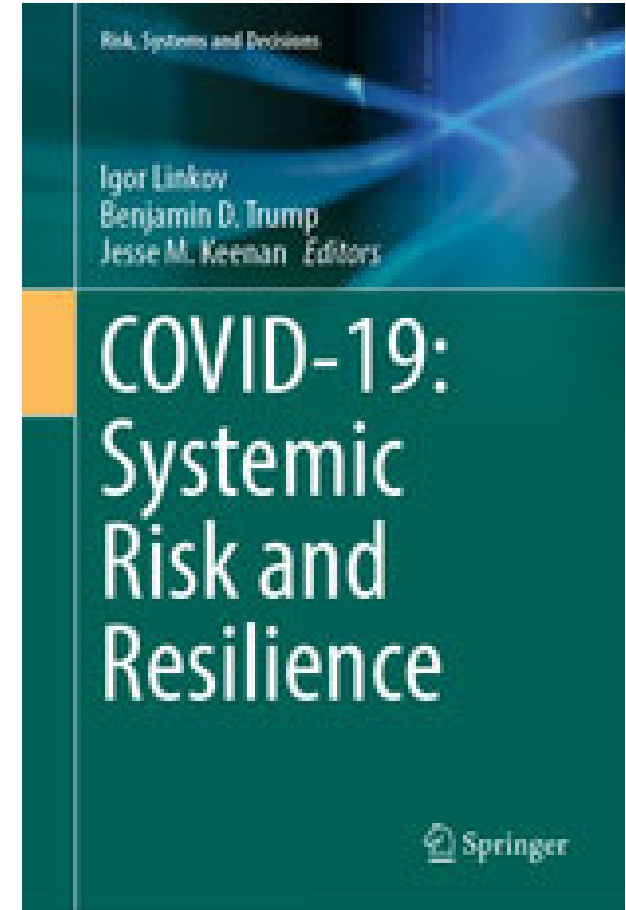
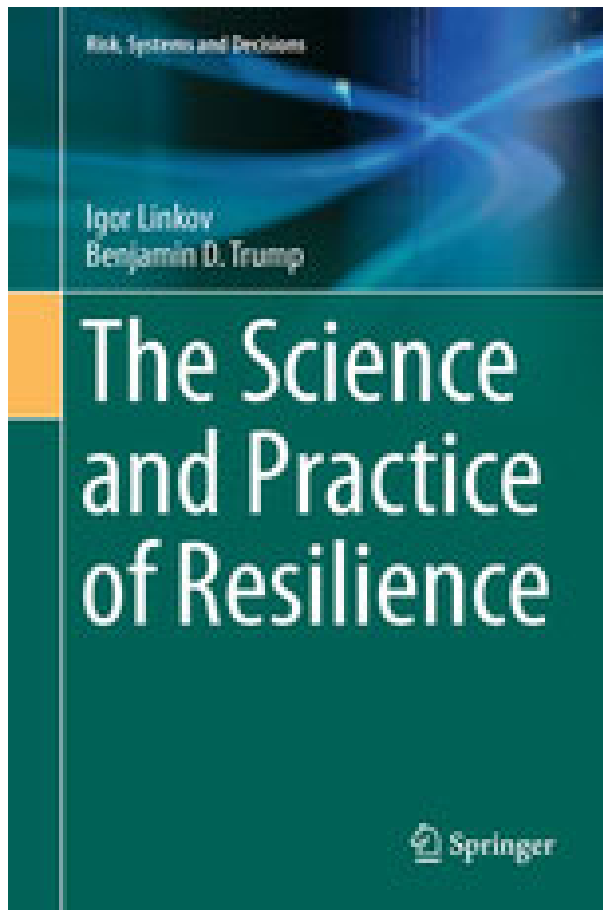
# Vision for System Resilience

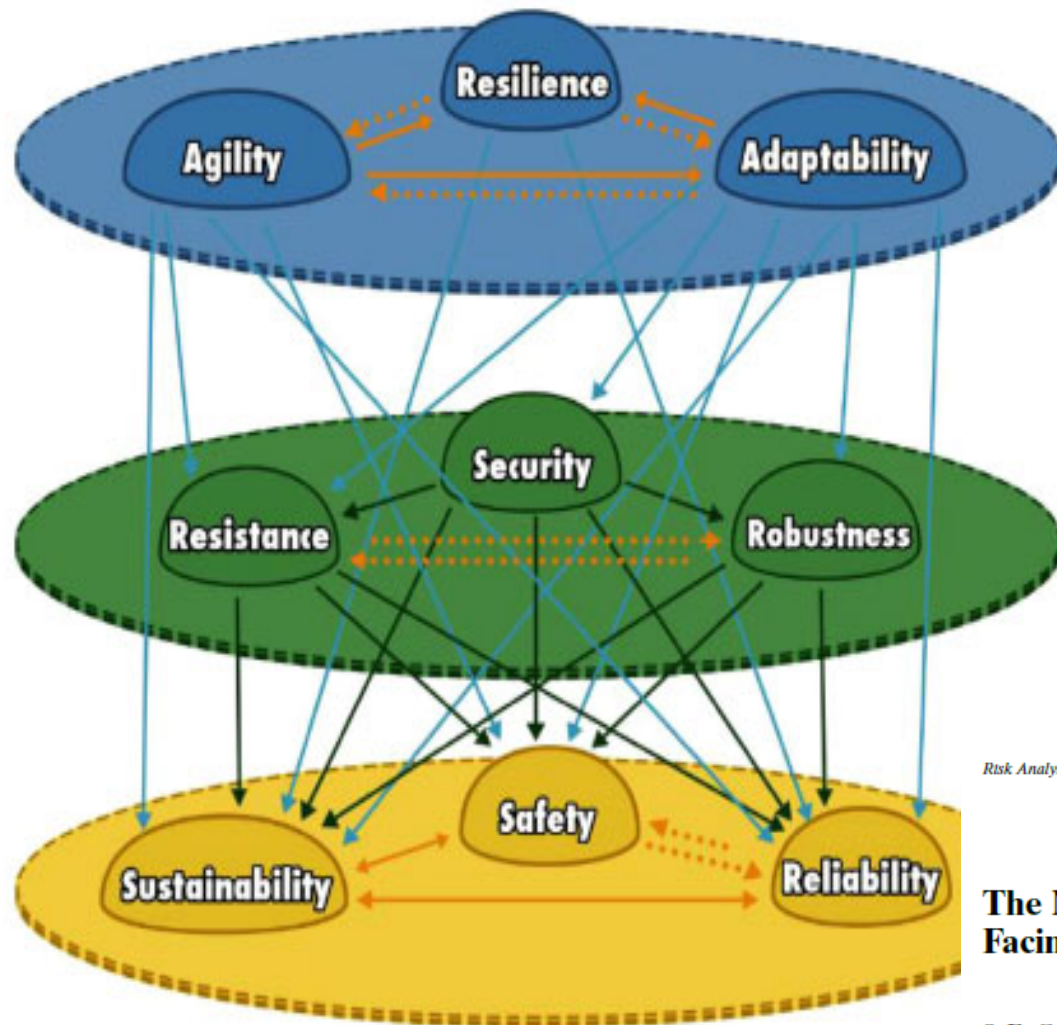


## The case for value chain resilience

Igor Linkov, Savina Carluccio, Oliver Pritchard, Áine Ni Bhreasail, Stephanie Galaitsi, Joseph Sarkis and Jeffrey M. Keisler

Management Research Review  
 © Emerald Publishing Limited  
 2040-8269  
 DOI 10.1108/MRR-08-2019-0353









# System Affected by Threats: Taxonomy

*Risk Analysis, Vol. 0, No. 0, 2020*

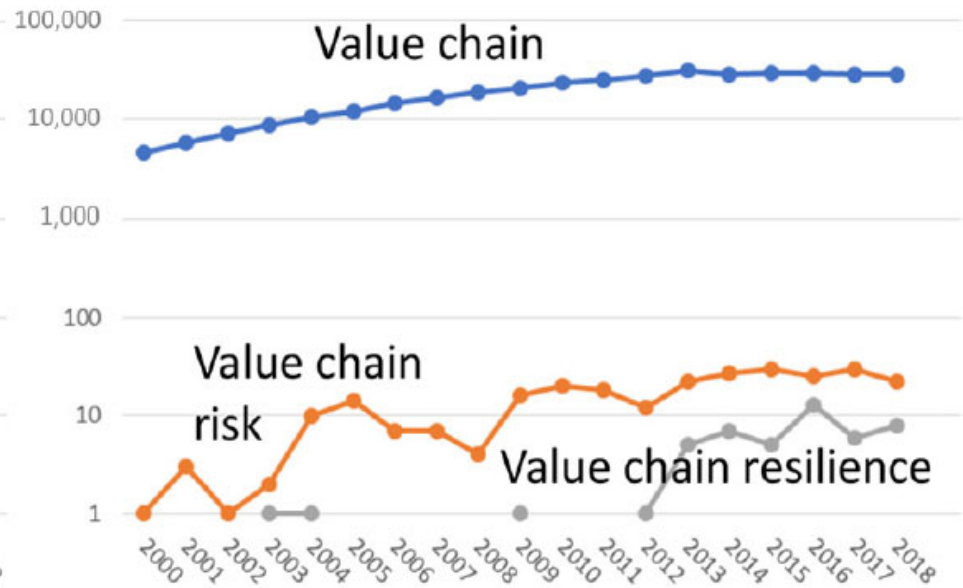
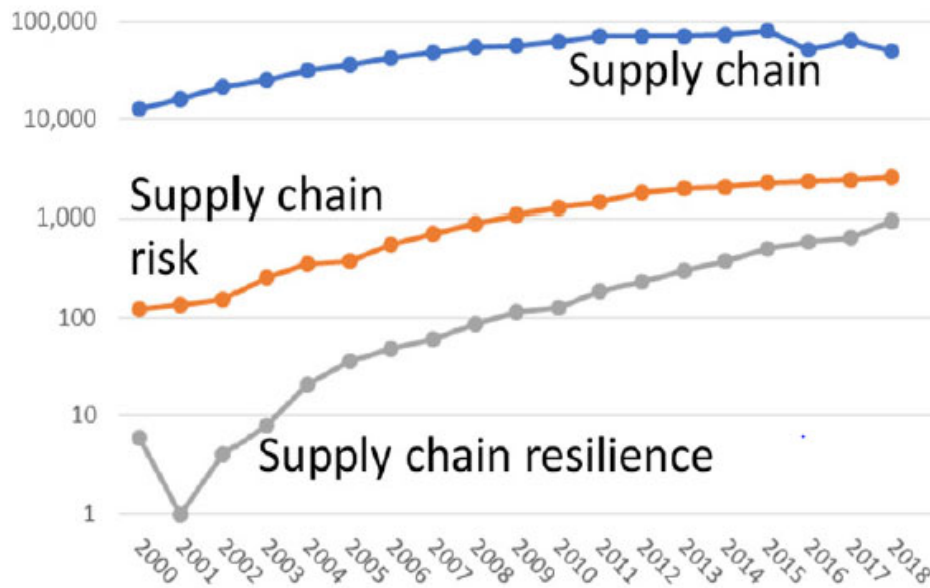
DOI: 10.1111/risa.13577

**The Need to Reconcile Concepts that Characterize Systems Facing Threats**

S. E. Galaitsi <sup>1</sup>, Jeffrey M. Keisler <sup>2</sup>, Benjamin D. Trump <sup>1</sup> and Igor Linkov <sup>1,\*</sup>

# Field of Supply Chain Resilience is New

## Web of Science Publications



2020

## The case for value chain resilience

Igor Linkov, Savina Carluccio, Oliver Pritchard, Áine Ní Bhreasail, Stephanie Galaitsi, Joseph Sarkis and Jeffrey M. Keisler