



# Resilient Transportation Systems: Moving from Risk to Resilience

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September 14, 2023

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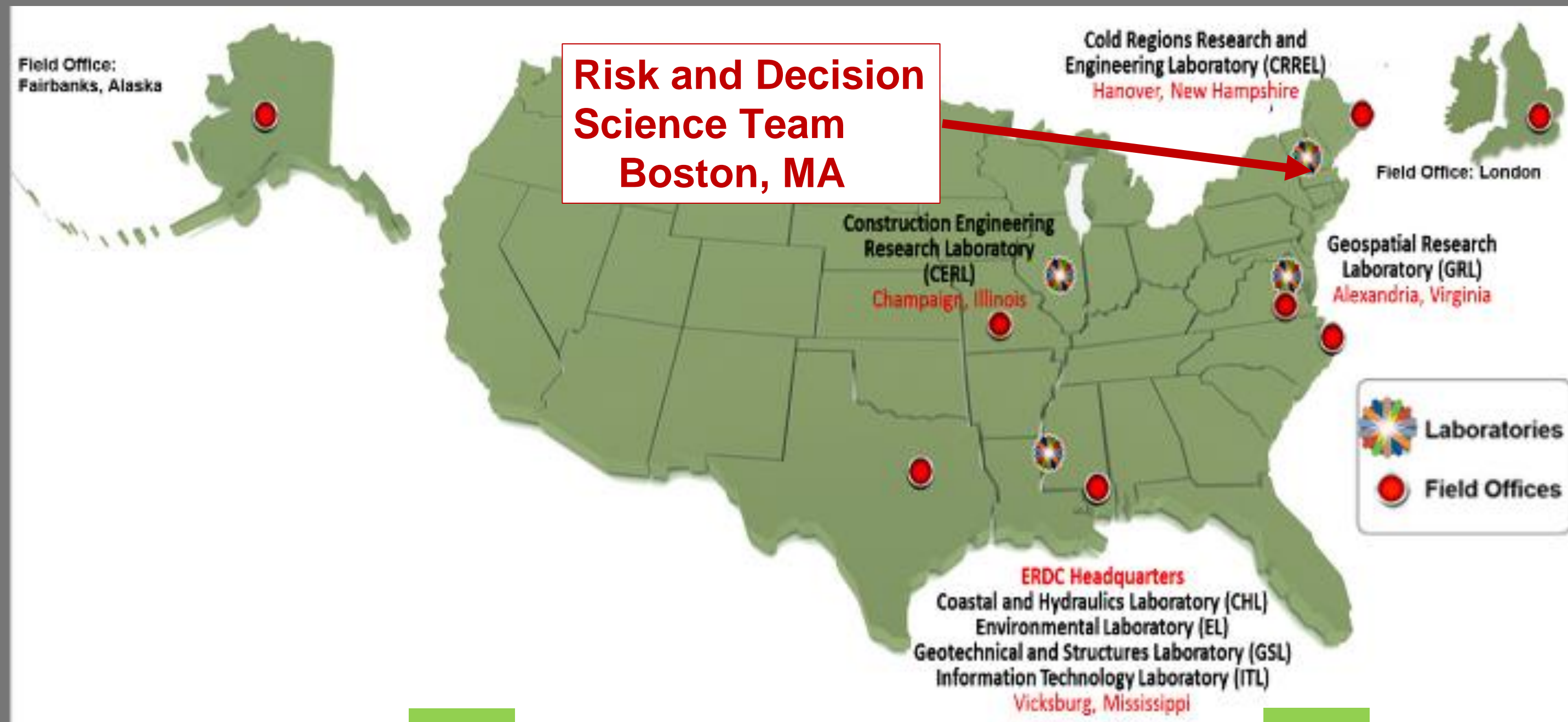
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DISCOVER | DEVELOP | DELIVER

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Annual Research Program Exceeding  
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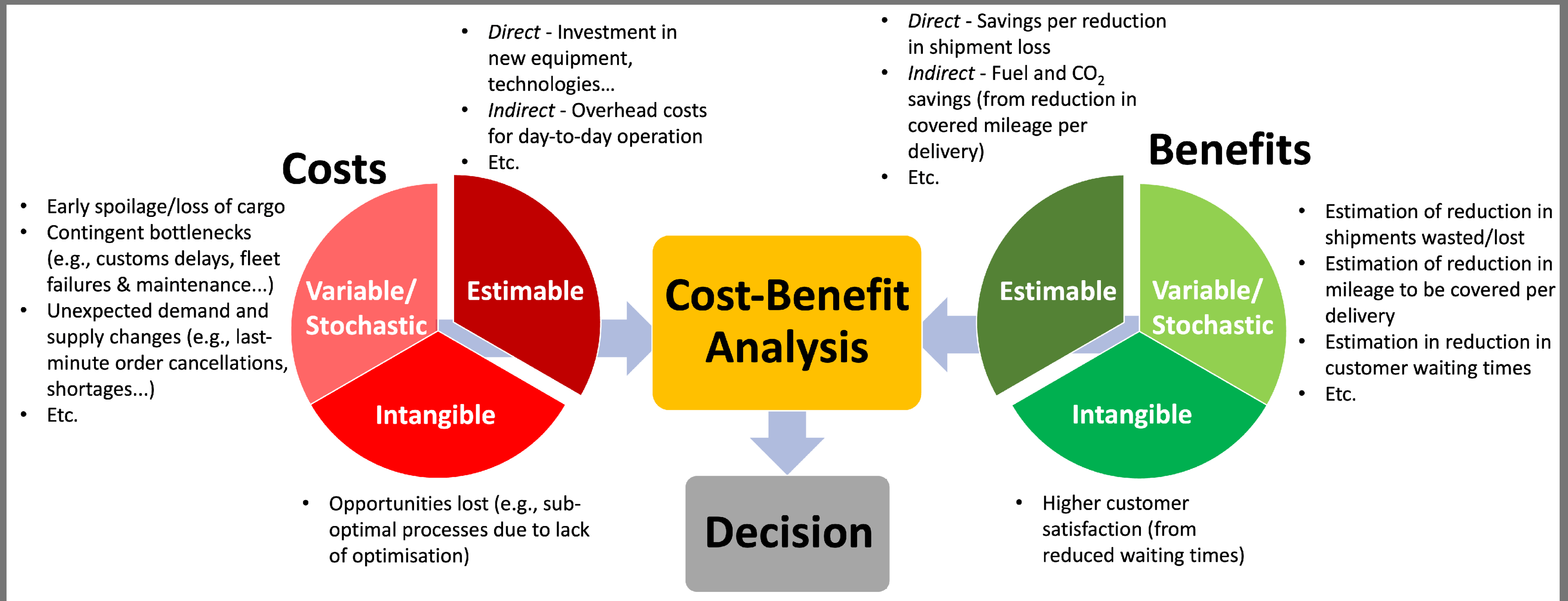
2100 Strong  
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All DoD Services  
 Army, Navy, Air Force, NASA, DHS, FEMA, DIA, NGA  
 Academia  
 68 EPAs with top engineering schools  
 Industry  
 172 CRADAs  
 International  
 14 international agreements with 7 countries

# Traditional Approaches: Risk Assessments & Cost-Benefit Analysis

- Identity risks and manage those risks: Threat, vulnerability, consequence



# Risk vs Resilience: Definitions

**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.”

\*Definitions by Oxford Dictionary



30 | NATURE | VOL 555 | 1 MARCH 2018

## 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

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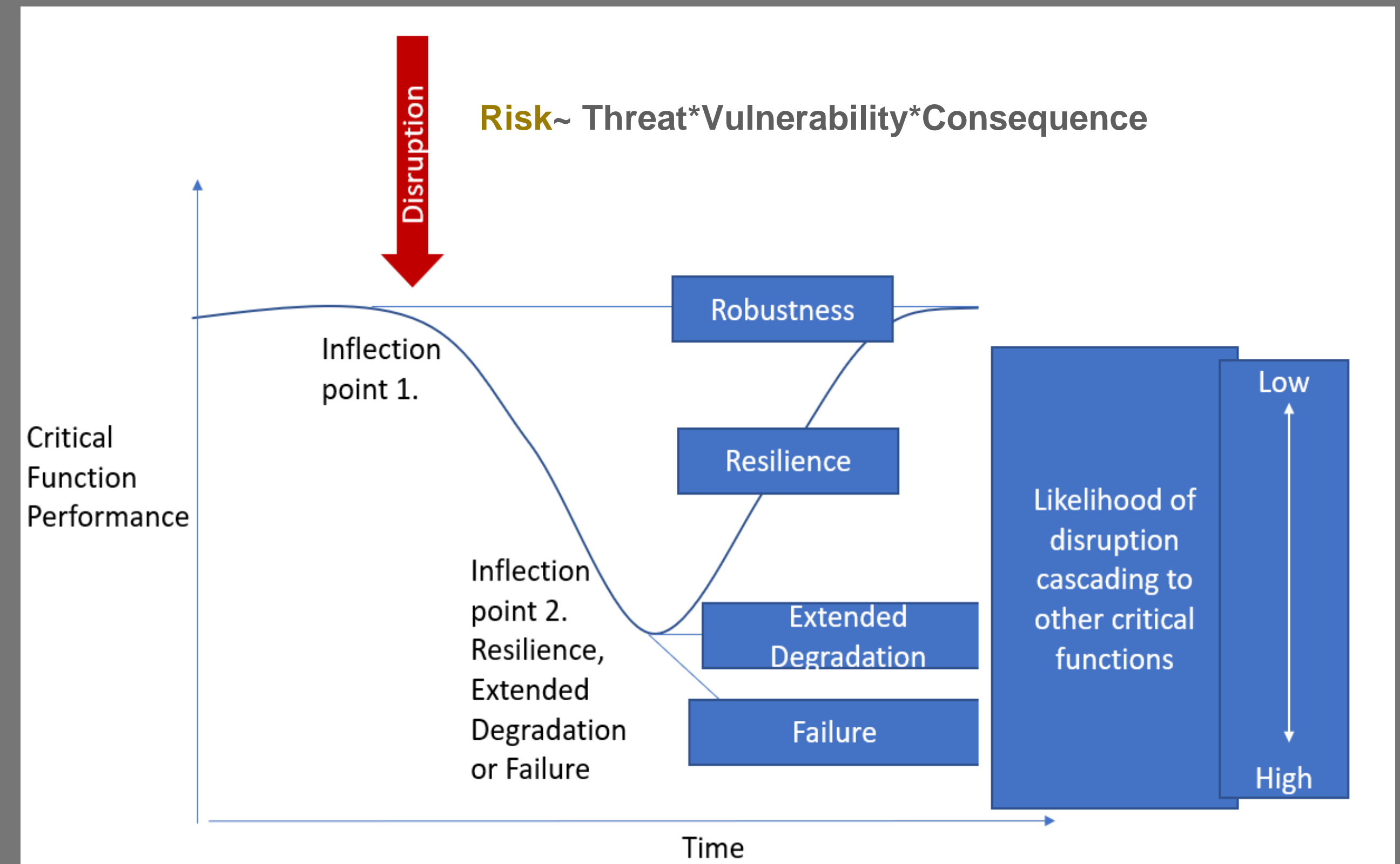
# Risk vs Resilience: Definitions

## Risk Management Strategy:

- Aim: Predict risks & either:
  - Prevent the from impacting system
  - Planning around them (insurance)
- $\text{Threat} * \text{Vulnerability} * \text{Consequence}$

## Resilience Strategy:

- We can't predict all threats a company will face
  - Especially in a dynamic and changing world
- Reduce severity, time and/or extent of the disruption
- Prepare, absorb, recover, adapt from disruption



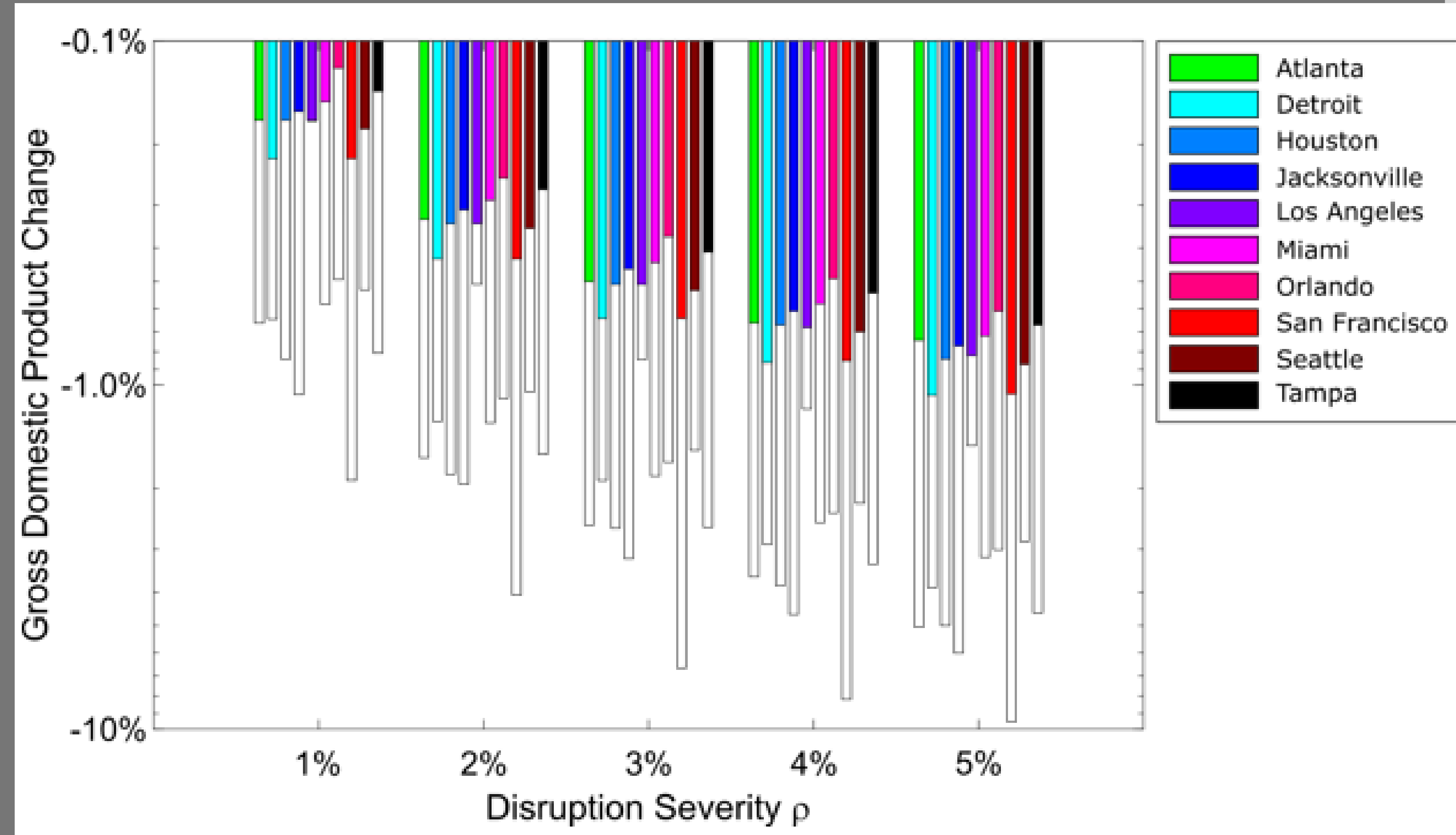
# Risk vs Resilience: Random Disruptions are Much More Consequential

## Risk:

- Identify risks and manage those risks
  - Only as good as your risk estimates
  - Doesn't address system response or un-anticipated disruptions

## Resilience:

- Improving system's ability to:
  - Absorb, Recover, Adapt
- Threat agnostic
  - Addresses both anticipated & unanticipated disruptions



# What does it mean to have a resilient transportation network?

## 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.



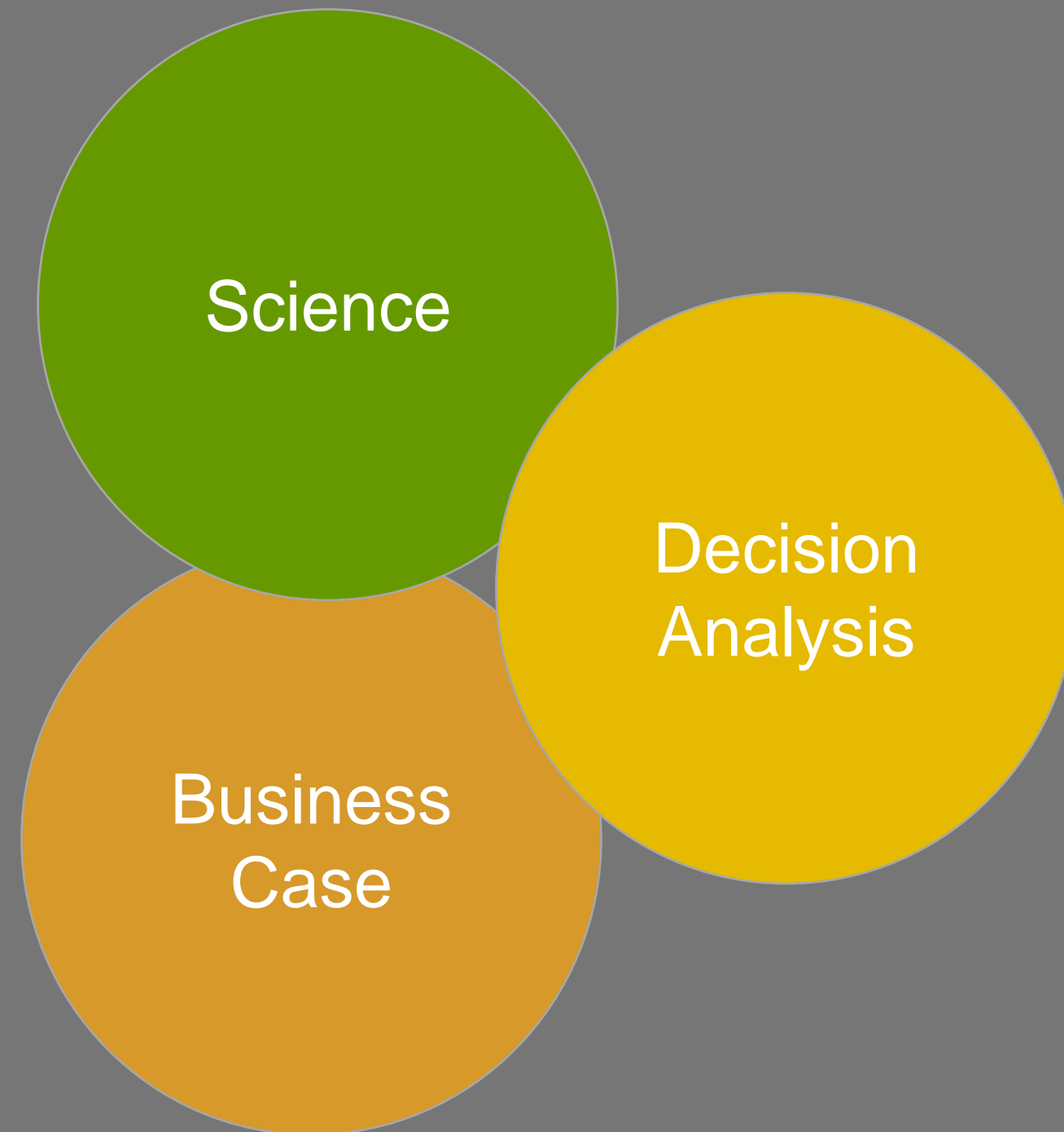
## Lack of Resilience:

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

Traffic disruptions are not predictable and of variable scale.



# What does it mean to have a resilient transportation network?



## 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)



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Lack of resilience in transportation networks: Economic implications



SCIENCE ADVANCES | RESEARCH ARTICLE

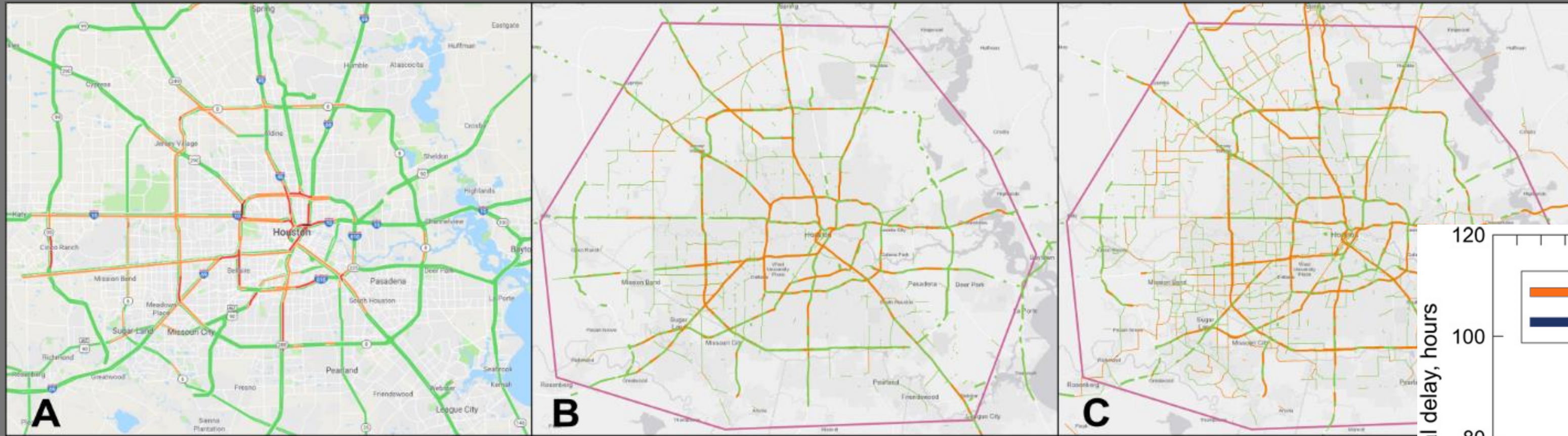
NETWORK SCIENCE

## 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>

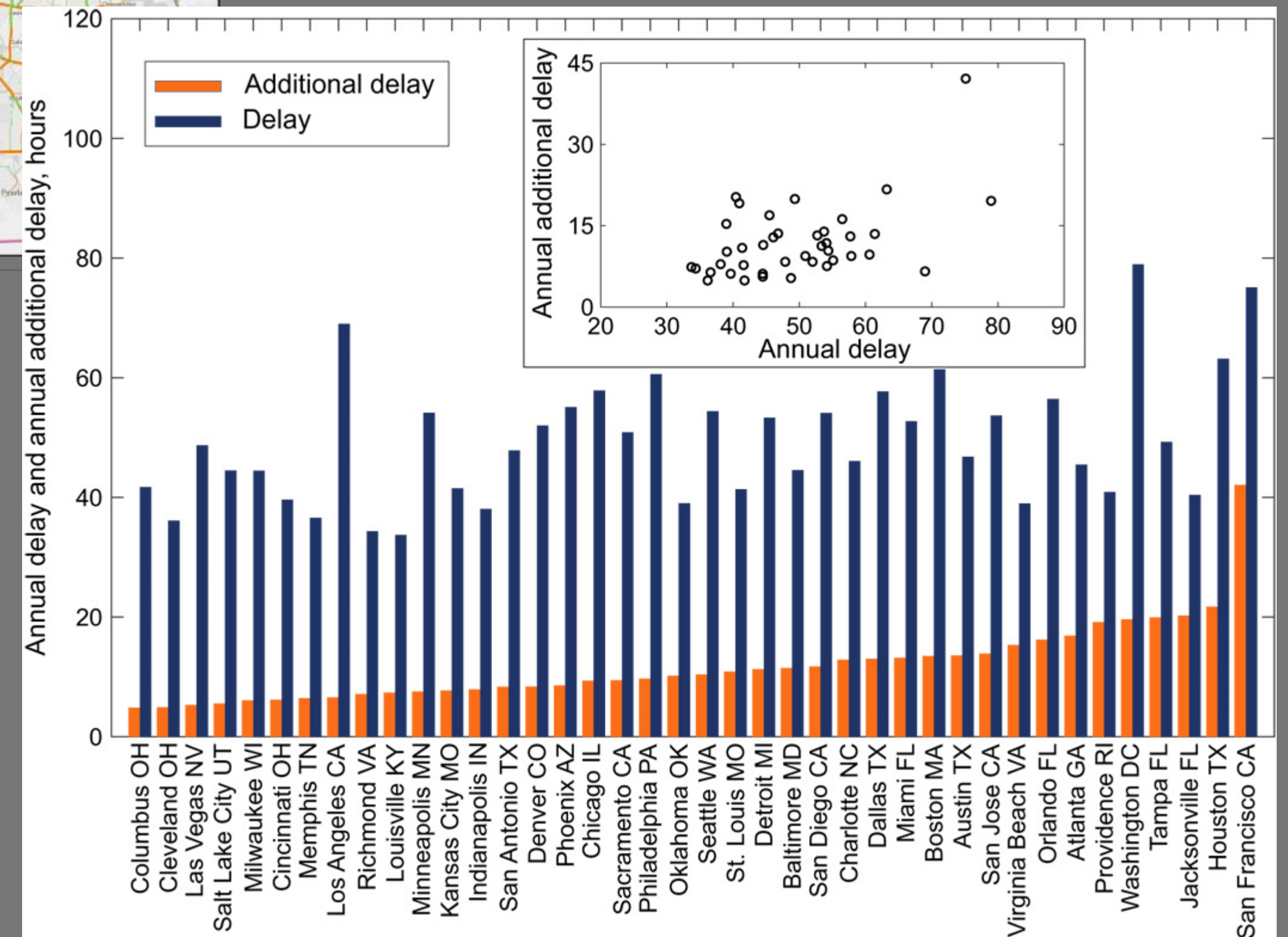


# What does it mean to have a resilient transportation network?: Impact of Transportation Network Disruptions on Travel Time

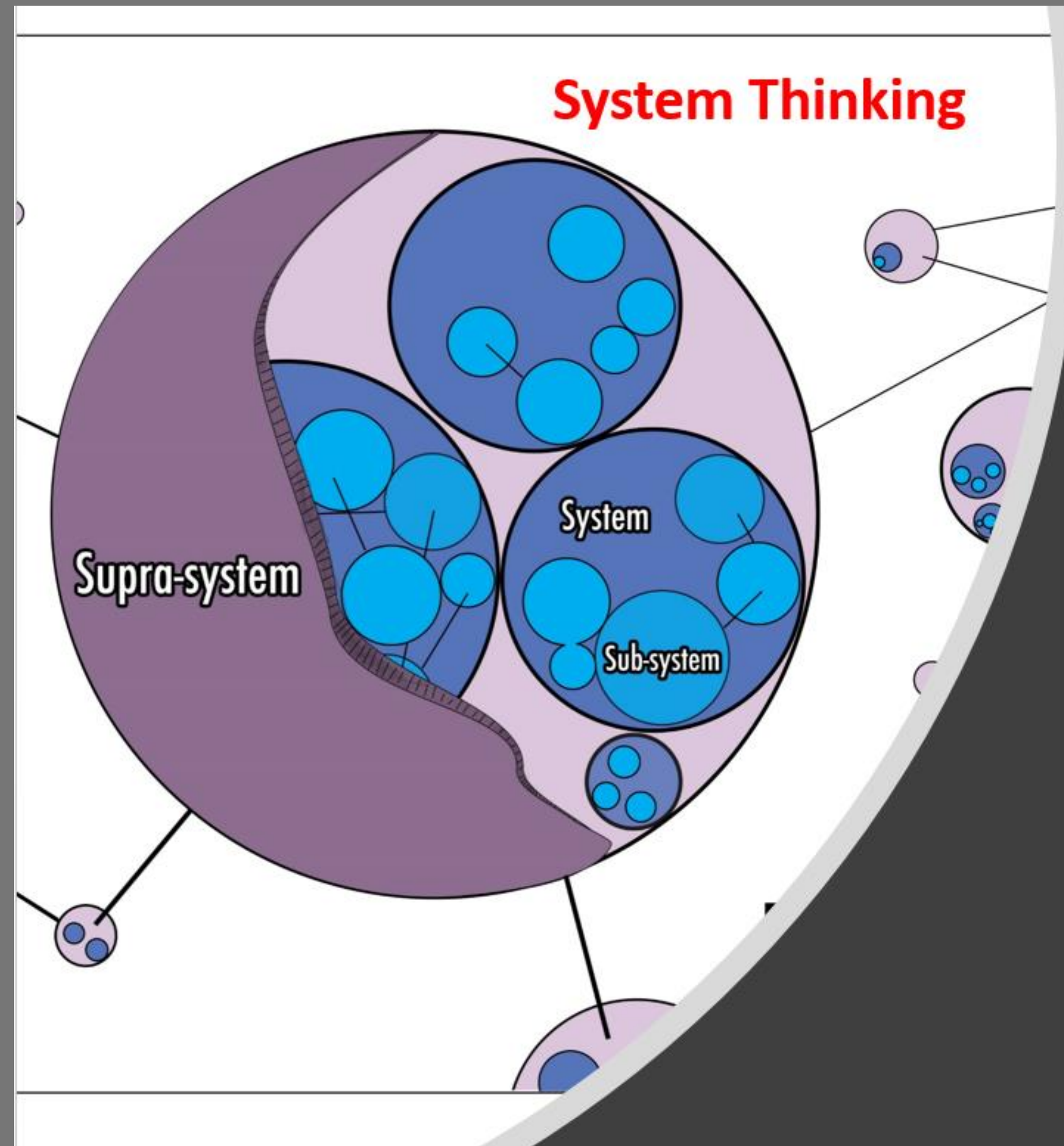


- 1) Build networks comprise of road links and intersection nodes
- 2) Assign travelers and routes
- 3) Calculate free flow travel times and actual travel times
- 4) Calculate normal delay
- 5) Calibrate model to data

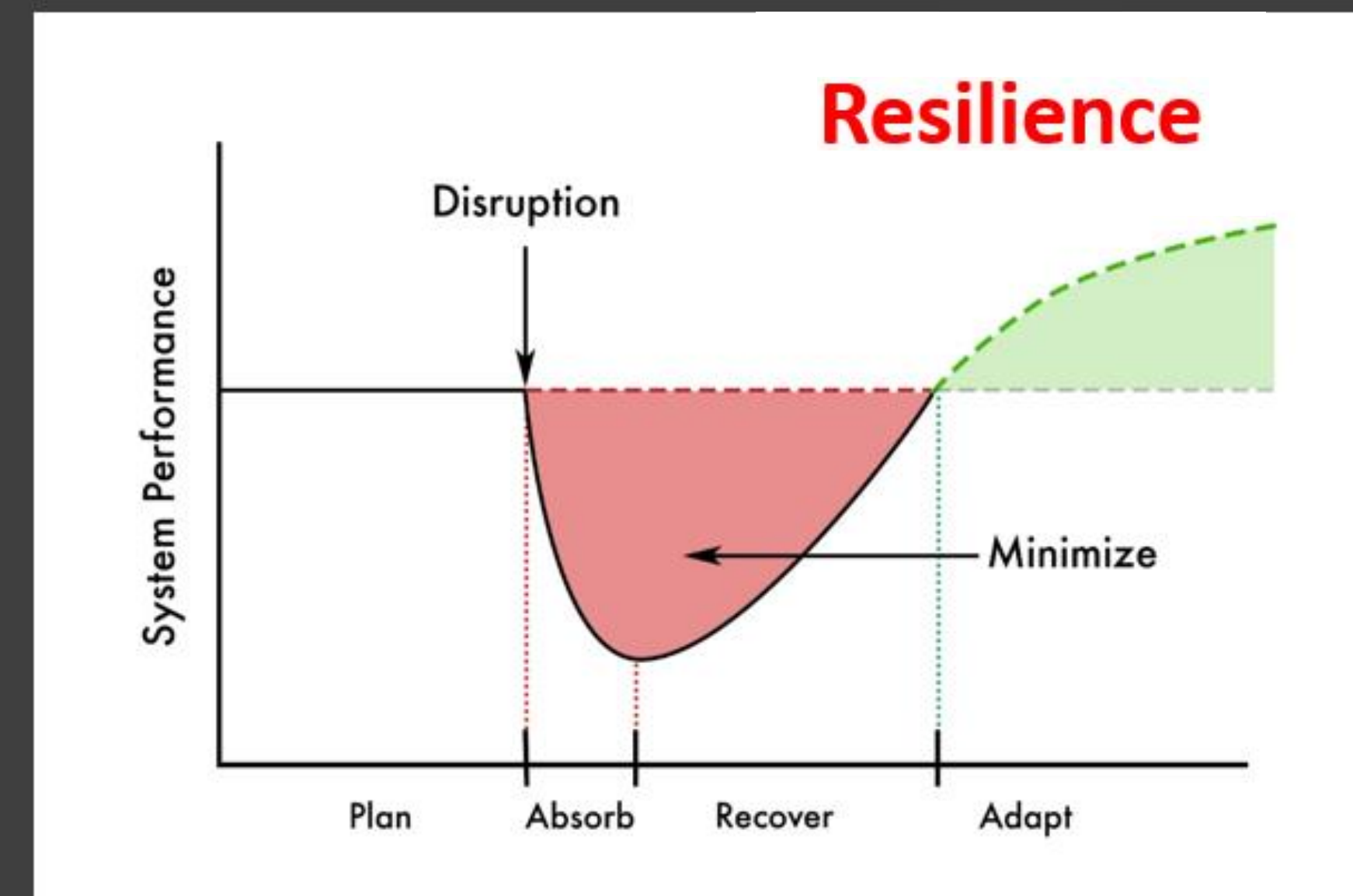
$$\langle \Delta T \rangle = \frac{1}{N_c} \sum_{\{ij\} \in \text{all roads}} L_{ij} l_{ij} \left( \frac{1}{v_{ij}} - \frac{1}{v_{ij}^0} \right)$$



# ERDC Approach: System-Level Approach to Resilience



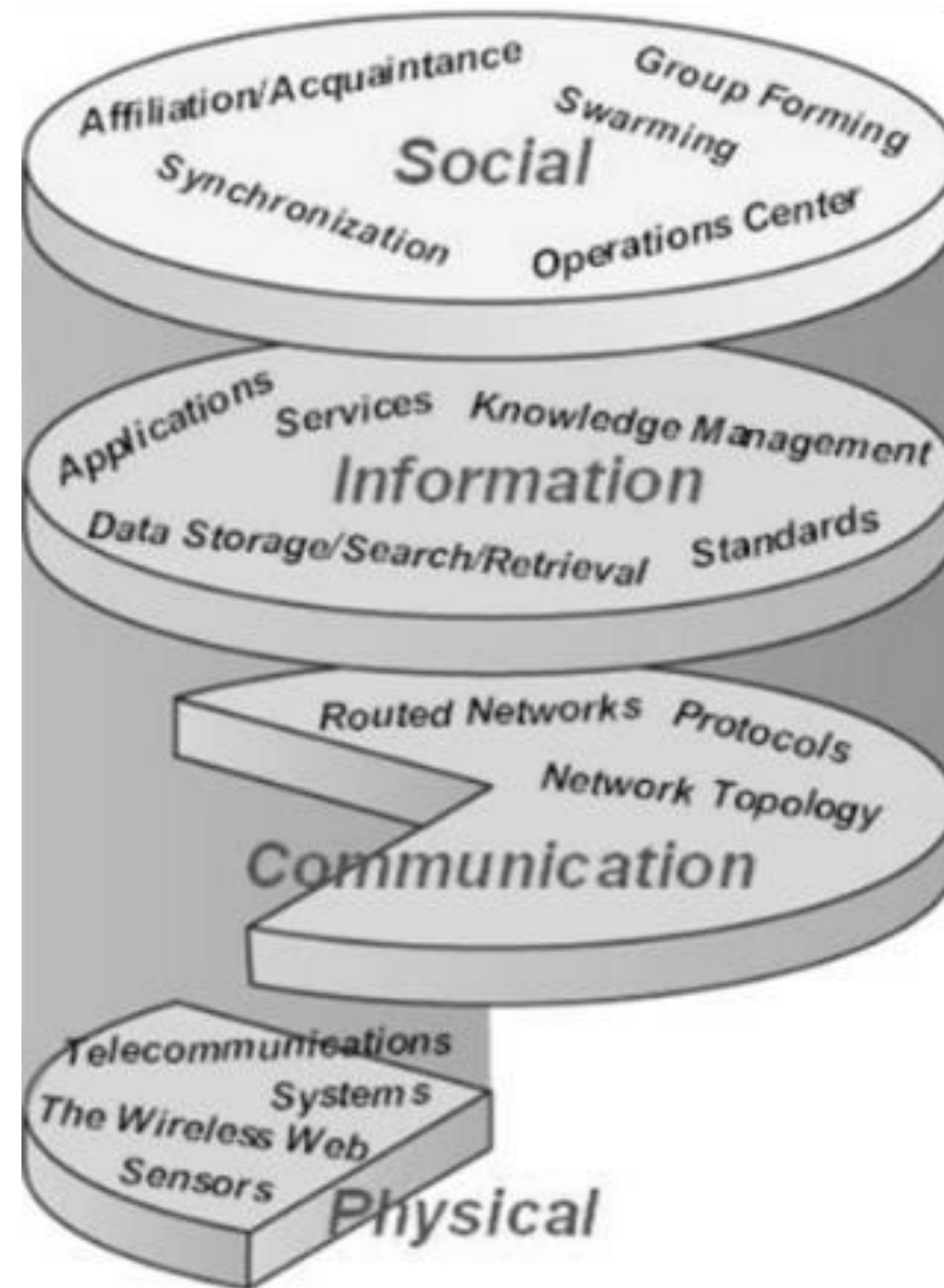
What Makes Complex Systems (Communities) Susceptible to Threat?



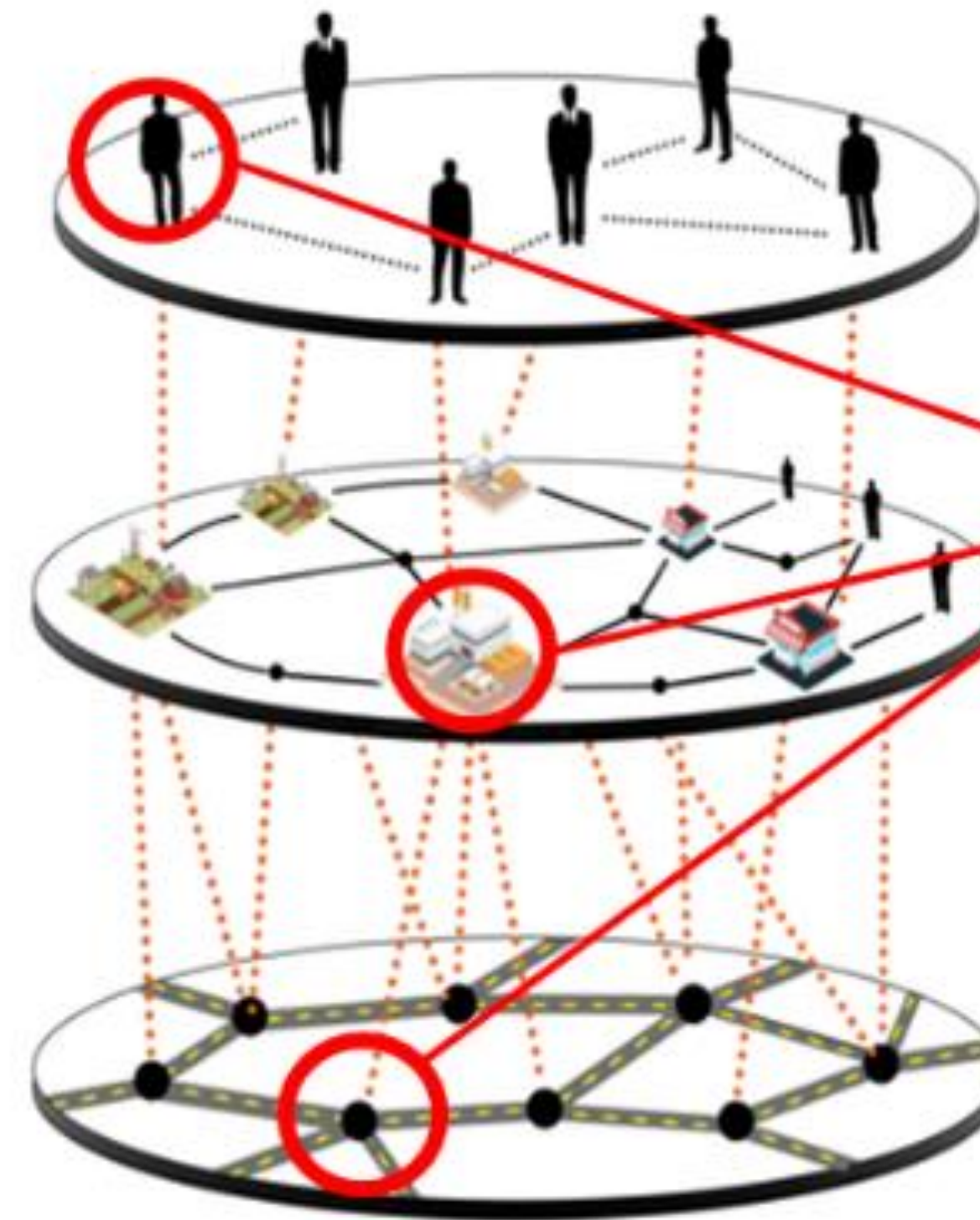
After Linkov and Trump, 2019

# ERDC Vision for System Resilience

## Real World

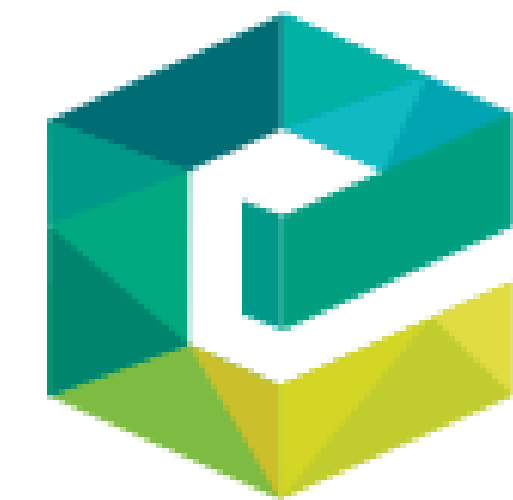


## Model



## Operations

Management  
Alternatives



## The case for value chain resilience

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

Management Research Review  
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2040-8269  
DOI [10.1108/MRR-08-2019-0353](https://doi.org/10.1108/MRR-08-2019-0353)

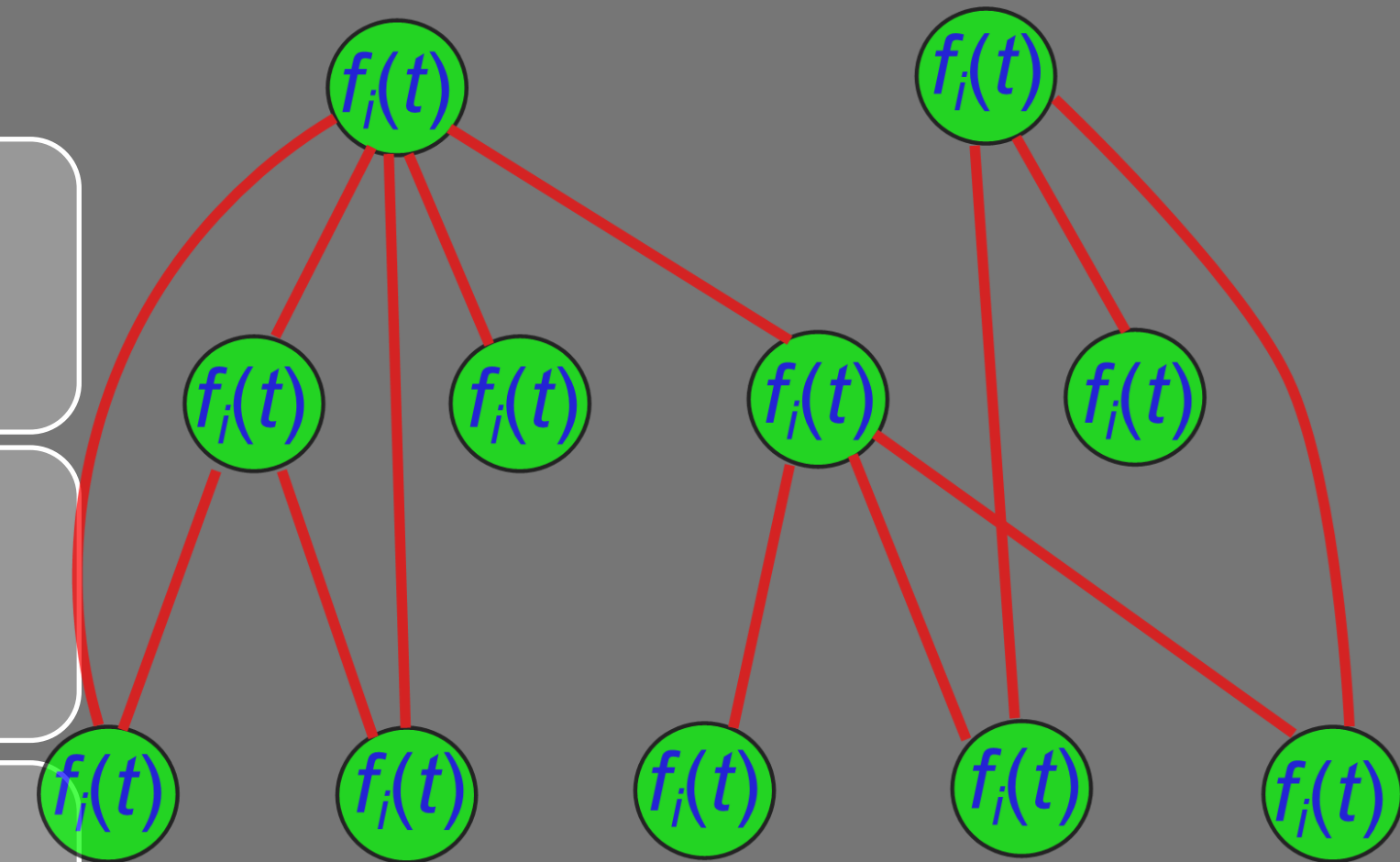
# ERDC Approach: System-Level Approach to Resilience

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

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

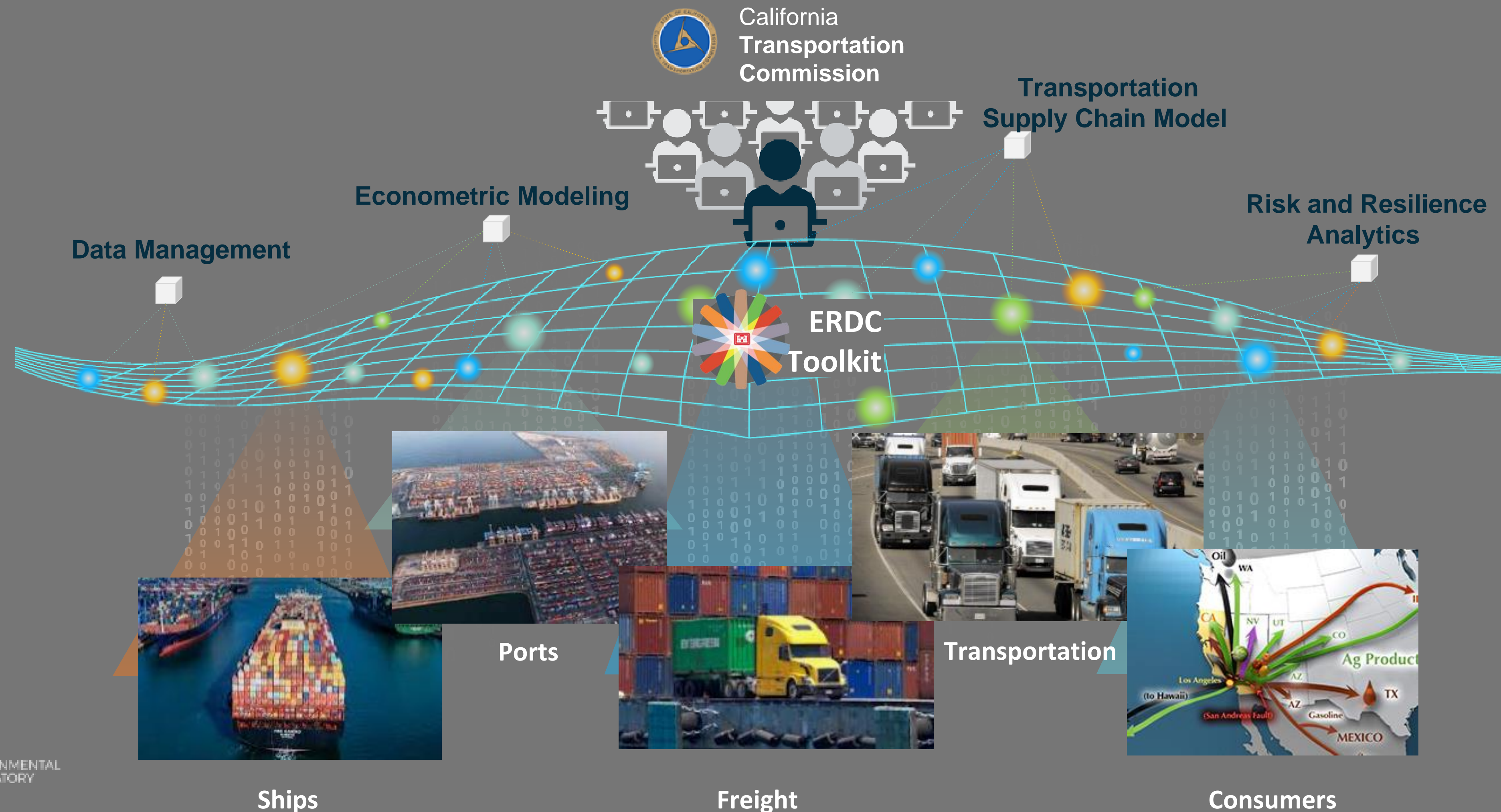
Network *adaptive algorithms* ( $\mathcal{C}$ ) defining how nodes' (links') properties and parameters change with time

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



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

# ERDC Approach: System-Level Approach to Resilience



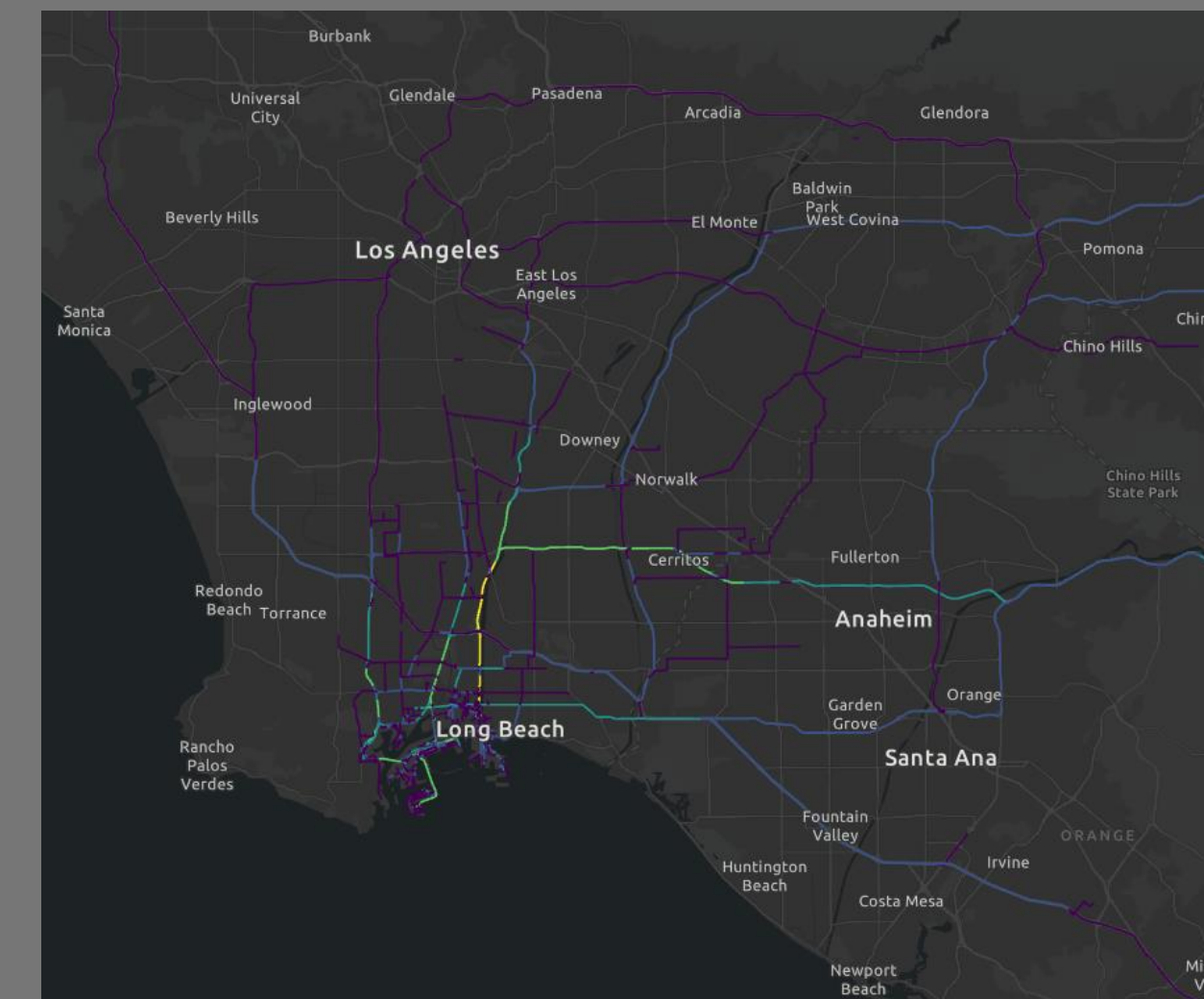
# ERDC Approach: System-Level Approach to Resilience in Transportation Systems

- Problems that work sought to addressed:
  - I. General Transportation/Supply Chain Resilience Quantification\*
  - II. Zero-Emission Refueling Station Prioritization

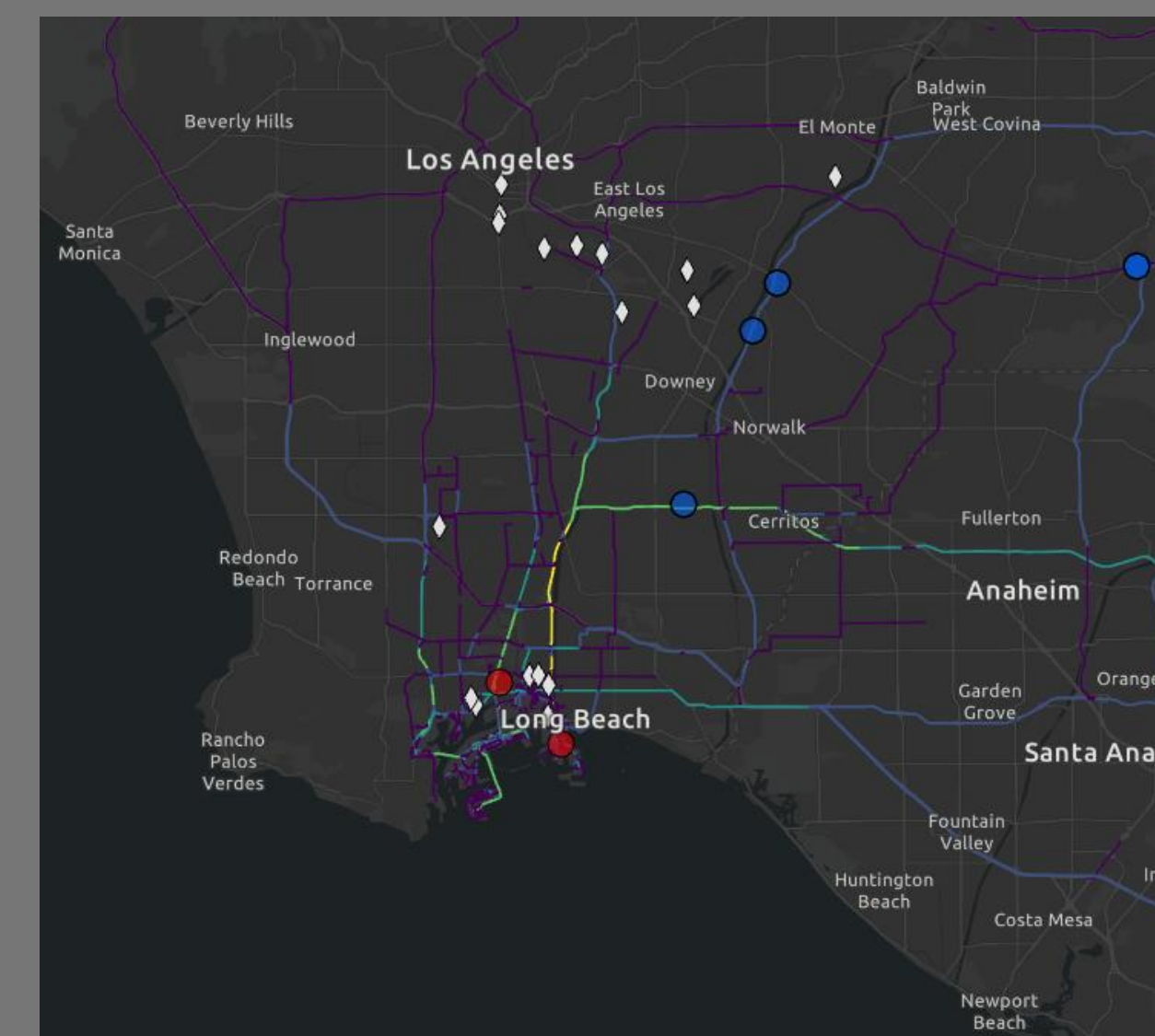
\*proposed work



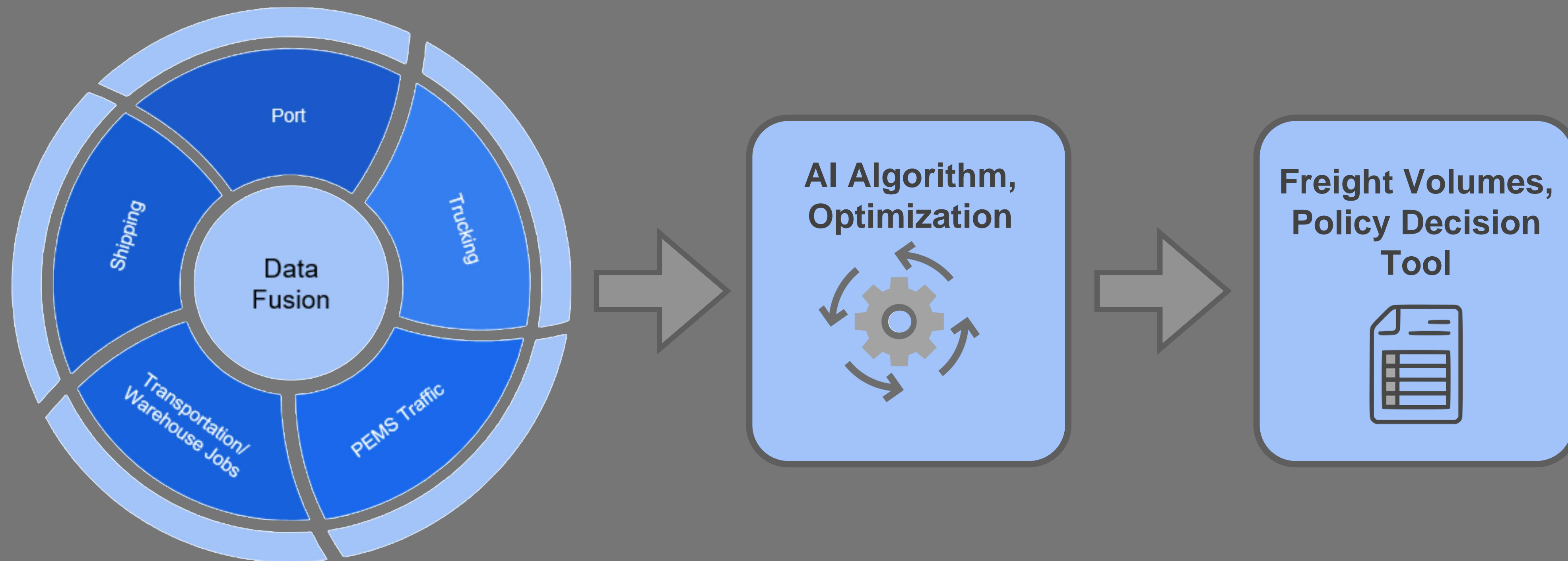
## Supply Chain/ Transportation Resilience



## Zero Emission Refueling Station

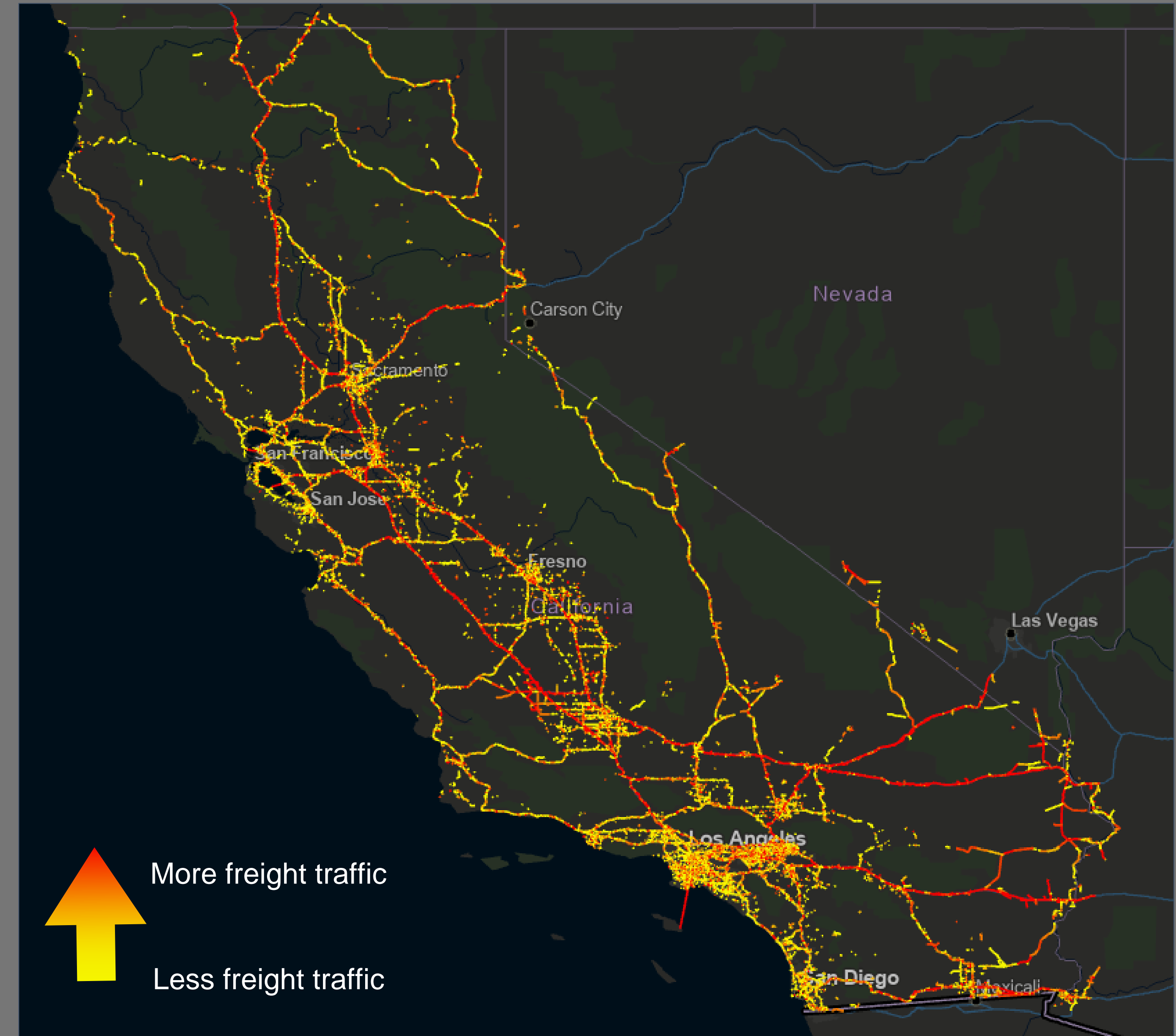


# Methodology: Data Fusion and Optimization Using AI and Resilience Modeling



## Methodology: Aggregate GPS

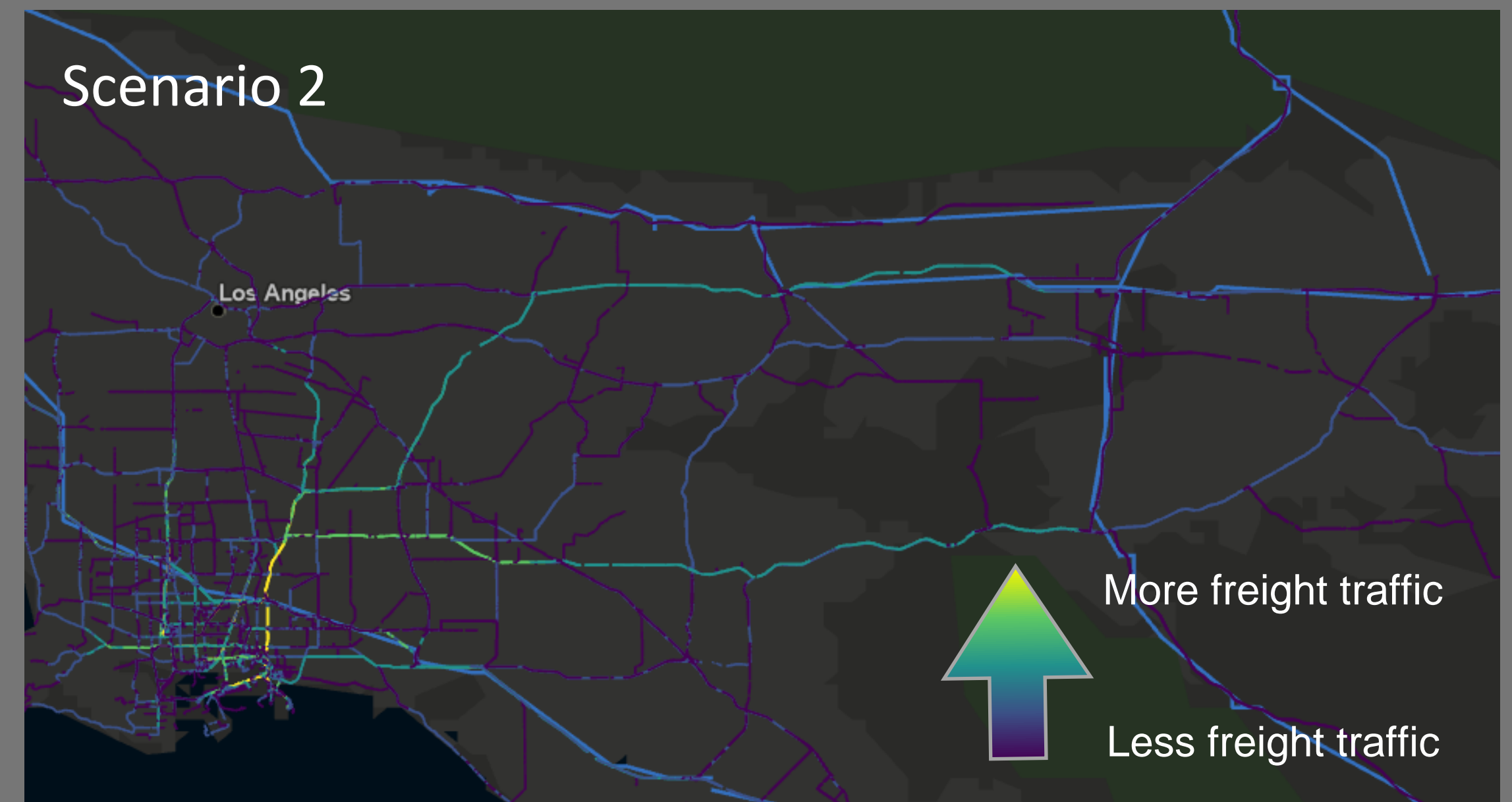
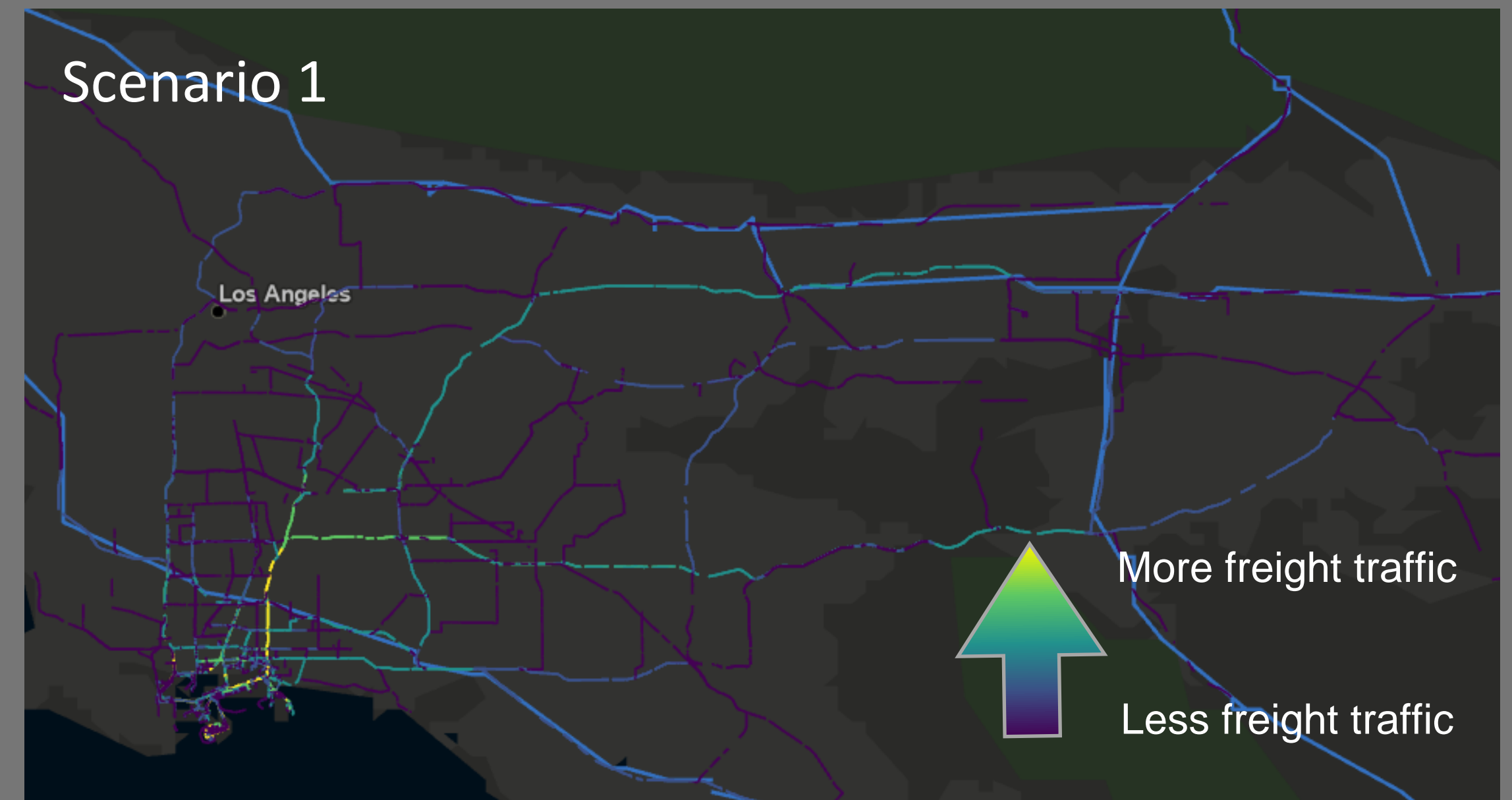
- Tools/Impacts can be understood for:
  - Aggregate Flows
  - Medium vs Heavy Trucks
  - Long Haul
  - CA External Goods:
    - Ports
    - Airports
    - Land Points of Entry





# I. Problem 1: Resilience Policy Comparison Tool

- Scenario comparison tool compares new road volumes based on changes to roads
  - **Does not:** Recalculates by assuming cars will divert around the disrupted road
  - **Does:** Re-calculates by defining completely new routes for impacted vehicles
- Finds added congestion and travel time
- Aim: Identify **single points of failure**



## II. Problem 2: Zero Emission Refueling Station

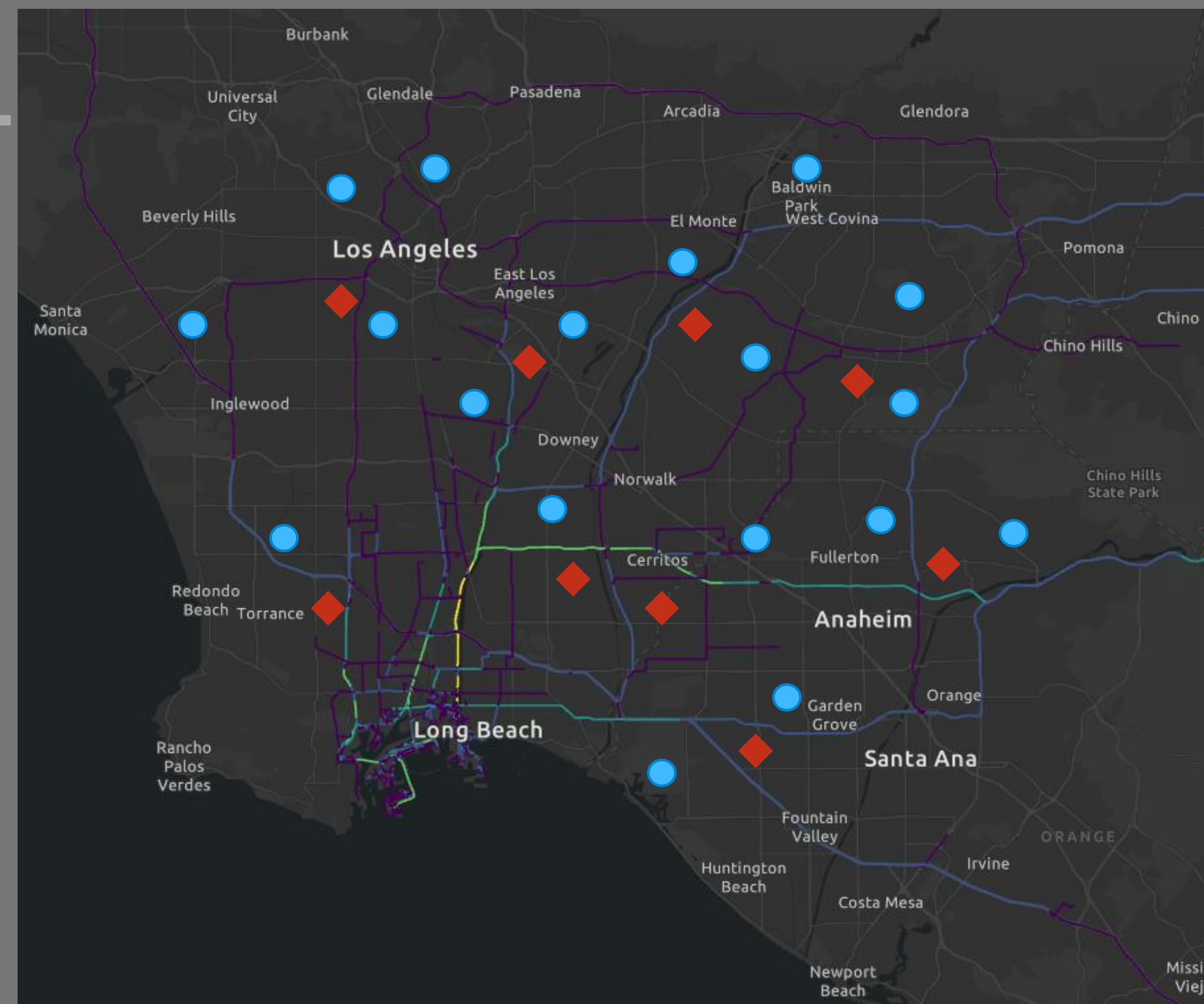
- **Challenge:**  
Minimize the diversion of freight routes caused by fuel conversion (disruption)
- **Solution:**  
Identify gas stations that could be converted to dispensing stations:
  - minimize freight displacement
  - scalable



## II. Problem 2: Methodology

### Facility Location Problem

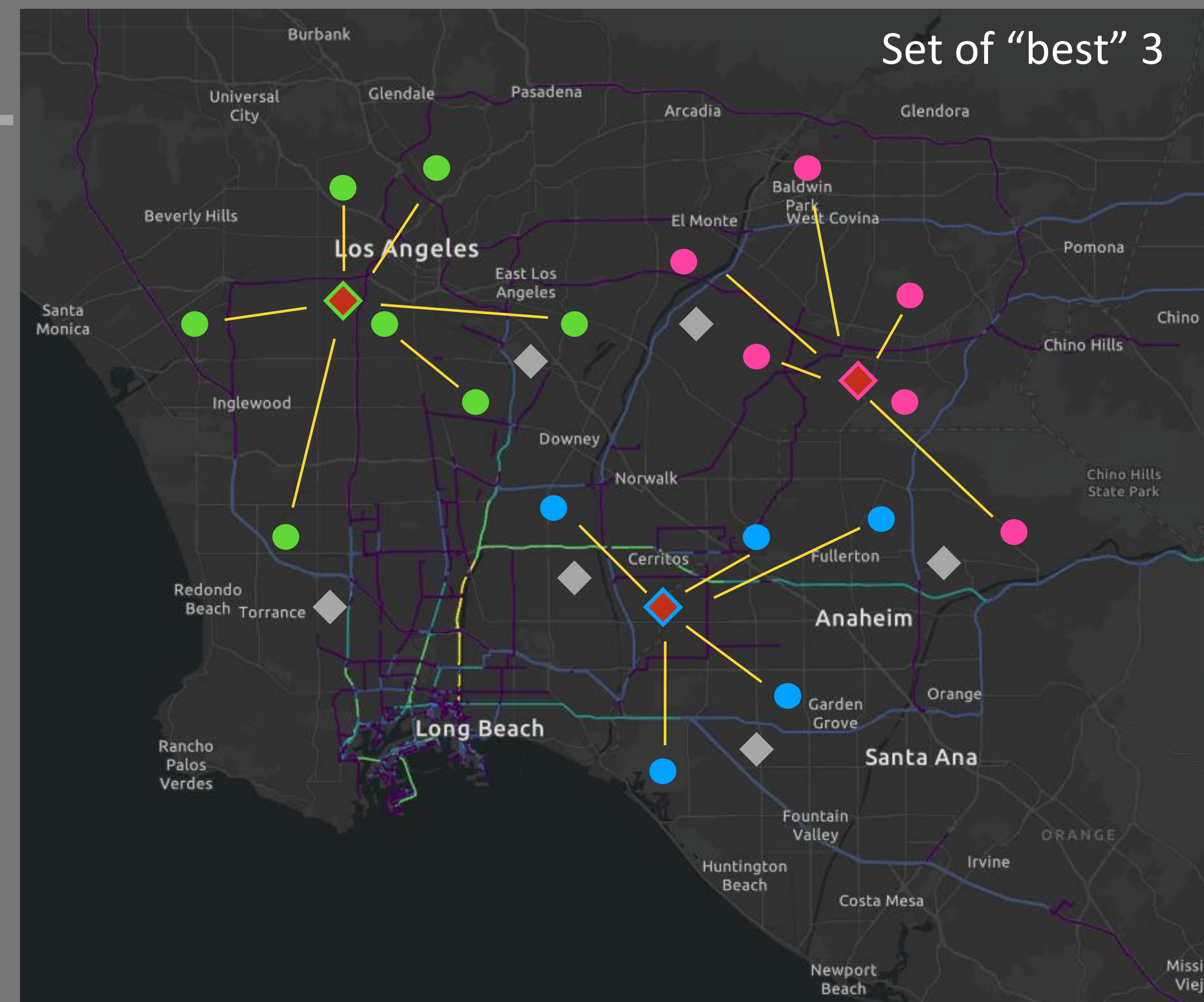
- Assigns **Demand** to **Facilities** such that an objective is minimized
- Objective = **Total Travel Time**
- **Need:**
  - Demand Locations
  - Facility Locations
  - Travel Time between Demand and Facilities



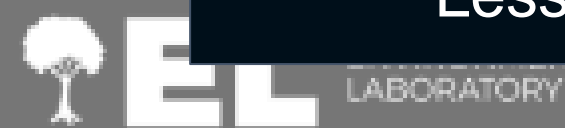
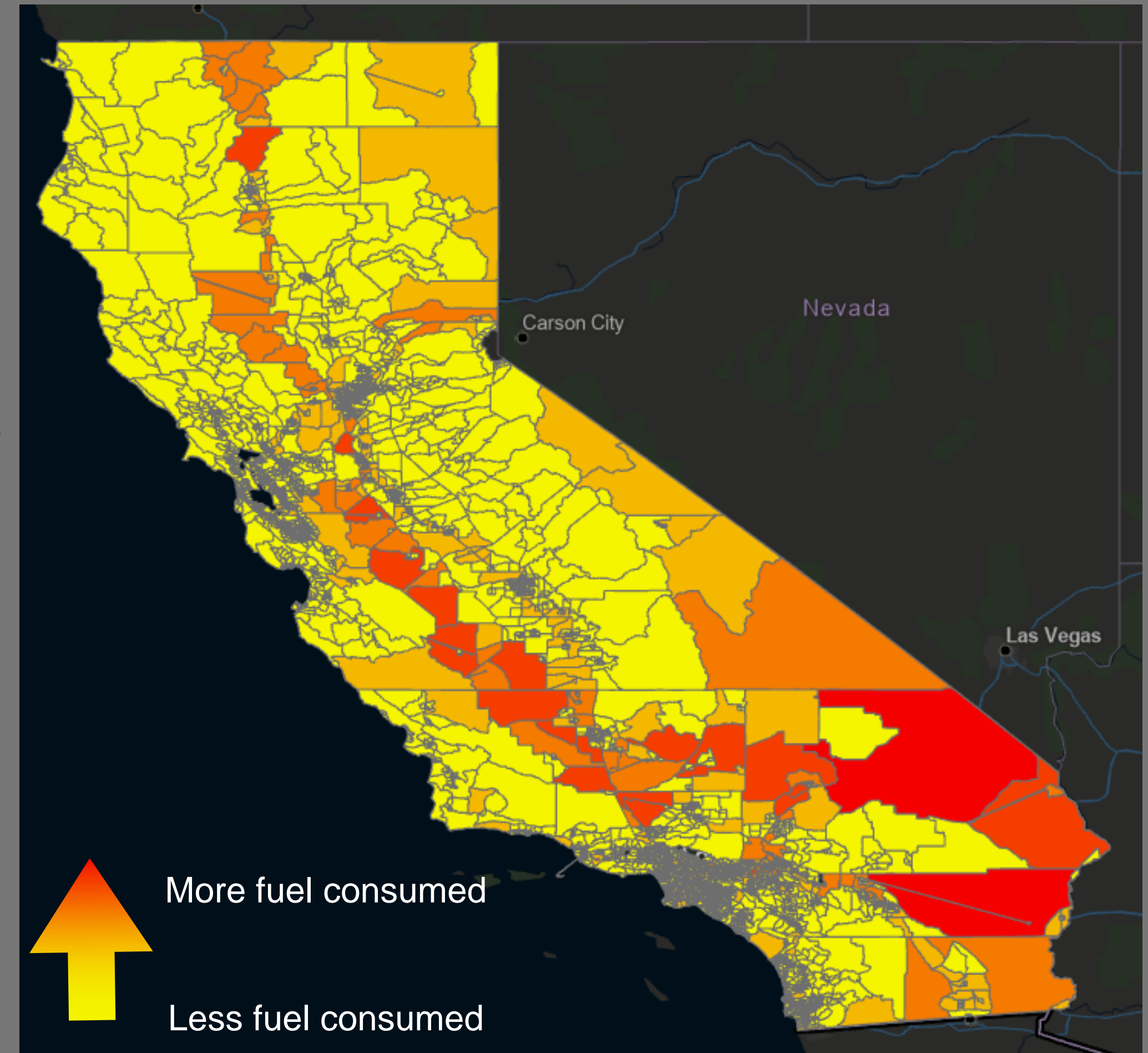
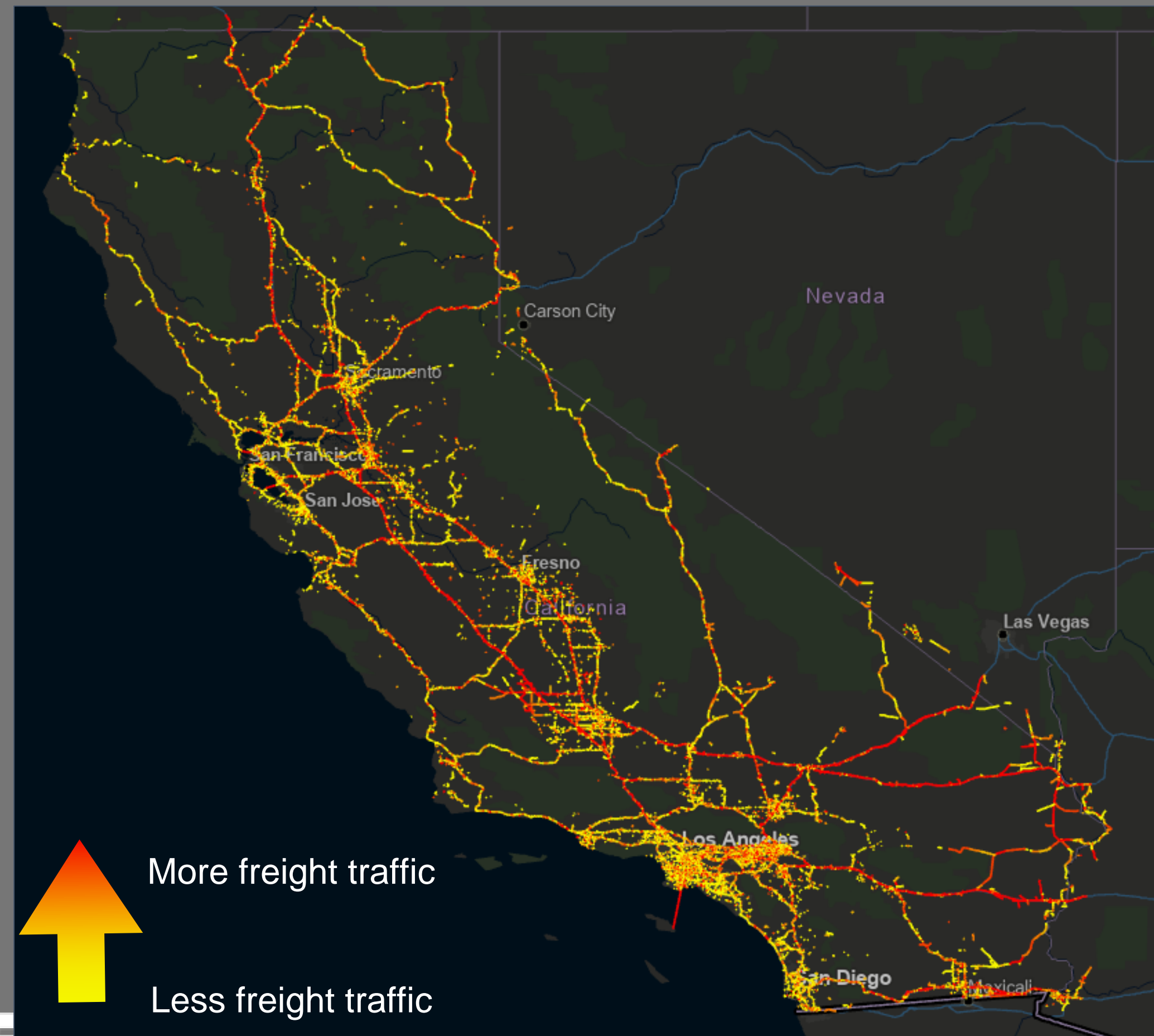
## II. Problem 2: Methodology

### Facility Location Problem

- Assigns **Demand** to **Facilities** such that an objective is minimized
- Objective = **Total Travel Time**
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  - Facility Locations
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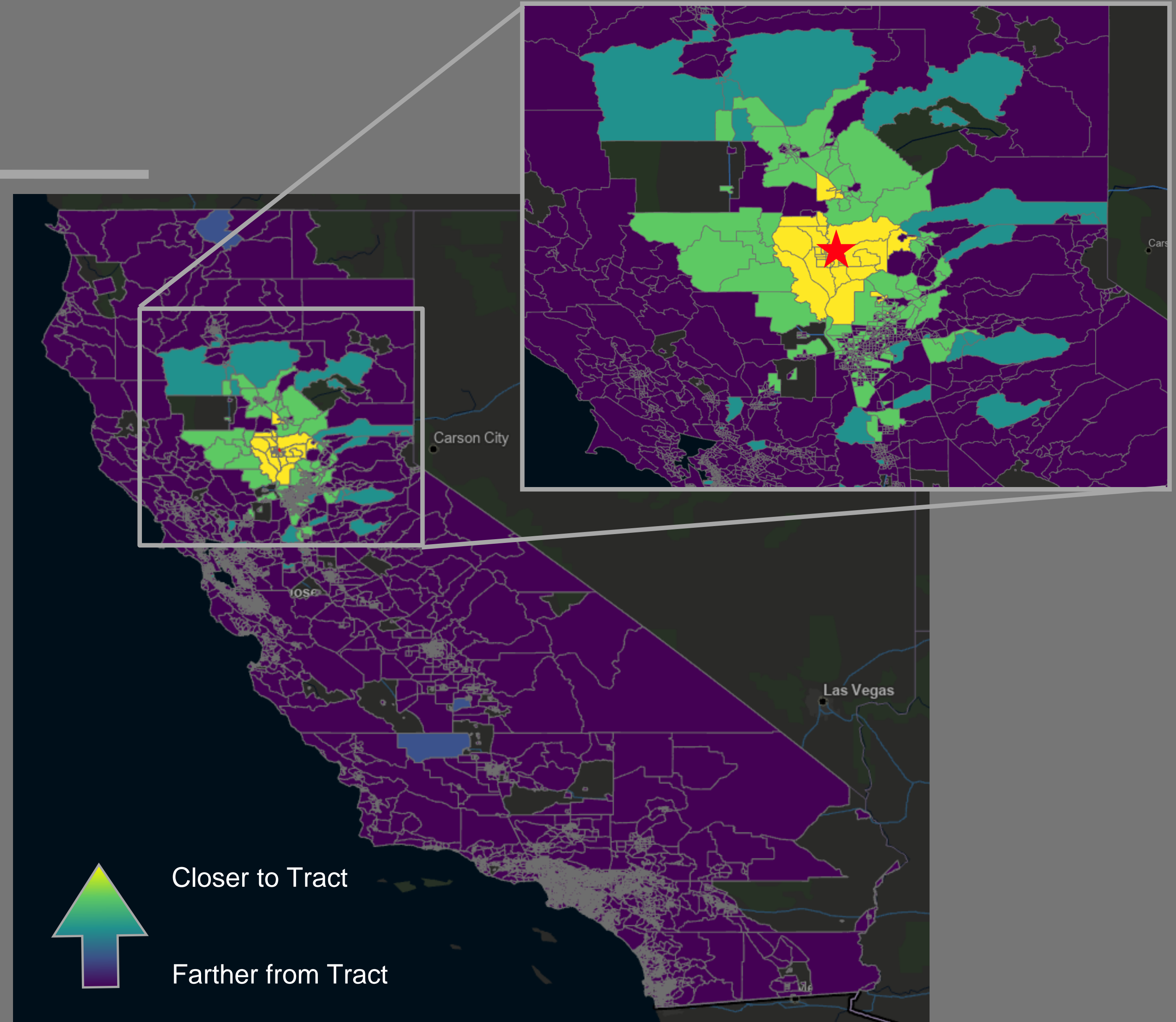
# II. Problem 2: Methodology Facility Location Problem



## II. Problem 2: Methodology

### Congestion Aware Travel Time

- **Distances:**  
Mean travel time between tracts from Replica freight trips data
- **Details:**
  - Trip data was used so that travel distances were 'congestion aware'
  - If no trips existed between blocks, travel time was set to 1 day



## II. Problem 2: Optimization Results: Candidate Locations

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



## II. Problem 2: Optimization Results: Quantifying Location Scalability

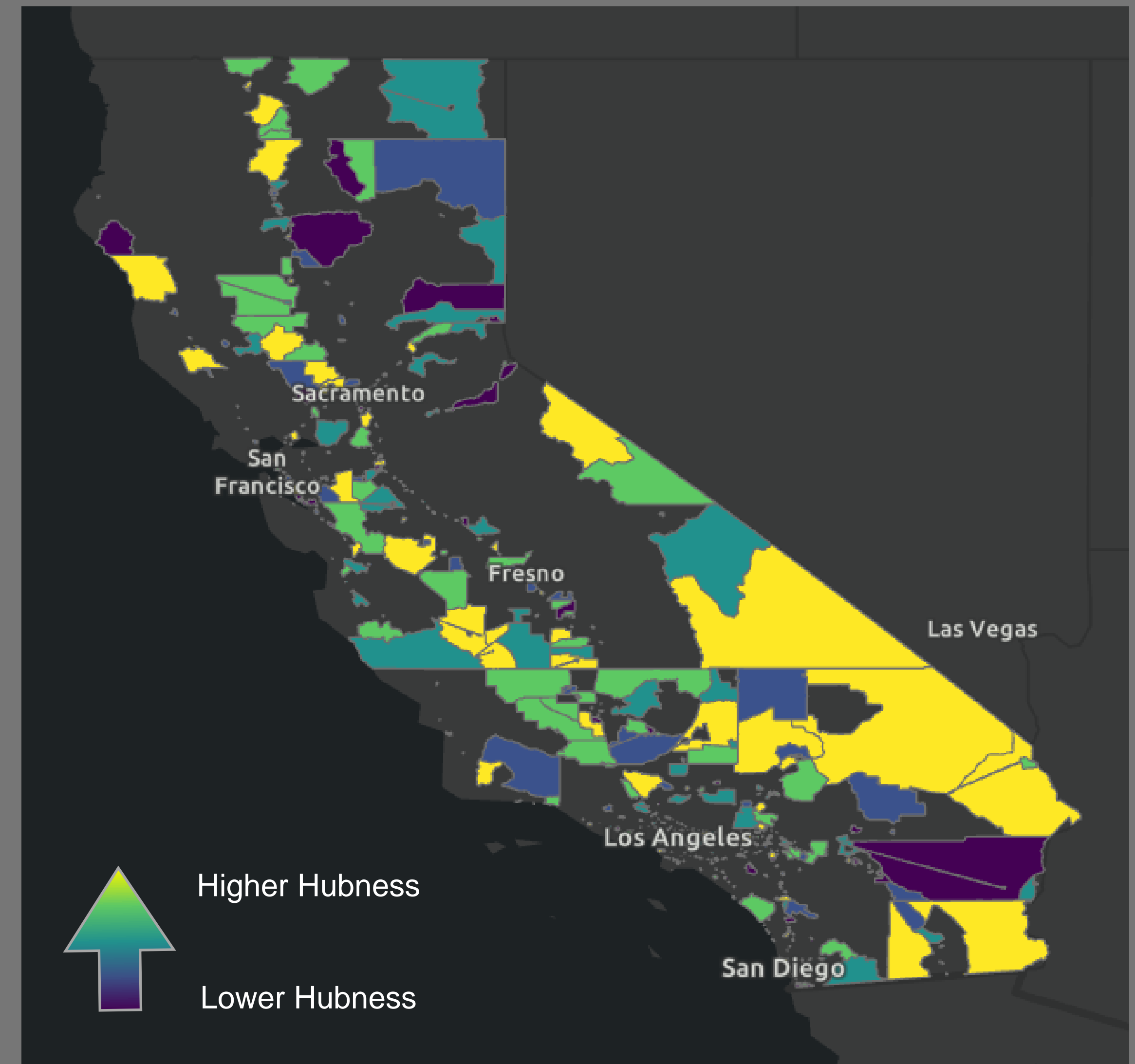
**Want:** Quantify the Scalability of Locations

**Solution:** Rank solutions by hubness

### Hubness:

1. Re-ran for sets of best (1, 2, ..., 500) stations
2. Count of how many sets contain any location

- High hubness = Scales well as more are added
- Probably in a good, central location





## II. Problem 2: Optimization Results: Quantifying Location Scalability

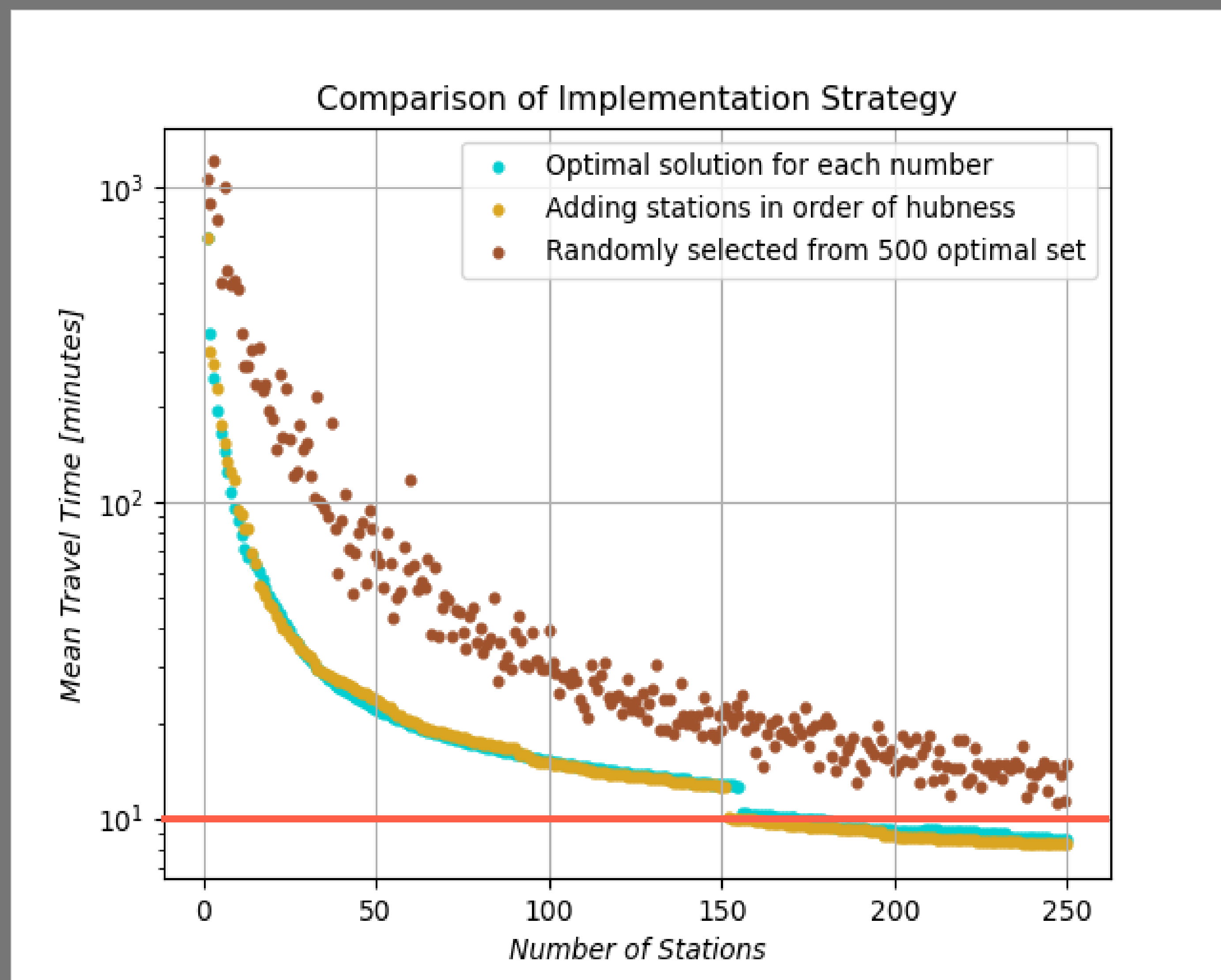
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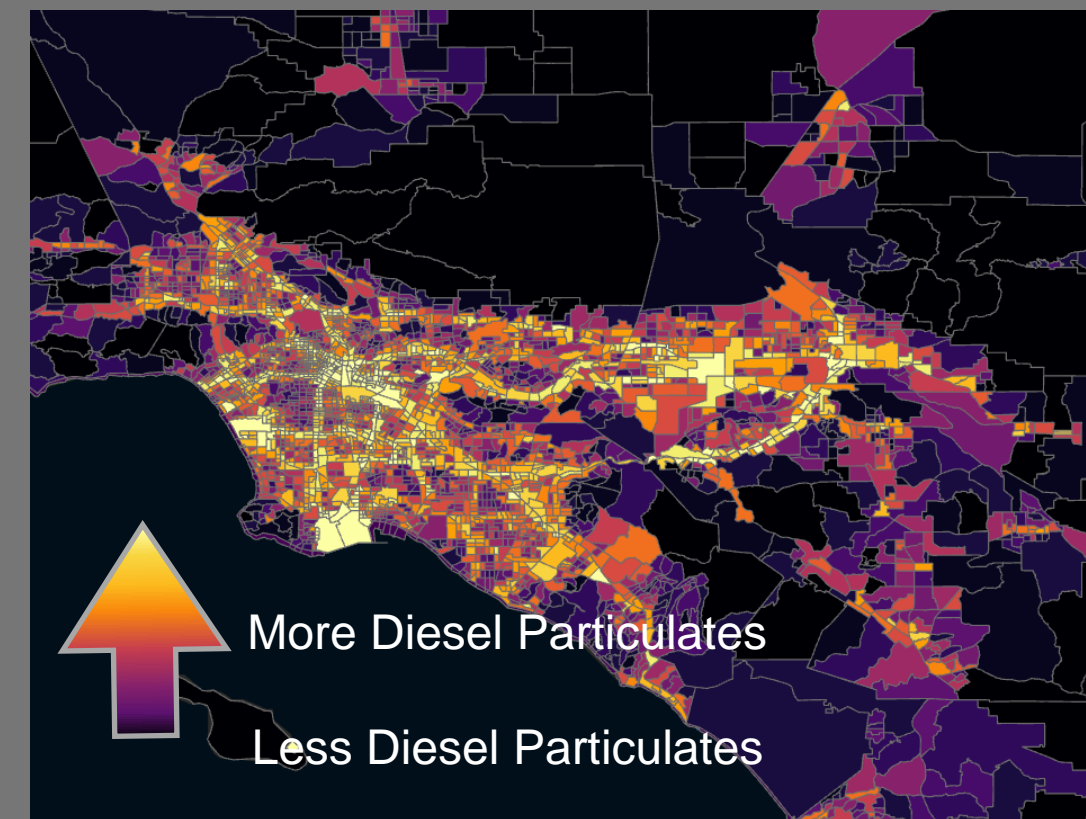
- High hubness = Scales well as more are added
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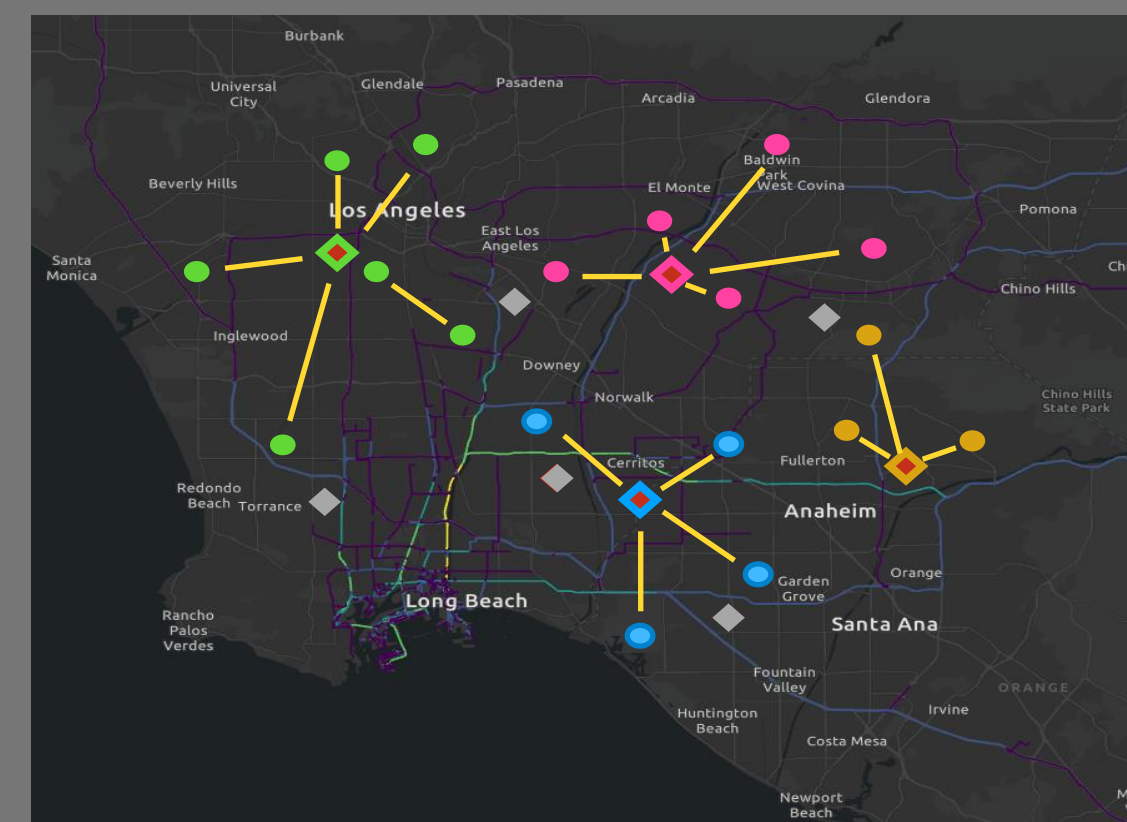
### III. Extensions: Multi-Objective Optimization

- **Examined Concerns:**  
Define a set of equity concerns which can be weighed against each other
- **Solution:**  
Preform Multi-Objective Optimization:
- Gets you a range of answers so decision makers can weight different options

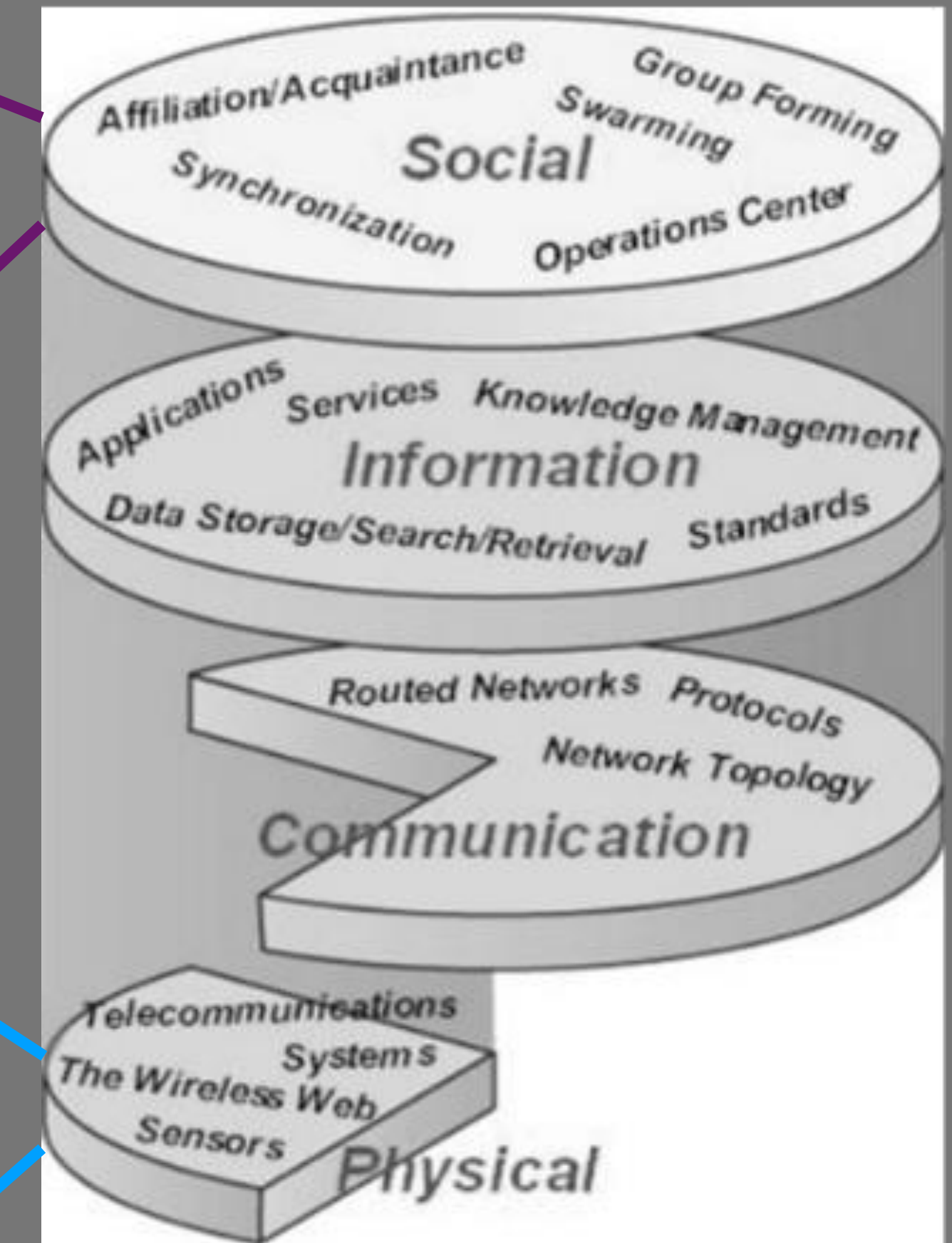
#### Model



CalEnviroScreen 4.0  
Diesel Particulate Matter - Percentage

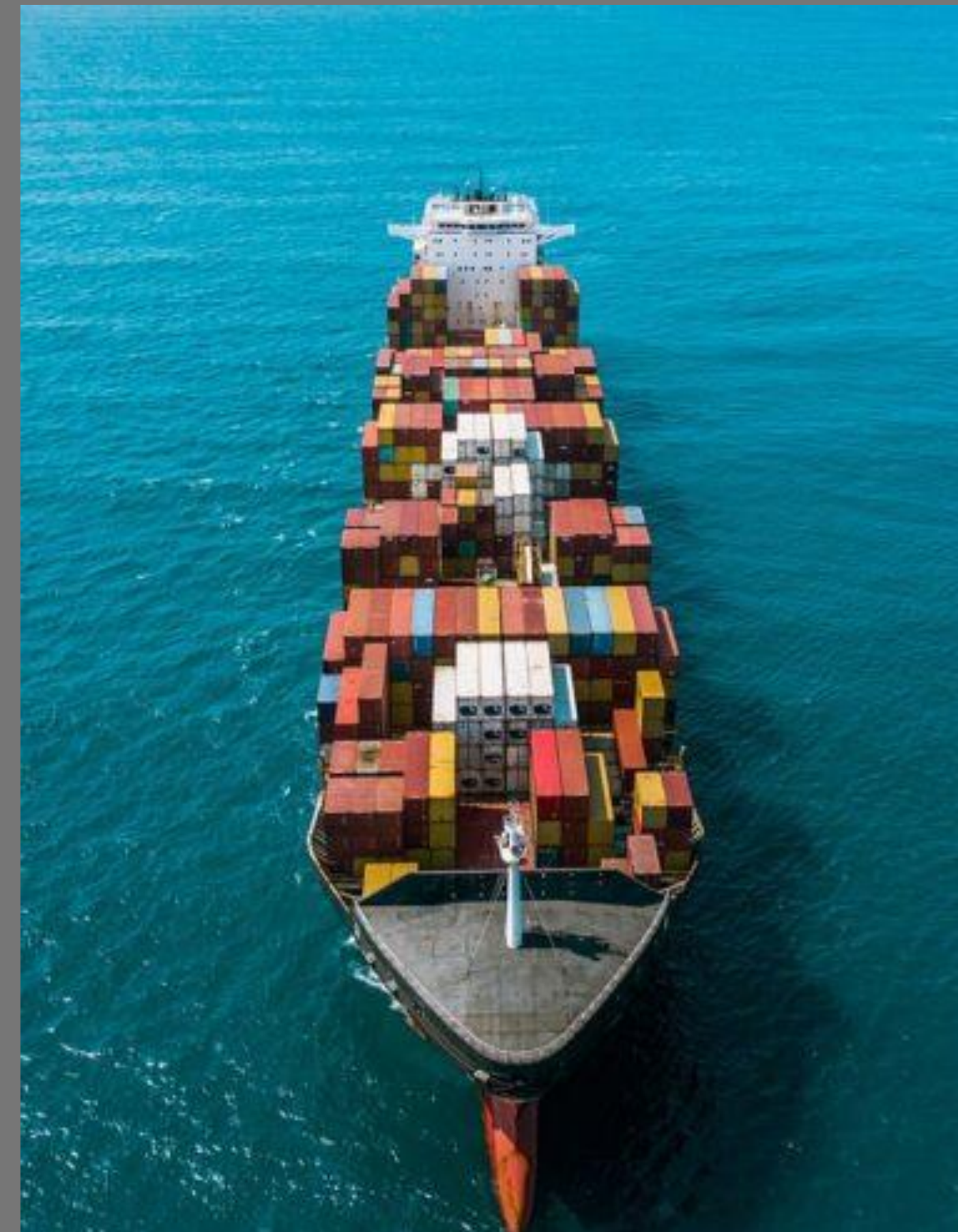


#### Real World

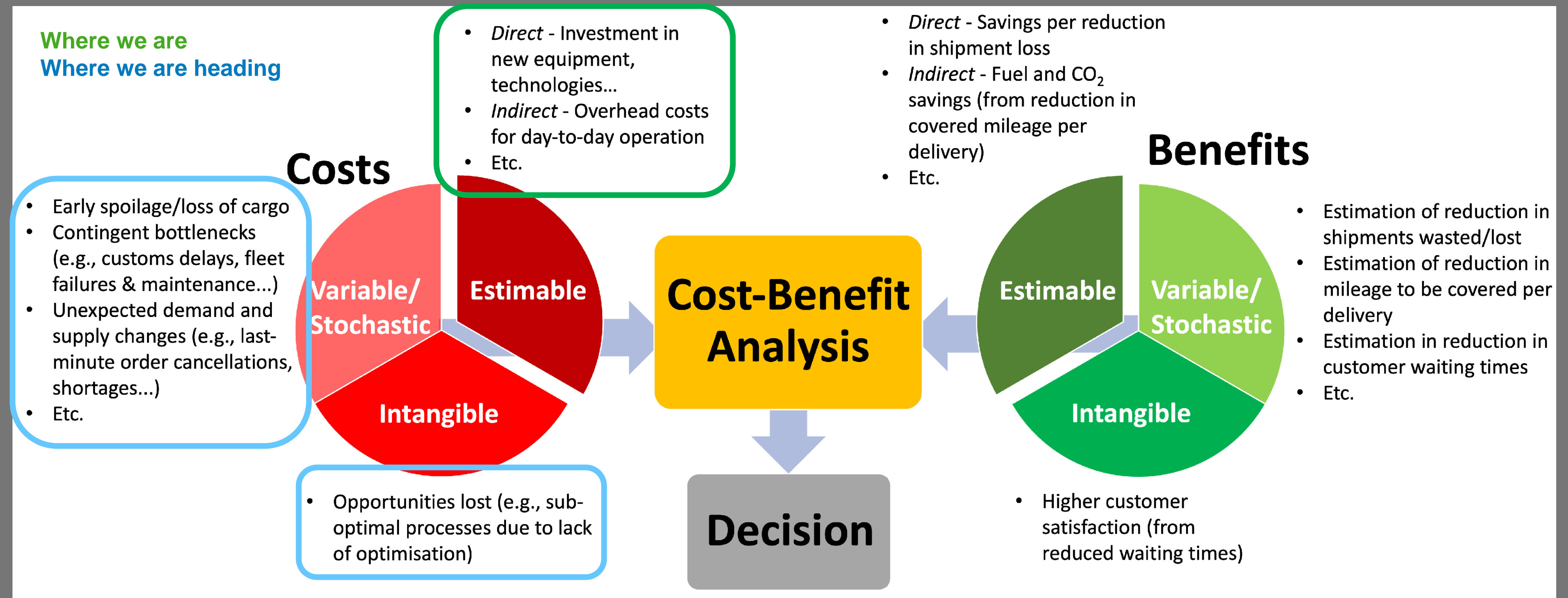


# Where are we? Where do we want to go?

- **Where we are at:**
  - Growing call for resilience
  - Transportation Systems can be modeled
  - A lot of focus is still on risk, not resilience
- **Challenges:**
  - Visibility
  - Multi-Domain Knowledge
  - Validation/Success is Hard to Measure



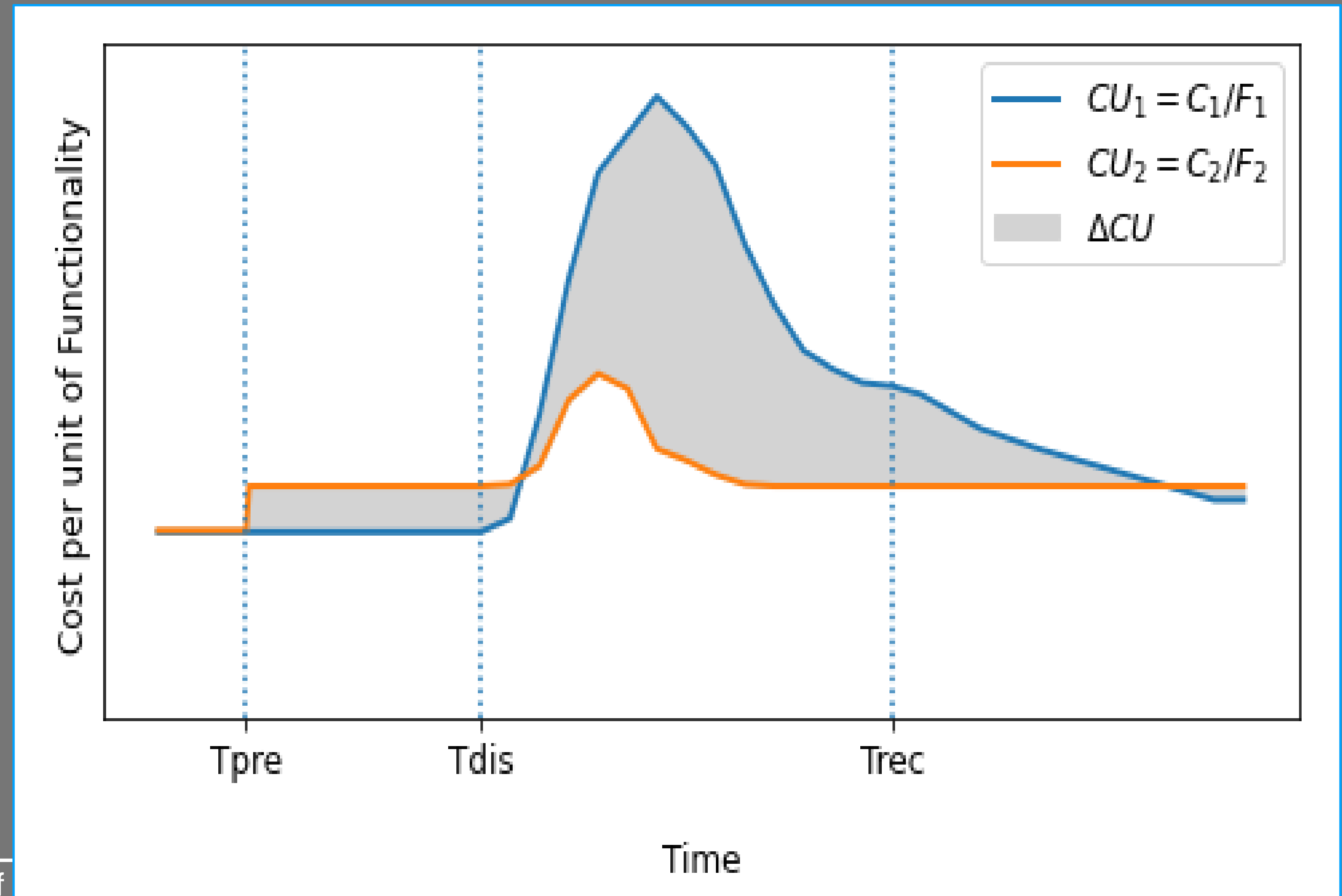
# Where are we? Where do we want to go?



# Where are we? Where do we want to go?

## Balancing Efficiency and Resilience

- Want to maximize functionality across time over time
- Requires estimating both known and unknown risks



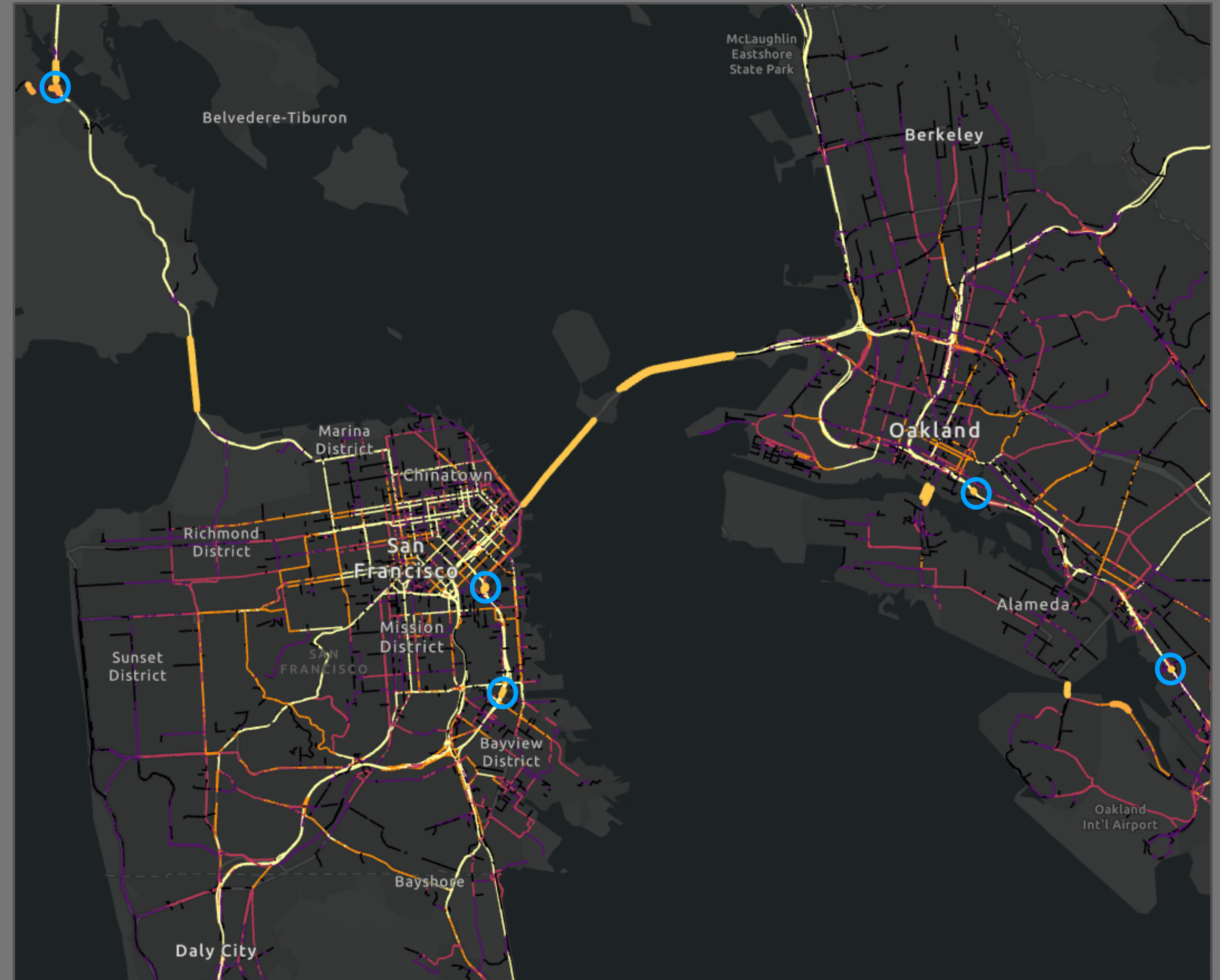
# Where are we? Where do we want to go?

## Summary:

- Resilience should be prioritized more
- Science emerging but needs to be developed
- We approach through data-driven, system-level modeling
- There are still challenges which need to be addressed:
  - Visibility
  - Multi-Domain Knowledge
  - Validation/Success is Hard to Measure

# Questions

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## IV. Additional Results: Natural Disaster Overlays

- Overlaying freight volumes with climate change vulnerabilities:
  - Wild Fires - Early 2045
  - **Result:** Near Stockton
    - N/S freight corridors are close
    - Near-term Fire Risk

