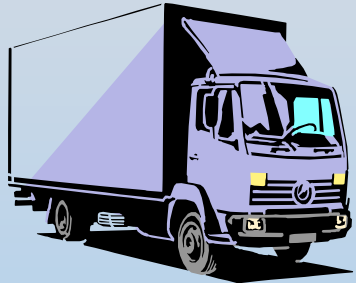


# **A Quick Look at Freight Flow Modeling in the United States**

**Frank Southworth**

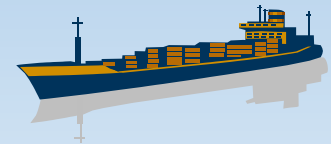
**Adjunct Principal Research Scientist  
School of Civil & Environmental Engineering  
Georgia Institute of Technology  
Atlanta, GA 30332  
USA**



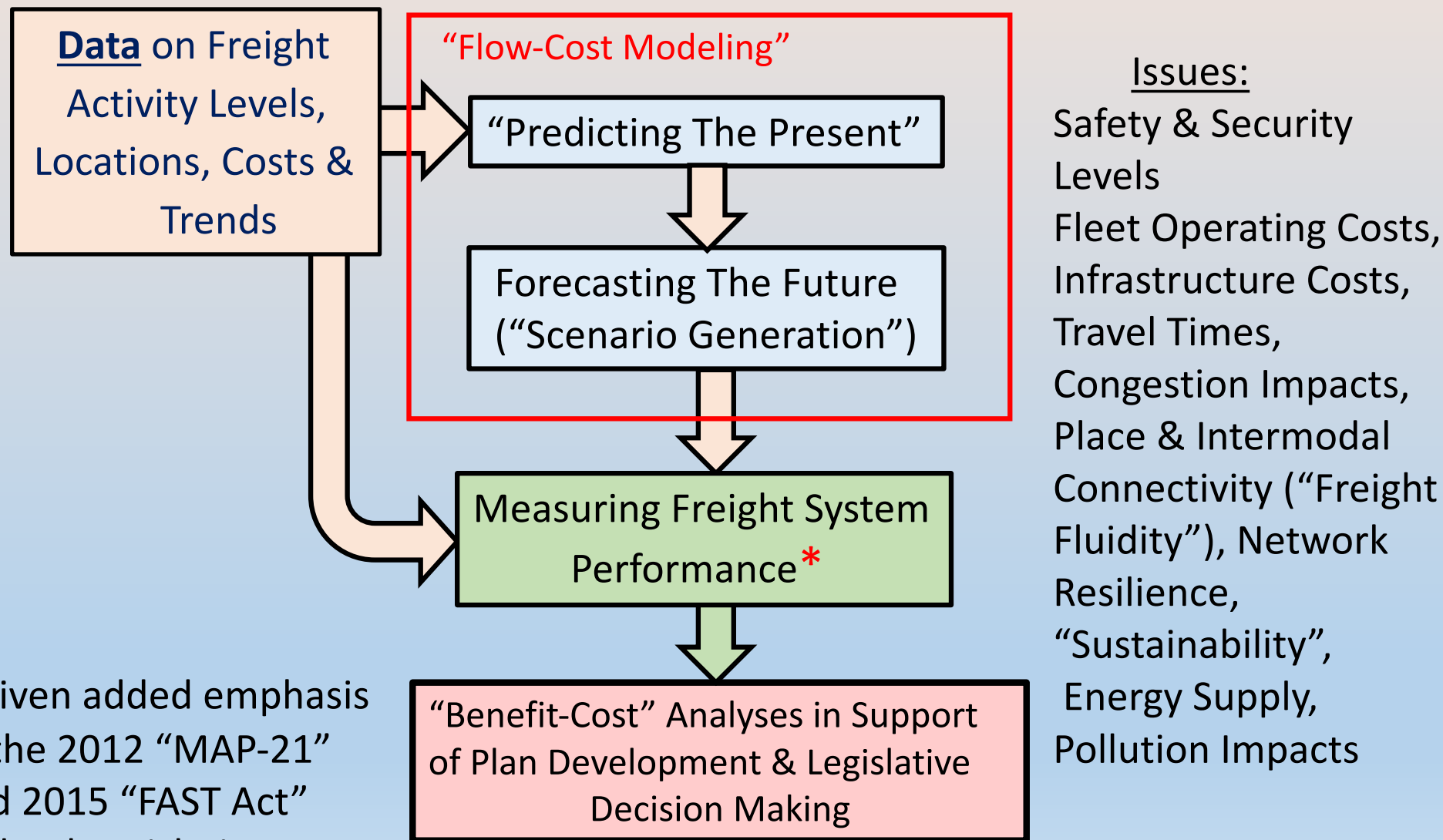
**European Colloquium on Theoretical & Quantitative Geography 2017  
Friday September 8<sup>th</sup>, York, England**

# Talk Outline

- Current Public Sector Freight Modeling Practice
- Modeling Concerns
- “Top Down” Modeling Approaches
- “Bottom Up” Modeling Approaches
- Concluding Comments



# 1) Public Planning Agency Freight Flow Modeling: Emphasis on Measuring & Assessing Freight System Performance

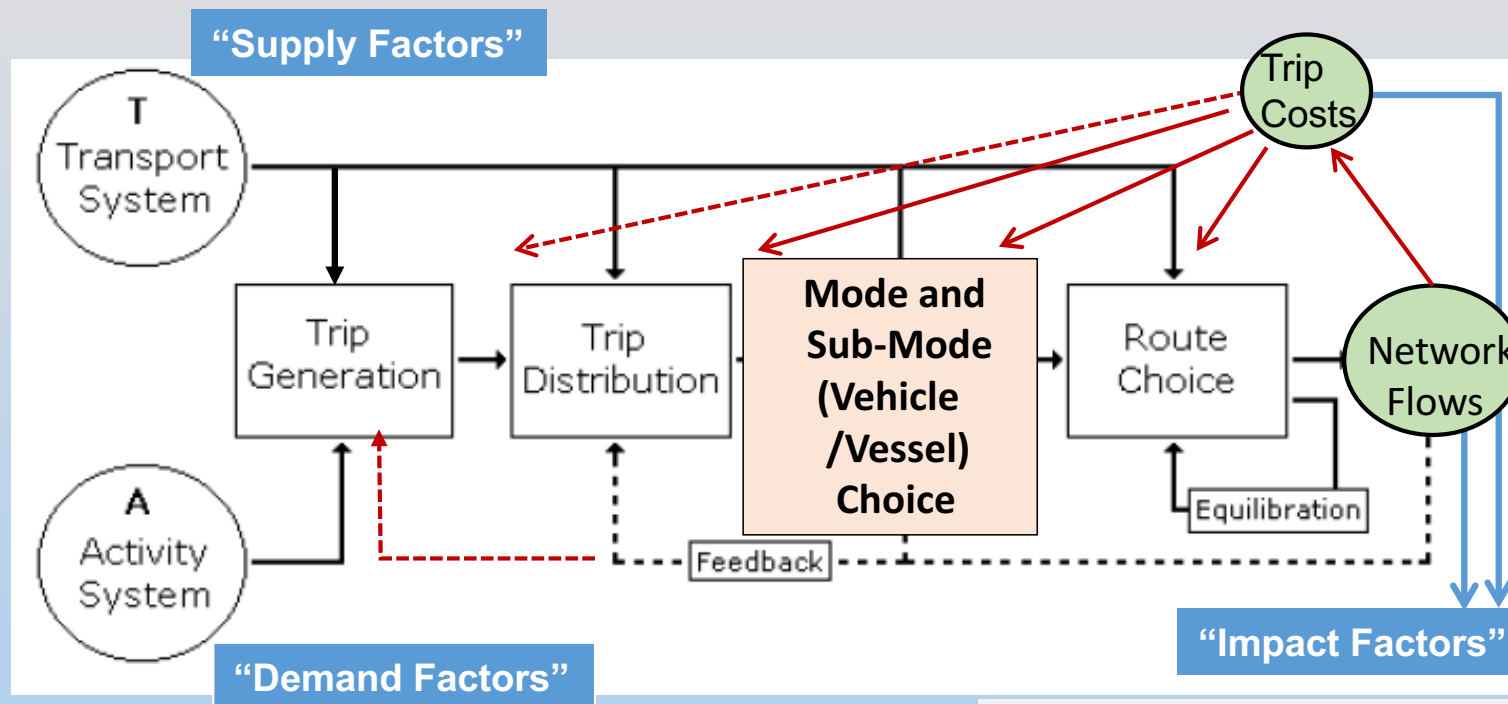


\* Given added emphasis in the 2012 "MAP-21" and 2015 "FAST Act" Federal Legislation

# FREIGHT PLANNING:

## Traditional “Four - Step” Model Framework Used by Many State DOTs & MPOs (modified)

Capacities Associated with: Vehicles/Vessels, Labor, Fuels, Infrastructure (Networks, Terminals, Distribution Centers), Communications Systems, Freight Regulations



Commodity Volumes Associated With:  
Industrial/Economic Activity, Demographics

Direct: Freight Rates, Emissions,  
Accidents, On-Time Service Reliability

## **2) Current Modeling Concerns**

### **1) Limitations of Public Data Sources (Sample Sizes):-**

- **Limited Spatial (O-to-D) Detail (for Planning Purposes)**
- **Limited Logistical Detail (Especially 'Representative' Freight Costs)**
- **Mode Specific Data 'Silos'**
  - ❖ **Intermodal Network (Cost) Modeling**

### **2) Limited Behavioral/Decision-Making Basis (Especially for Forecasting):-**

- **Freight Agent/Supply Chain Complexities**

### **3) Rapid Growth & Change in Freight Volumes & in How They Are Being Moved**

# Forecasting Challenges: Continued Rapid Growth in Freight Volumes, As Well as Some Significant Changes in Commodity Mix.

**FAF4 Baseline Scenario:** Using a 1.2% CAGR for **2012 to 2045** produces a total tonnage increase from 17 billion tons (\$22.8 trillion) in 2012 to 25.3 billion tons (\$37.1 trillion) in 2045 (**≈ 49% increase in tonnage, and 68% increase in value**).

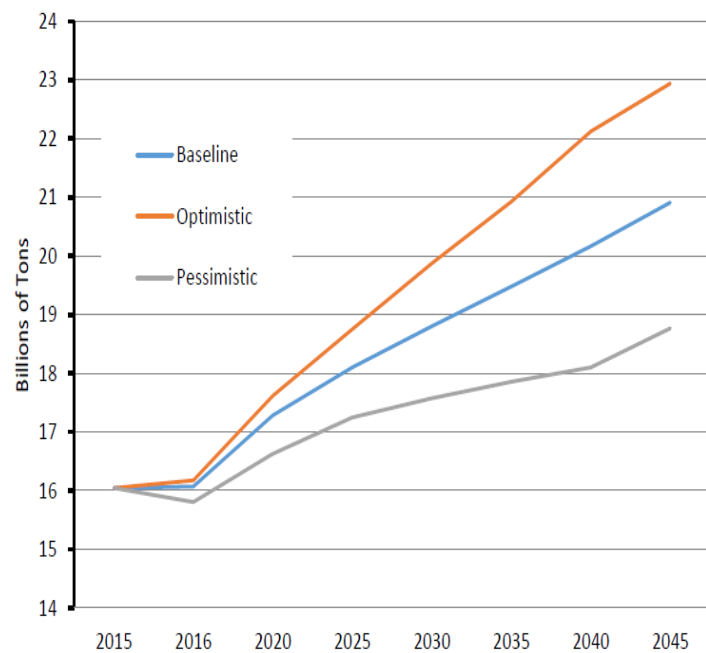
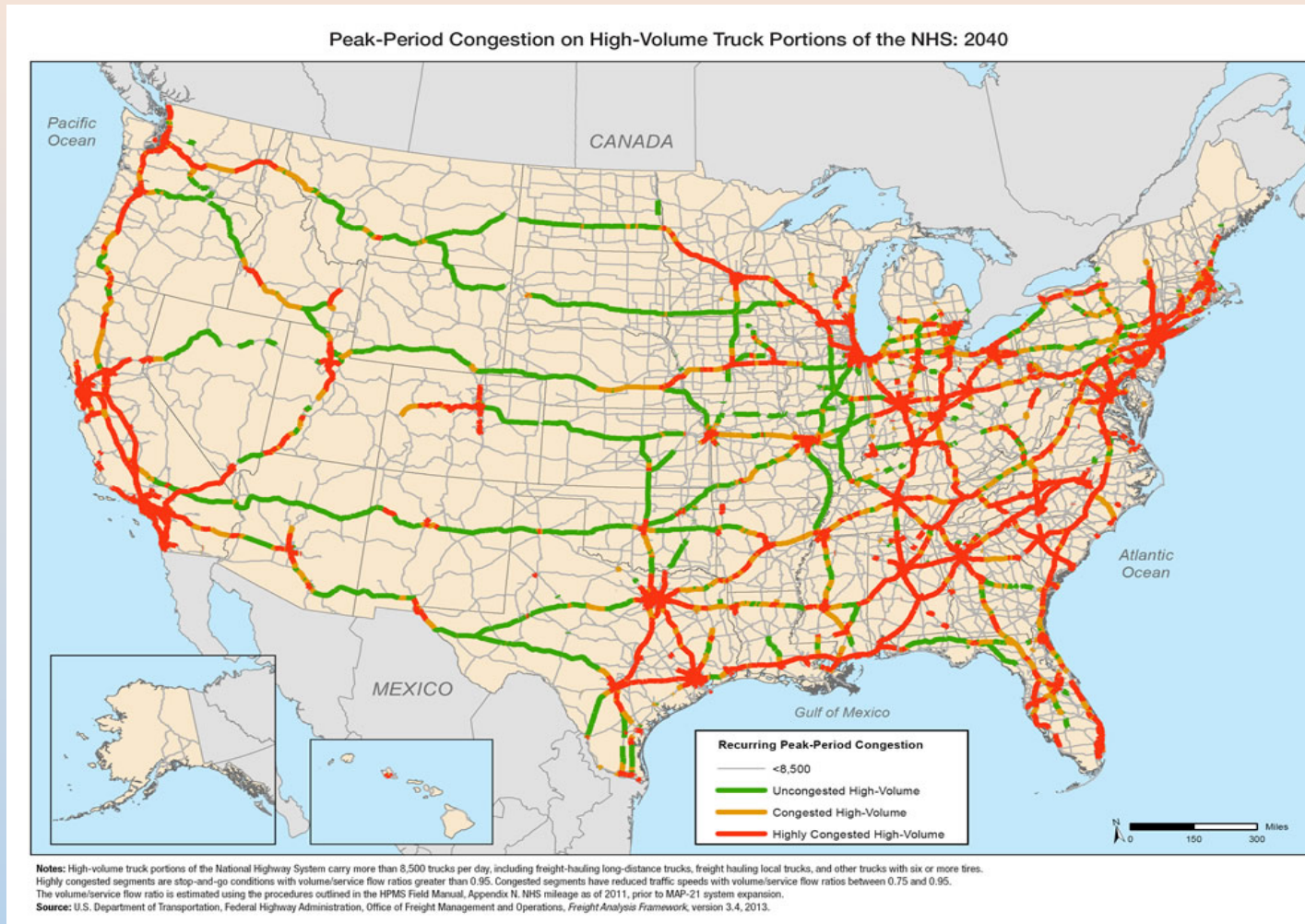


Figure 11. Graph Domestic Tonnages – Baseline, Optimistic, and Pessimistic Scenarios, 2015 – 2045



# Costs to the Trucking Industry of Highway Congestion



- \* **Estimated Annual Truck Ton-Miles: 2.0 trillion in 2015 -> 3.6 trillion in 2045 ( $\approx 74.8\%$  INCREASE).** [https://ops.fhwa.dot.gov/freight/freight\\_analysis/nat\\_freight\\_stats/](https://ops.fhwa.dot.gov/freight/freight_analysis/nat_freight_stats/)
- \* **Estimated trucking industry congestion tops \$63.4 Billion in 2015, with over 996 million hours of lost productivity. (ATRI Insider , Vol 13.1, August 2017). For a truck driven 100,000 mi. a year this equates to an average annual congestion cost of \$22,676 (approx. \$0.23/Vehicle Mile Travelled).**

# Current Status of Freight Flow Data For Analysis Purposes

**“Currently, public sector freight decision-making is largely reliant on datasets that are incomplete, outdated, insufficient, too highly aggregated to permit localized analyses, or simply unavailable”.**

**(FHWA Freight Operations Research & Development (R&D) Plan Webinar, July 30, 2015)**

**And what data is available is delivered in a variety of largely mode-specific and agency specific reporting styles and metrics**

**Problem Statement:**

**How do we overcome these limitations?**



# 3) “Top Down” Freight Flow Modeling Approaches

National (inc. Intercity & Interstate) & International Flows

Statewide Freight Flows

High Volume Freight Corridor Flows

Metropolitan Area-wide Flows

Intra-City or -County Flows

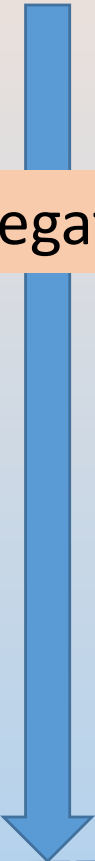
Location (including Facility)-Specific Flows

Disaggregations

Data Driven Log-Linear Modelling with Gap Filling (FAF)

Interregional Input-Output (I-O) Modeling

Direct Demand (DD) and Structural Equation Modeling (SEM)

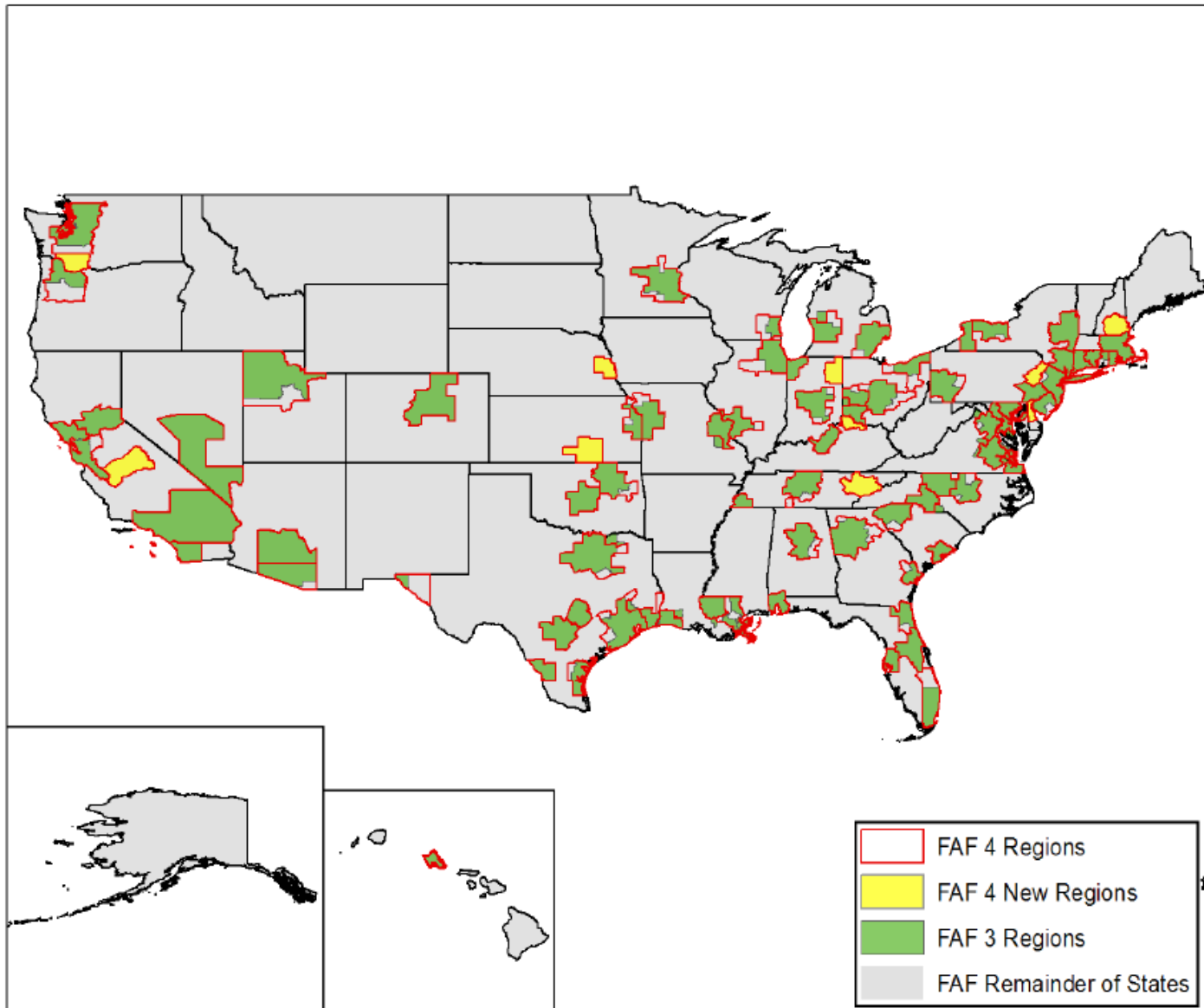


# High Level FAF (Nationwide) Freight Flow Data & Estimation Process\*

US Commodity  
(CFS) (1993,  
2007, 2012  
Sampled Data

## Out-of-Scope Flow Data

(Various Carrier  
Administrative  
Commodity or  
Specific Data Sources  
(Farm-based and  
Fishery, Logging  
Natural Gas, Chemical  
Materials and  
Municipal Solid Waste  
Household/Business  
Retail, Service  
Trades, International Air Trades,  
Waterborne Commerce Trades



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3,277,024 data cells  
**Freight Flow Matrix**

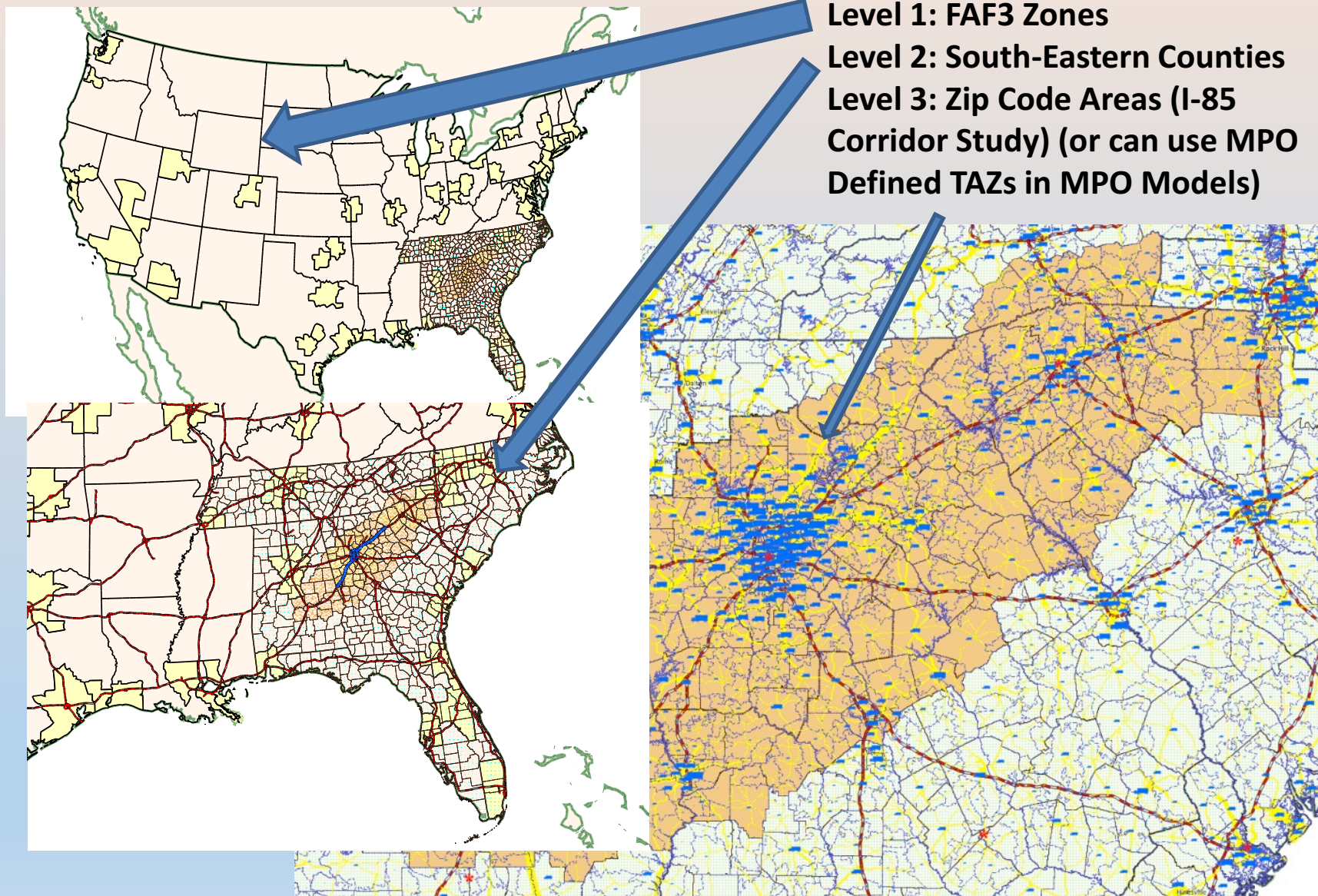
\* See ORNL/TM-2016/489 "Building the FAF4 regional Database: Data Sources and Estimation Methods

**In Practice A combination of log-linear modeling (LLM) and iterative proportional fitting (IPF) was Used in FAF3 to Fill In Missing Flow Cell Values:**

$$\begin{aligned} \ln(F^{\text{ODCMUS}}) = & \lambda_0 + \lambda^{\text{O}} + \lambda^{\text{D}} + \lambda^{\text{M}} + \lambda^{\text{C}} + \lambda^{\text{U}} + \lambda^{\text{S}} + \lambda_j^{\text{OD}} + \lambda^{\text{OC}} + \lambda^{\text{OM}} \\ & + \lambda^{\text{OU}} + \lambda^{\text{DC}} + \lambda^{\text{DM}} + \lambda^{\text{DU}} + \lambda^{\text{CM}} + \lambda^{\text{CU}} + \lambda^{\text{MU}} + \lambda^{\text{OS}} + \lambda^{\text{DS}} + \lambda^{\text{CS}} + \\ & \lambda^{\text{MS}} + \lambda^{\text{US}} + \lambda^{\text{ODC}} + \lambda^{\text{ODM}} + \lambda^{\text{ODU}} + \lambda^{\text{OCM}} + \lambda^{\text{OCU}} + \lambda^{\text{OMU}} + \lambda^{\text{DCM}} + \lambda^{\text{DCU}} \\ & + \lambda^{\text{DMU}} + \lambda^{\text{CMU}} + \lambda^{\text{ODS}} + \lambda^{\text{OCS}} + \lambda^{\text{OMS}} + \lambda^{\text{OUS}} + \lambda^{\text{DCS}} + \lambda^{\text{DMS}} + \lambda^{\text{DUS}} + \\ & \lambda^{\text{CMS}} + \lambda^{\text{CUS}} + \lambda^{\text{MUS}} + \lambda^{\text{ODCM}} + \lambda^{\text{ODCU}} + \lambda^{\text{ODCS}} + \lambda^{\text{ODMU}} + \lambda^{\text{ODMS}} + \lambda^{\text{ODUS}} \\ & + \lambda^{\text{OCMU}} + \lambda^{\text{OCMS}} + \lambda^{\text{OCUS}} + \lambda^{\text{OMUS}} + \lambda^{\text{DCMU}} + \lambda^{\text{DCMS}} + \lambda^{\text{DCUS}} + \lambda^{\text{DMUS}} + \\ & \lambda^{\text{CMUS}} + \lambda^{\text{ODCMU}} + \lambda^{\text{ODCMS}} + \lambda^{\text{ODMUS}} + \lambda^{\text{ODCUS}} + \lambda^{\text{OCMUS}} + \lambda^{\text{DCMUS}} + \\ & \lambda^{\text{ODCMUS}} \end{aligned}$$

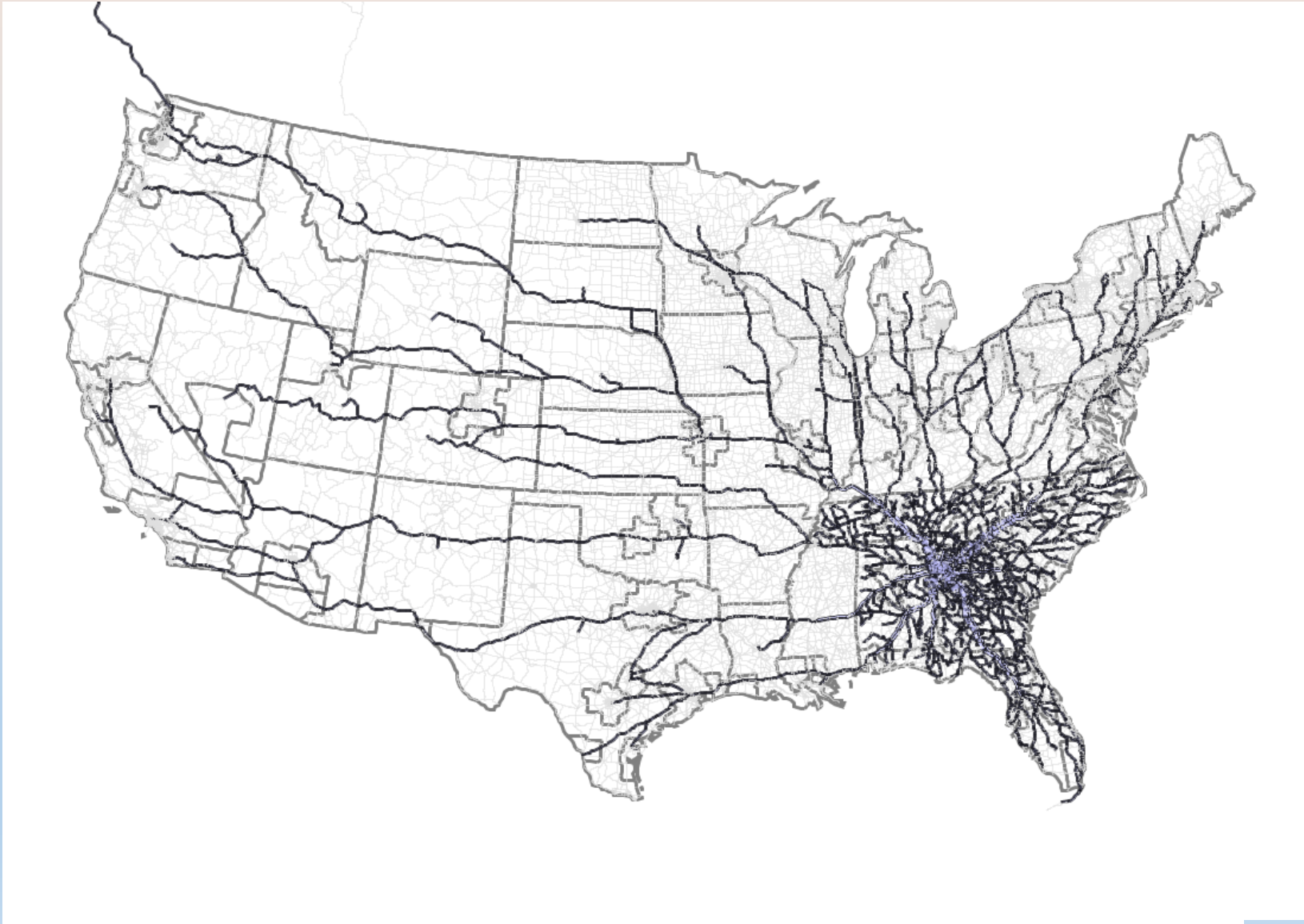
where  $\lambda^{\text{O}}$  = origin O effect ;  $\lambda^{\text{D}}$  = destination D effect;  $\lambda^{\text{M}}$  = mode M effect;  $\lambda^{\text{C}}$  = commodity class C effect;  $\lambda^{\text{U}}$  = unit of measurement effect (tons, \$ values);  $\lambda^{\text{S}}$  = a data source effect, and  $\lambda_j^{\text{OD}} +$  = an origin-mode effect, etc... and  $\lambda_0$  = a “grand mean” scaling parameter.

# Example FAF-Based Hierarchical Freight Traffic Analysis Zoning (TAZ) System\*



\* F. Southworth and D. A. Smith. (2016) *Estimating the Monetary Benefits of Reducing Delays on a Heavily Trafficked Truck Freight Corridor*

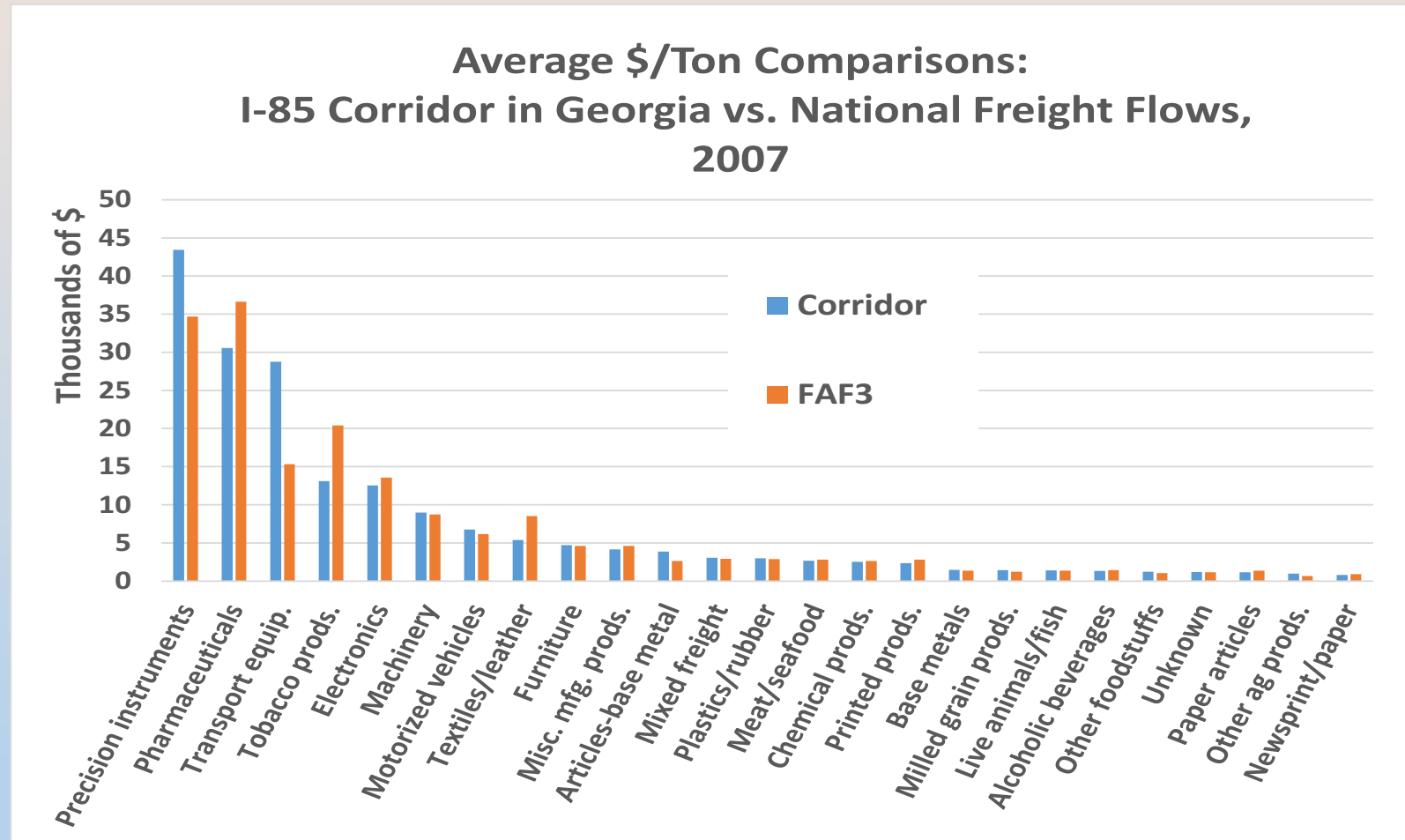
## Example Mapping of 2007 Truck Flows That Use I-85/I-285 within Georgia\*



\* F. Southworth and D. A. Smith. (2016) *ibid.*

# Example Freight Flow Modeling Outputs\*:

Corridor vs Statewide and Corridor vs National Comparisons



**Using A Multi-Class, Origin User Equilibrium Assignment Model and a Select Link Analysis**  
to convert and assign O-D-C Flows to Truck Trips over the U.S. Highway Network

\* F. Southworth and D. A. Smith. (2016) *ibid.*

## 4) “Bottom Up” Freight Flow Modeling Approaches

Some Recent (and Increasingly Related) Trends:

- Agent-Based (Decision-Maker Oriented) Freight Demand Modeling
- Supply Chain Logistics (Especially Logistics Cost) Modeling
- Microsimulation and Re-Aggregation of Individual Freight Moves  
Including:
  - ❖ Multi-Stop, Tour Based Urban Goods Movements
  - ❖ Long-Haul Intermodal Deliveries, **with First Mile- Last Mile** Details
- Use of Non-Intrusive, IT-Based (GPS, Cellular, RFIDs, Bar Codes....)

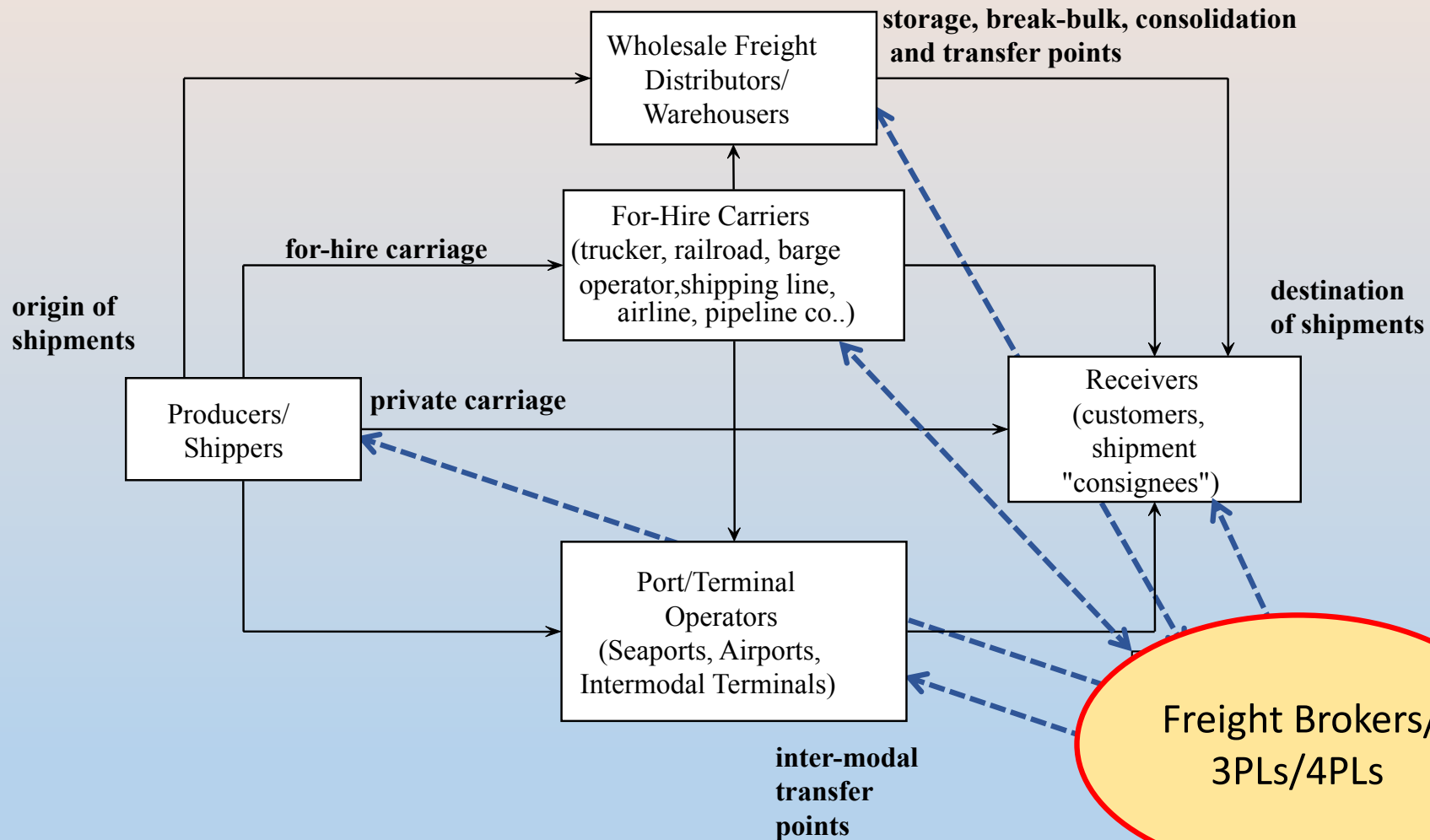
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- Use of Non-Intrusive, IT-Based (GPS, Cellular, RFIDs, Bar Codes....) Data Sources (e.g. for validation purposes)



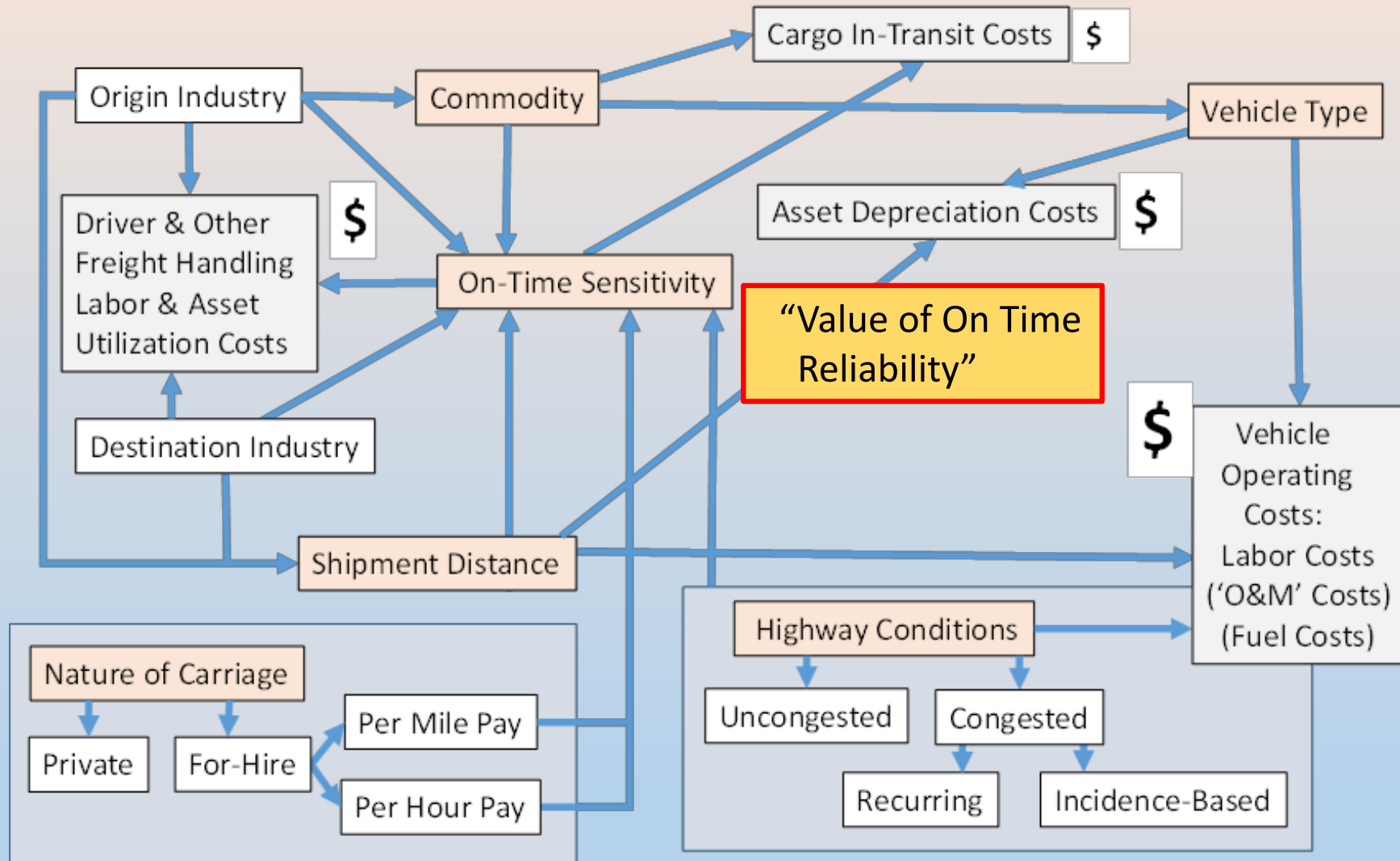
# Freight Agents Involved in The Supply Chain (+ Who/How Should We Survey?)



→ physical movements of freight (directional)

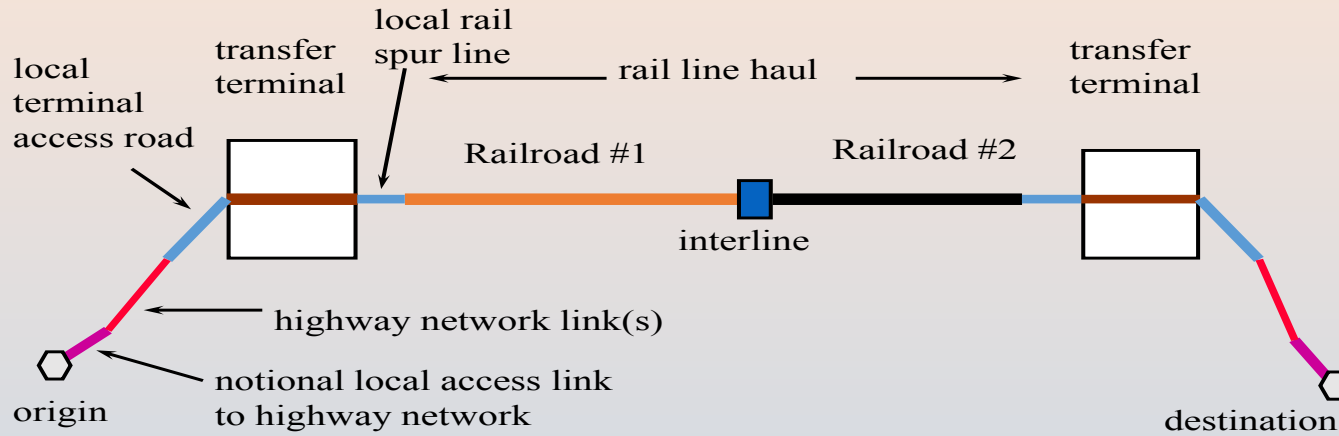
↔ Information flows (bi-directional)

# Example Estimation of Freight “Value of Time Costs”\*



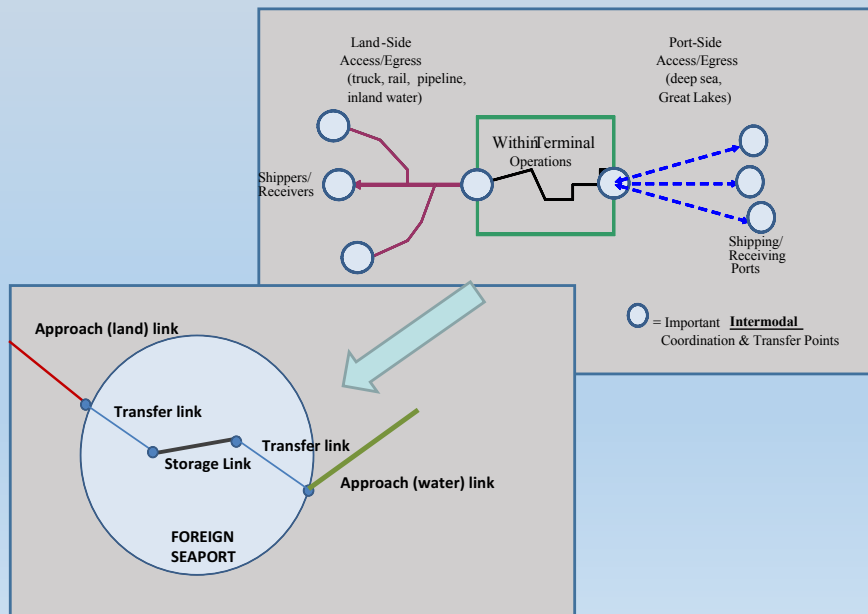
\* F. Southworth (2016) *A Review of Truck Freight Value of Travel Time and Travel Time Reliability Studies*

# Example Long-Haul **Intermodal** Network Data Model Structures

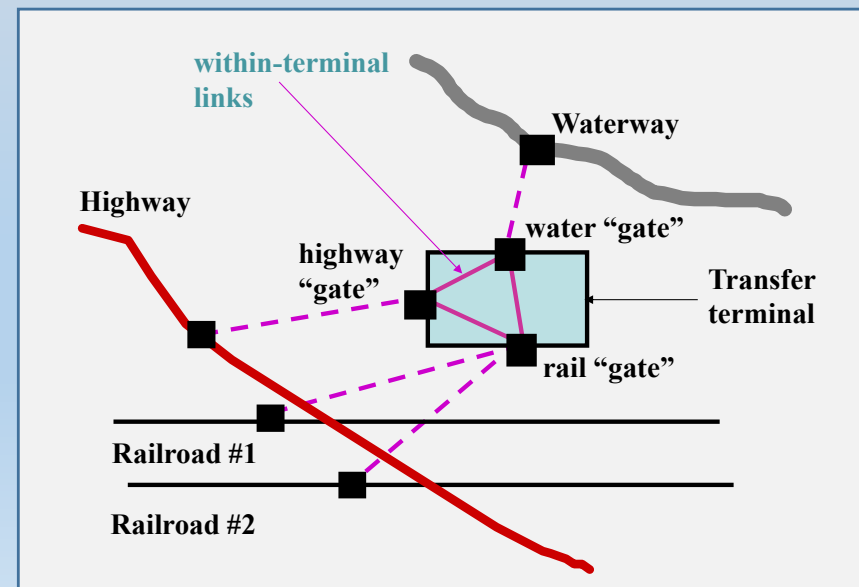


Route Impedance = modal line-haul travel costs  
 + intra-terminal transfer costs  
 + inter-carrier (interlining) costs  
 + local network access and egress costs  
 + network-to-terminal local access costs

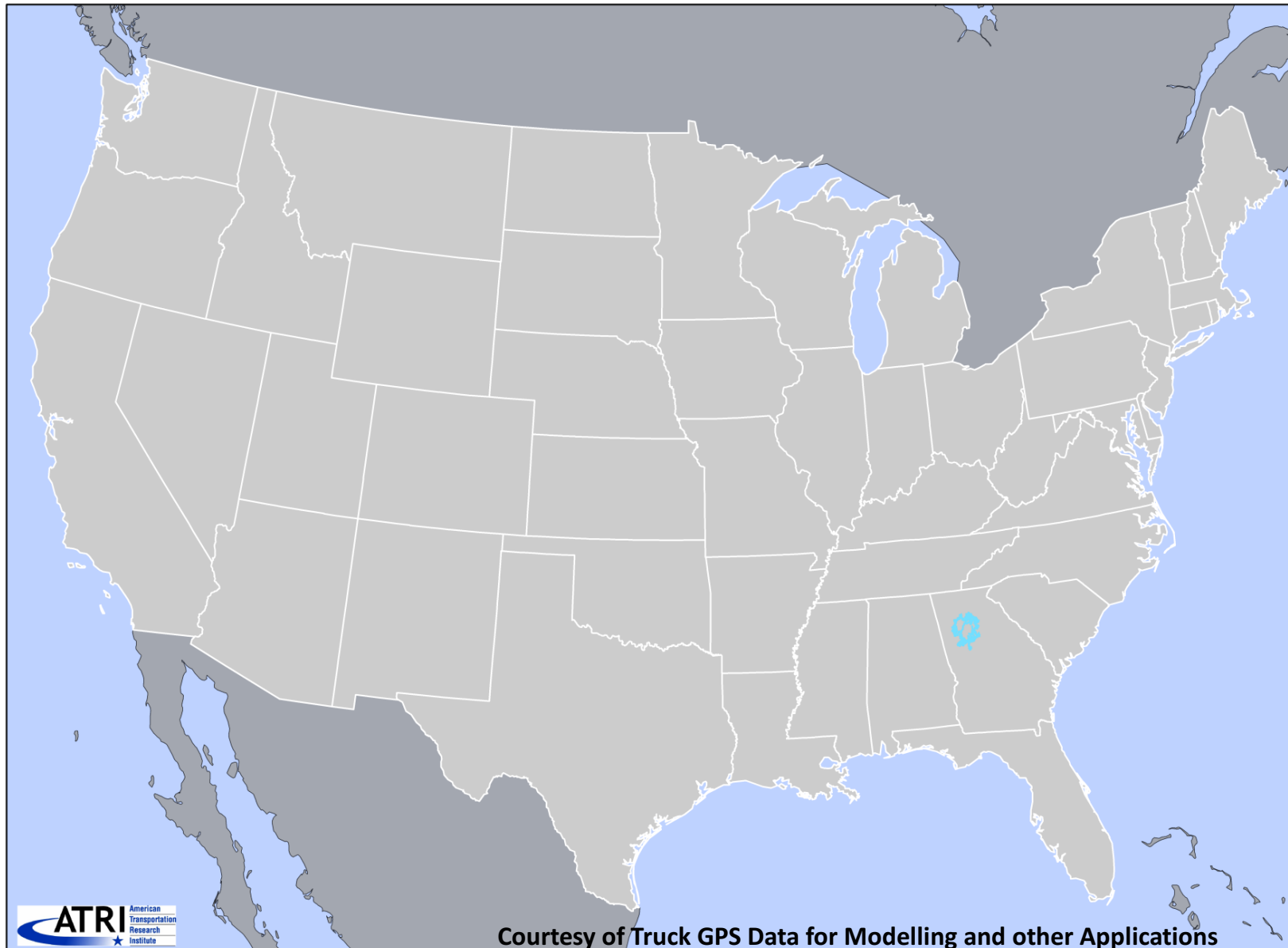
## Example of Modeling Seaport Throughput Flows and Costs



## Example of Modeling Inland Intermodal Terminals Flows



# How Can We Make Use of GPS and Other Non-Intrusive Survey Data? Atlanta 2,000 ATRI Truck Sample



Courtesy of Truck GPS Data for Modelling and other Applications

Jeff Short American Transportation Research Institute (ATRI)

August 25, 2017, Atlanta Regional Commission Modelling Group

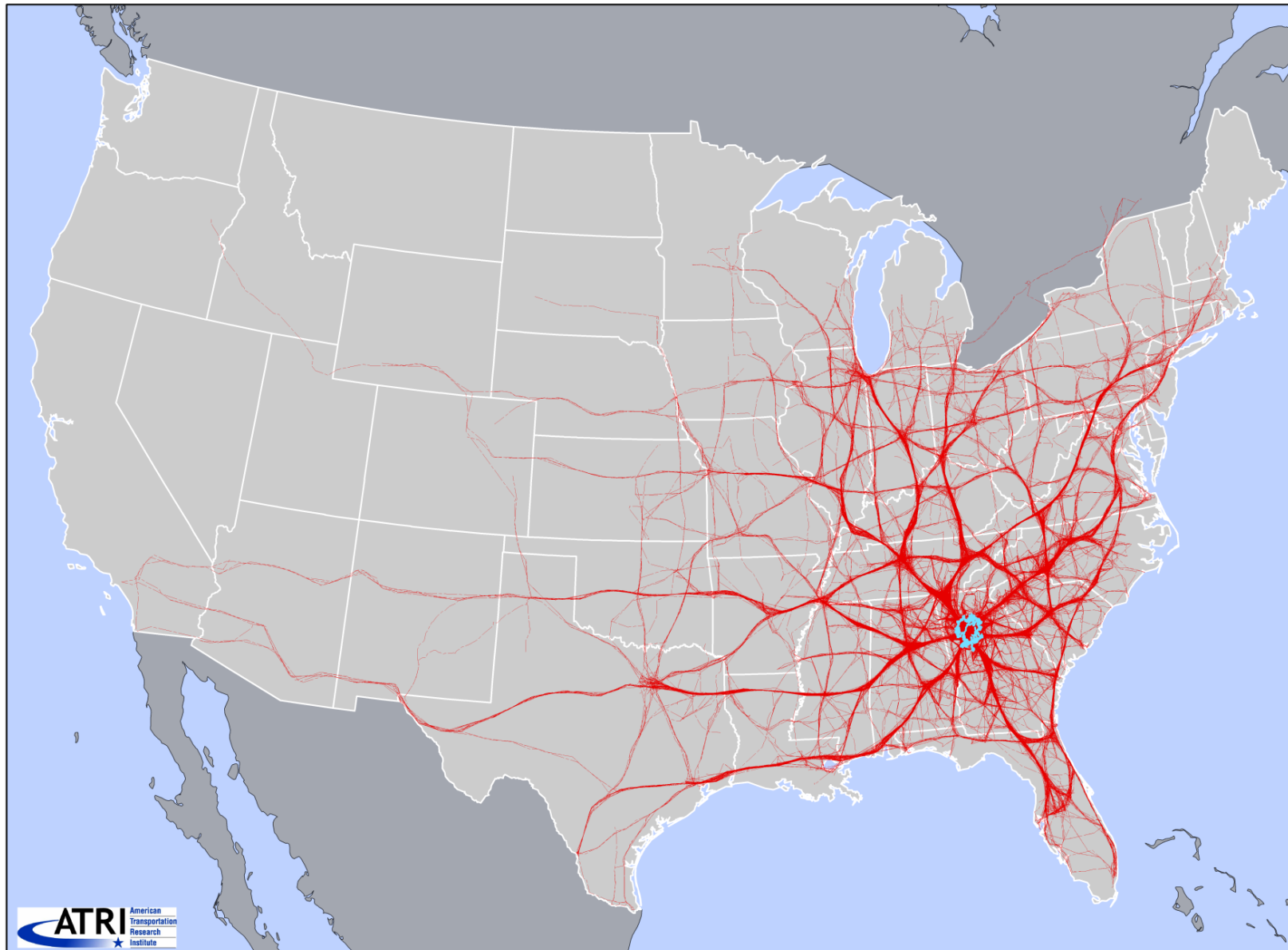
# Same 2,000 Trucks After 24 Hours



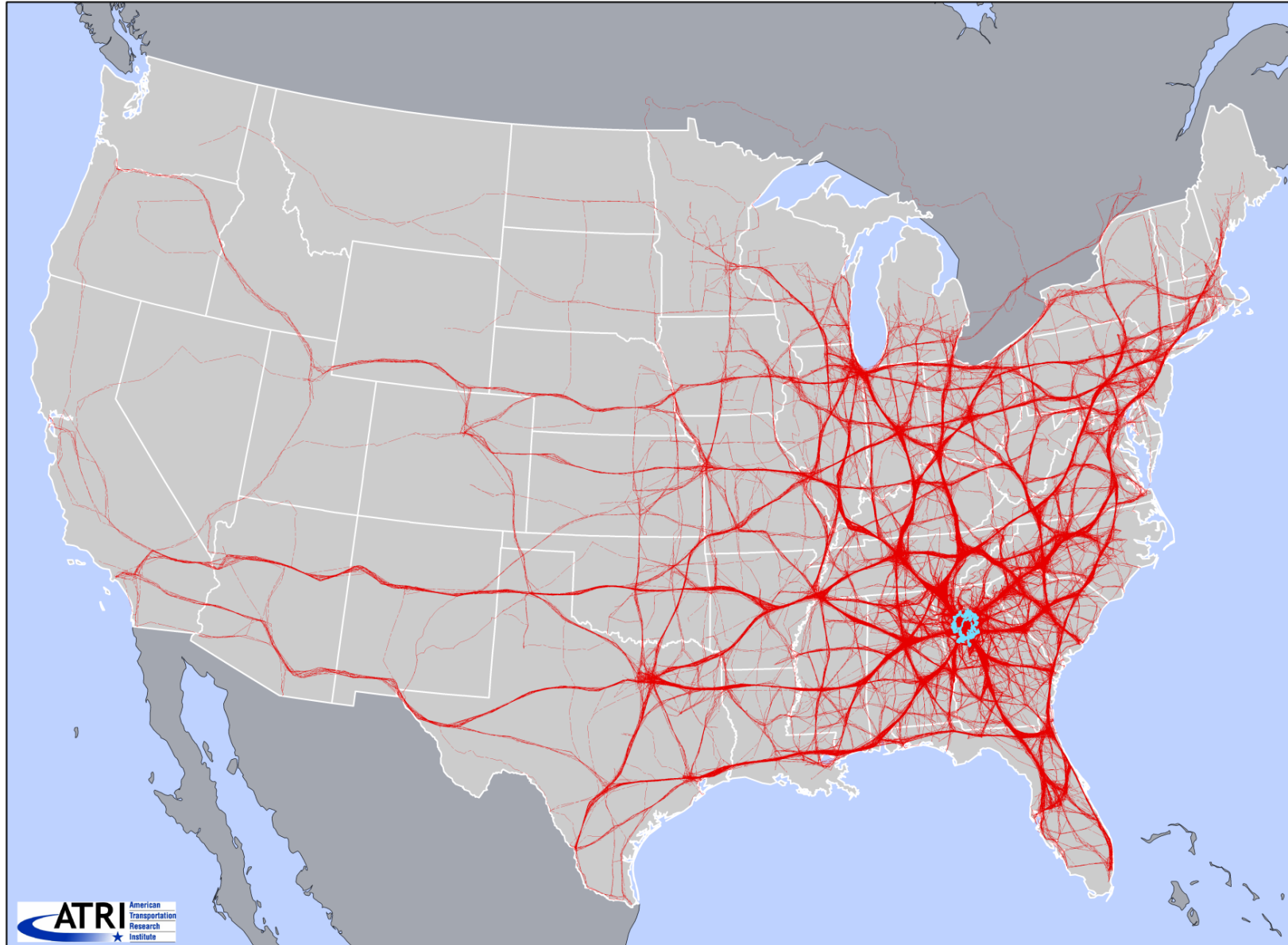
# Same 2,000 Trucks After 48 Hours



# Same 2,000 Trucks After 72 Hours

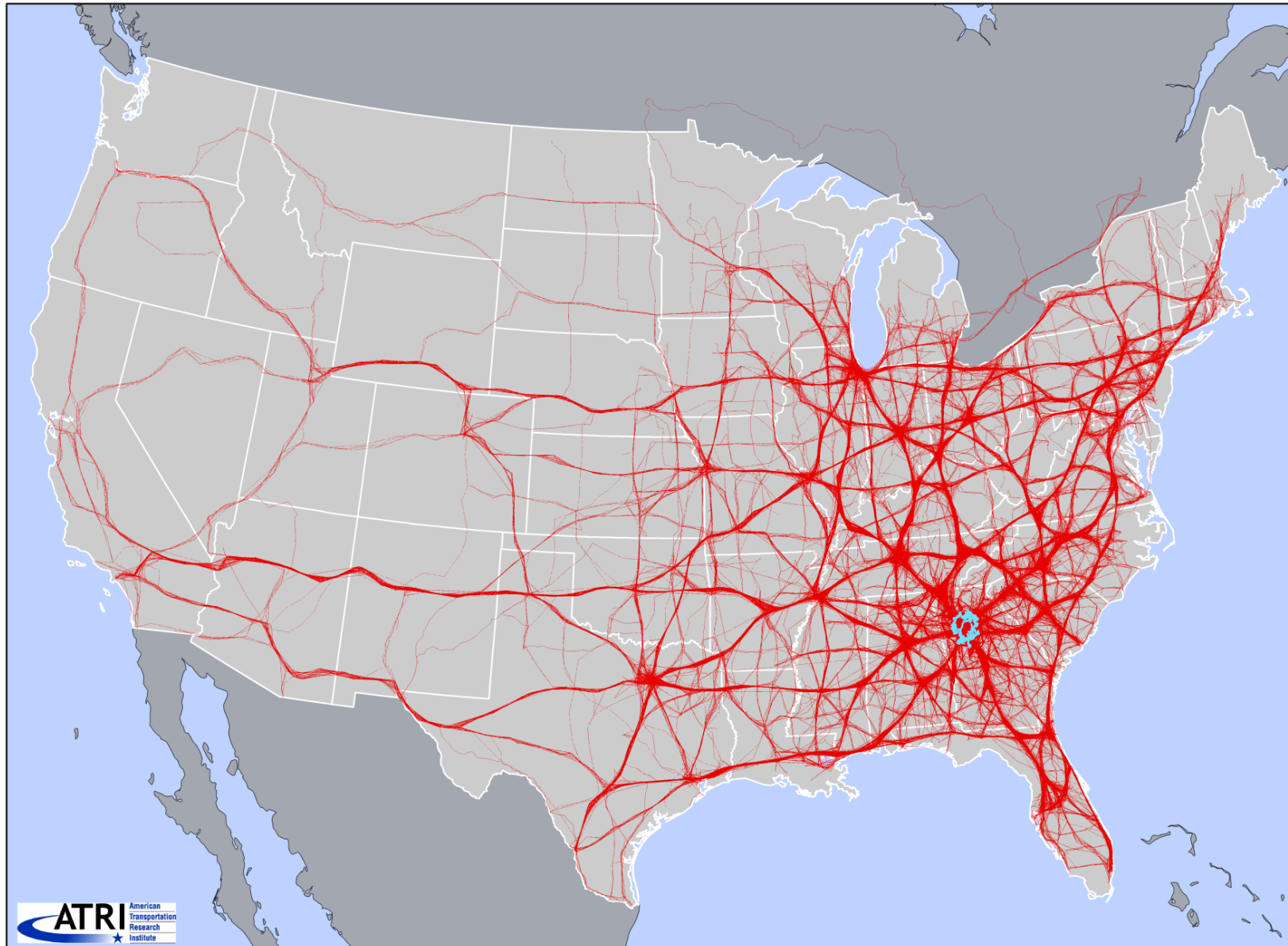


# Same 2,000 Trucks After 5 Days

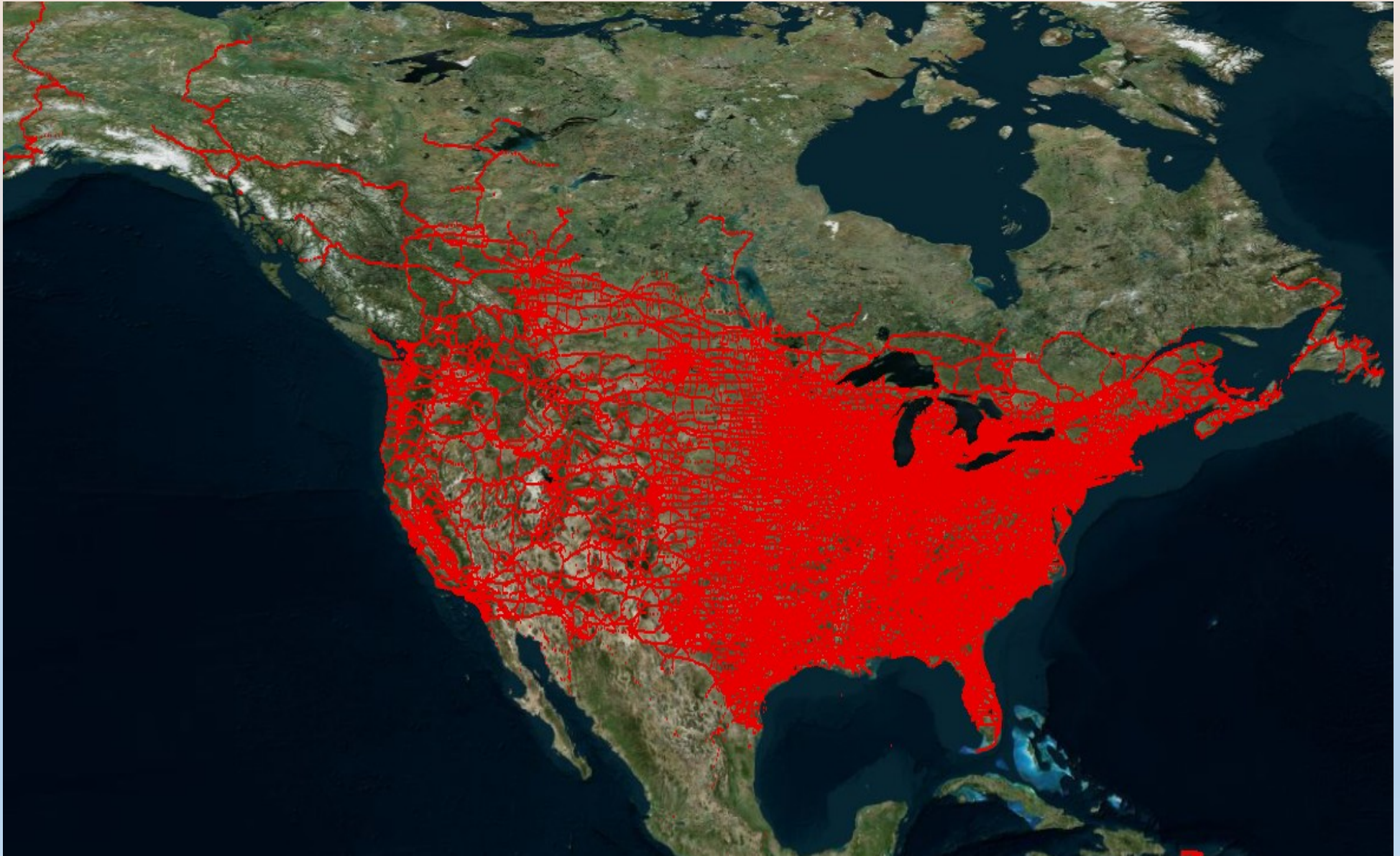




# Same 2,000 Trucks After 7 Days

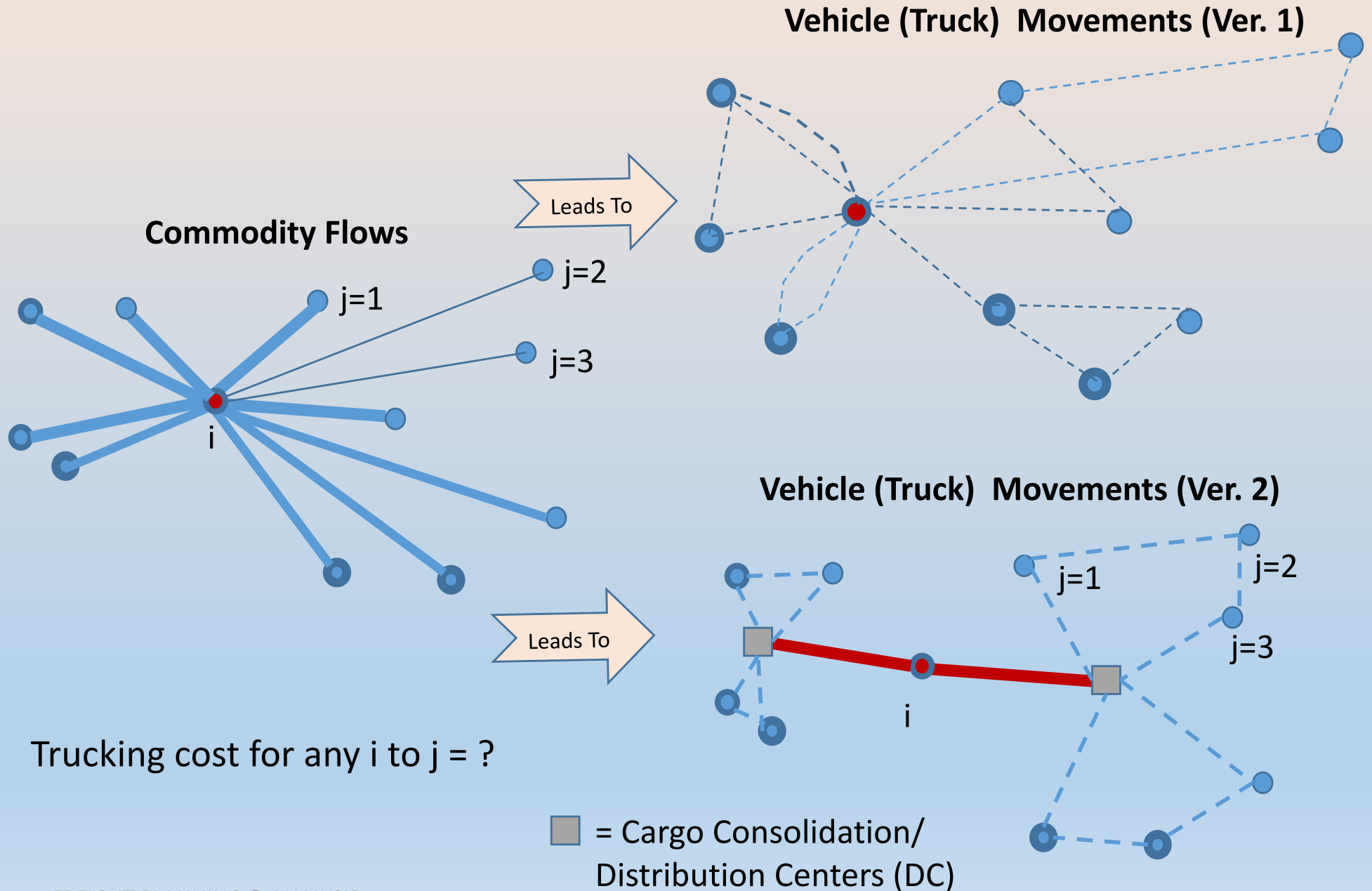


# ATRI Truck GPS Dataset – One Day



Short, J. ATRI Ibid.

# Urban Truck Freight Modeling: Multi-Stop Pickup and Delivery Tours



# Can We Pull It All Together?

## A) Aggregate Flow Econometric Modeling

Four or Five Step/ Direct Demand/  
Structural Equations Models  
(with Spatial Disaggregation)

## B) Disaggregate Freight Behavior Modeling

Supply Chain Models

Microsimulation Based  
Models

Agent-Based Models

“Comprehensive Spatial/Econometric/Behavioral/Logistical/Demand-Supply Balanced Freight Flow Models”

Multimodal (+Inter-modal) Network Assignment & Logistical Cost Models

## C) Intermodal Network Flow Modeling

# And Finally: Some Emerging Issues To Think About.

## How Do We Model.....

- “New Mode” Impacts
  - Including:
    - Drones (for Rural Freight)
    - Autonomous Connected Truck Platoons (On Interstates)
    - Megaships
  
- New Energy Source (Generation, Storage) Impacts
  - Including:
    - Vehicle-based and Roadway-based Electric Power Options
  
- New Production Method Impacts
  - Including:
    - 3-D Printing (Changes in Household as well as Industry Production Patterns)

# **A Look at Freight Demand Modeling in the United States**

## **Abstract**

This presentation overviews the different approaches to estimating and forecasting the demand for freight services in the United States, pointing out the most common in-practice approaches and how recent and on-going research efforts are likely to move this practice towards new, improved, and increasingly involved model applications, making use of a variety of data sources. These developments are discussed in the context of bringing more detail into the freight planning process: by adding industry, commodity, modal, network, behavioral and logistical details to freight activity models at a number of different regional scales. The discussion is centered on the interplay between freight volumes and freight costs. Emerging methods include the introduction of supply-chain considerations into freight activity models, the use of microsimulation techniques, notably in support of behaviorally motivated agent-based freight modeling, and the inclusion of an expanded range of freight cost factors, including delivery time reliability and other inventory related carrying costs. Supporting these efforts are parallel developments in newly available data sources. Driving much of this modeling effort today is the search for policy-relevant and plan-sensitive freight performance measures, at a time when the condition and carrying capacity of the nation's multi-modal freight networks are coming under increased scrutiny.