



NYK LOGISTICS  
THE MEGACARRIER

Image from NYK Logistics

# Locating Short-Term Empty Container Storage Facilities

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Stacks of chassis at East L.A. Intermodal yard, August,2006

R.L. Church



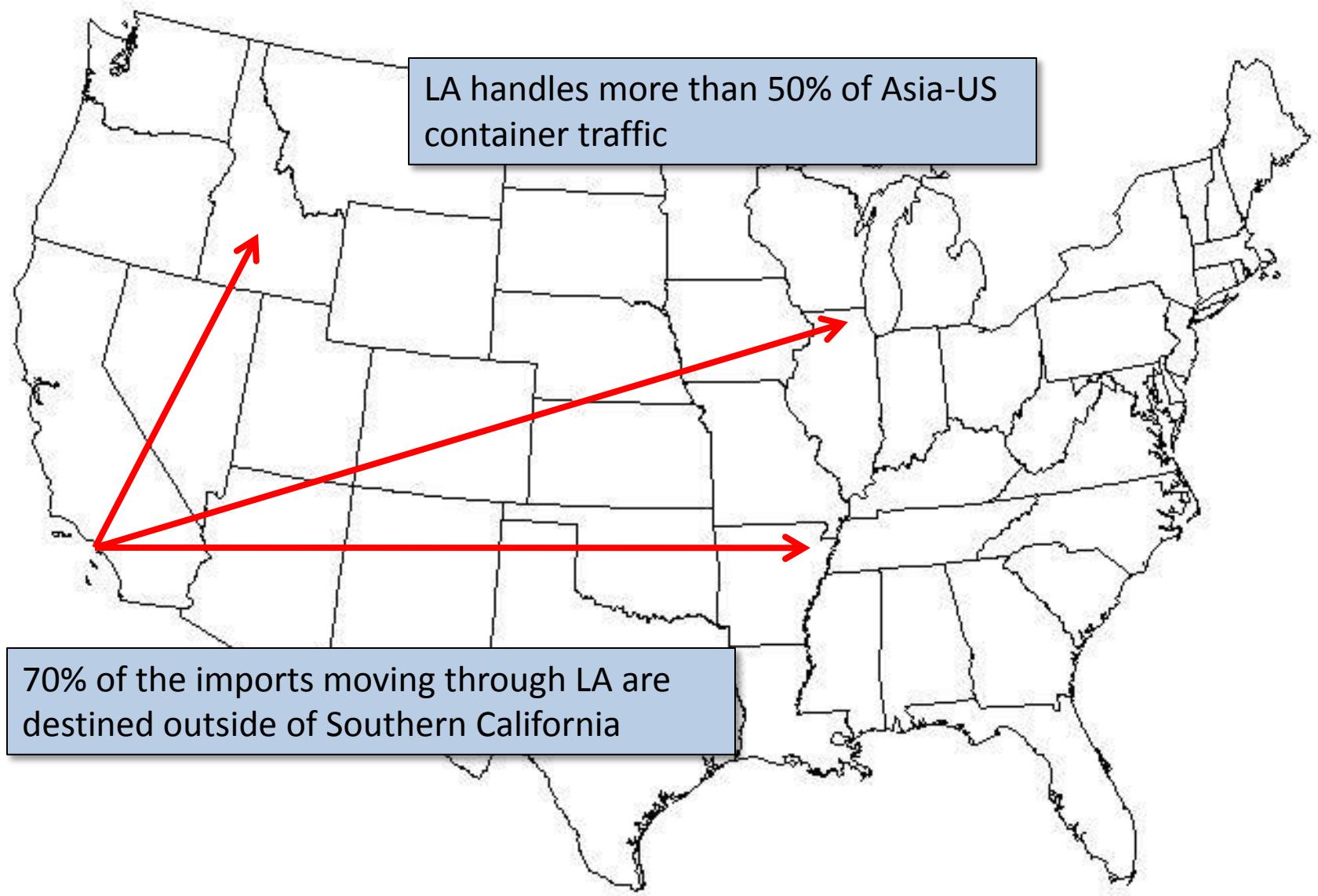
Stacked chassis, UPRR East LA Intermodal Facility

R.L. Church

# A focus on Drayage

## Talk Outline:

- Introduction to the Port Operations of LA/LB
- Understanding container trips & why focus on the movement of empties?
- Modeling truck routes
- Base case estimate of VMT associated moving empties
- Modeling the impact of storing containers away from the port
- Possible directions in future work



# The forecast: LA/LB port complex

Year	Cargo Forecasts
2004	13.1*
2005	14.2*
2010	19.7
2020	36.0
2030	44.7

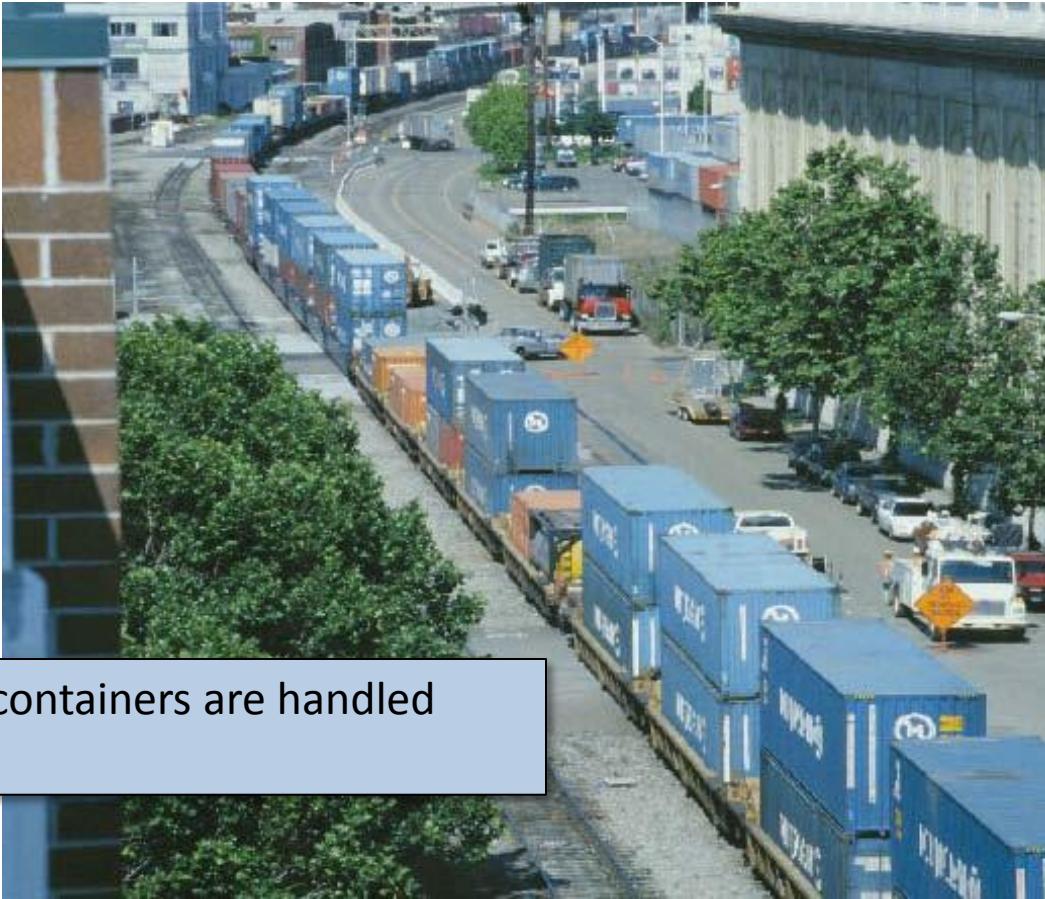
\*actual volumes

It is estimated that one in seven jobs in Southern California is directly related to import/export operations

Ports of LA/LB handle approximately 40% of the import cargo into the US

Numbers in millions of TEUs ( 20 ft equivalent units )

# On-dock rail & the Alameda Corridor



About 20% of the containers are handled directly by rail

Image from CALMITSIC

# Some of the Alameda Corridor is below grade



Below grade track eliminates traffic crossing issues on local roads

Image from CALMITSIC

# Drayage Trucks

Drayage trucks handle nearly 80% of the container volume.....to DCs/CrossDocks/etc



Many Drayage trucks are/owner operated, contracted to handle specific moves. In 2009 there were approximately 14,000 drayage trucks

Image from GreenTrucker.com

# I-710 heading north from the LA ports



Normal daily traffic congestion



March 11, 2003 during walk out  
of Port workers

Images from CALMITSIC

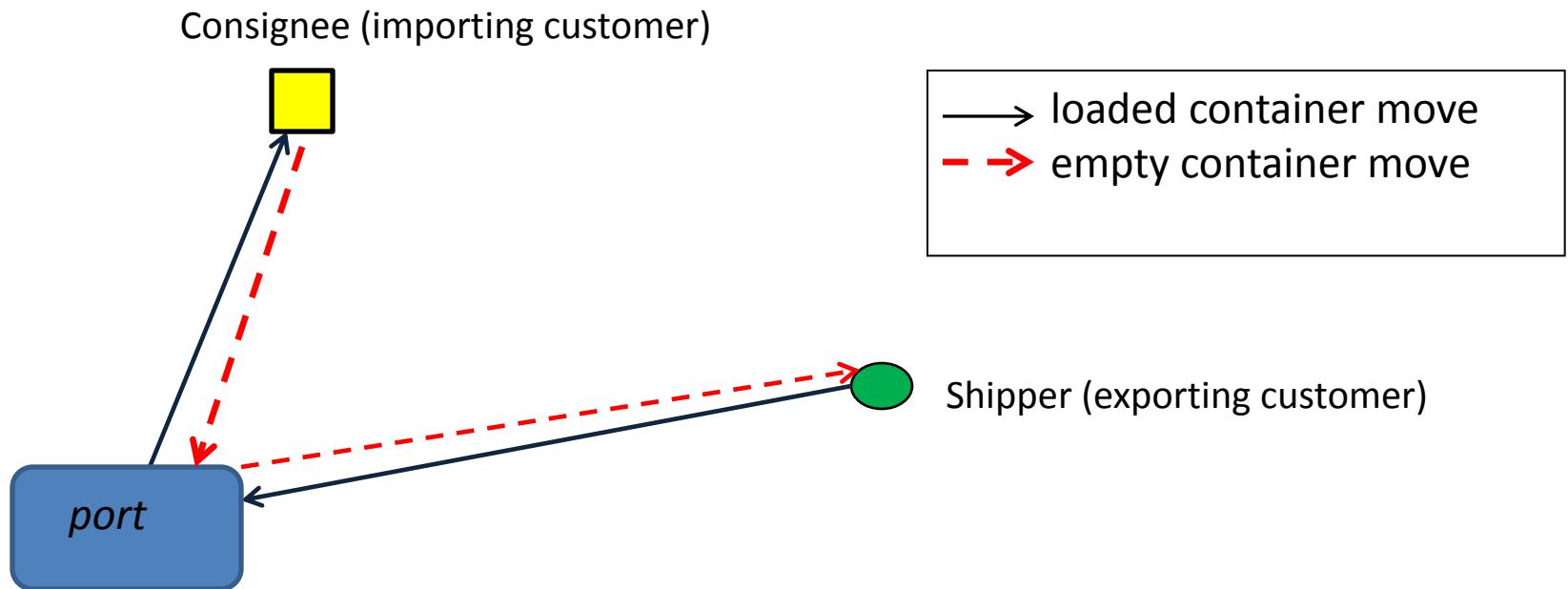
# Major issues for port operations

- Environment
  - Pollution from ship operations
  - Pollution from rail operations
  - Pollution from drayage operations
- Road Congestion due to drayage operations
  - Truck
  - Intermodal: ship to truck to rail
- Terminal congestion
- Efficiency
- Infrastructure development

# Current Operations

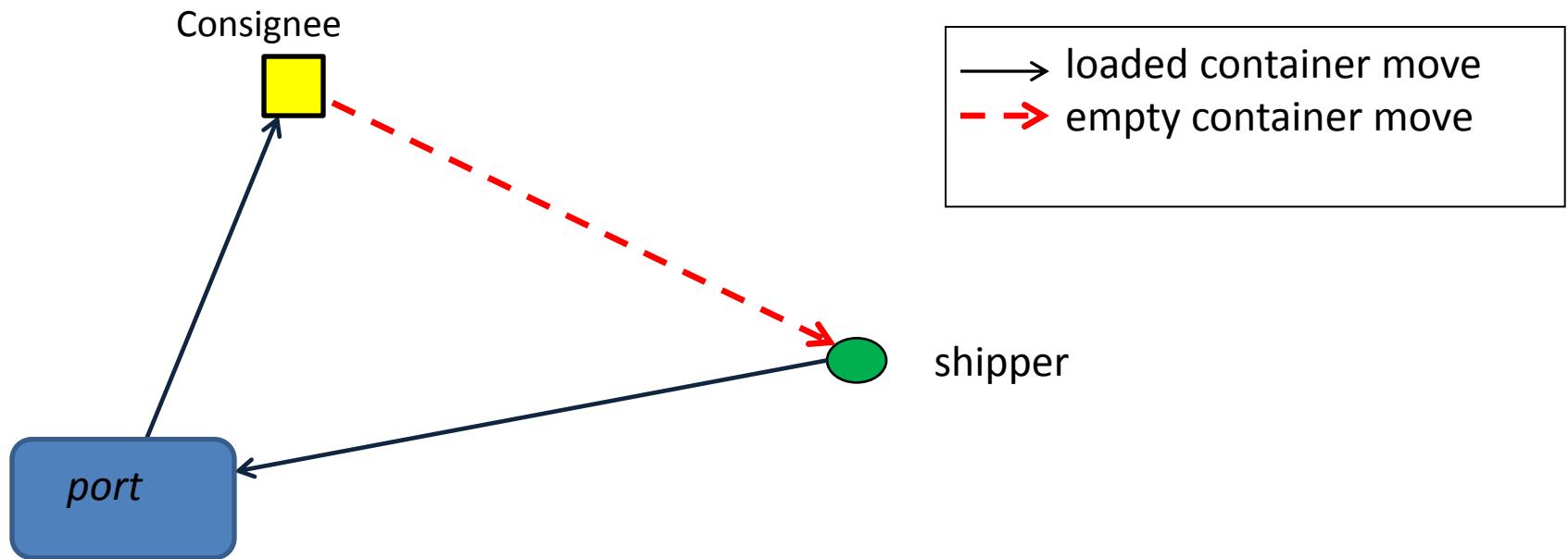
- 8 million import containers (16 million total)
- imports per day average: 28,000+
- ~~20 % leave port by truck~~  
Co Drayage is the big beast for the LA basin
- 80% leave port by truck
  - A certain percentage are transported to one of the rail yards by truck
- virtually all containers emptied locally are returned to the port by truck

# Depicting container moves



Most empties are taken to the port & stored. Many of those empties are then picked up and taken to a shipper for filling before export

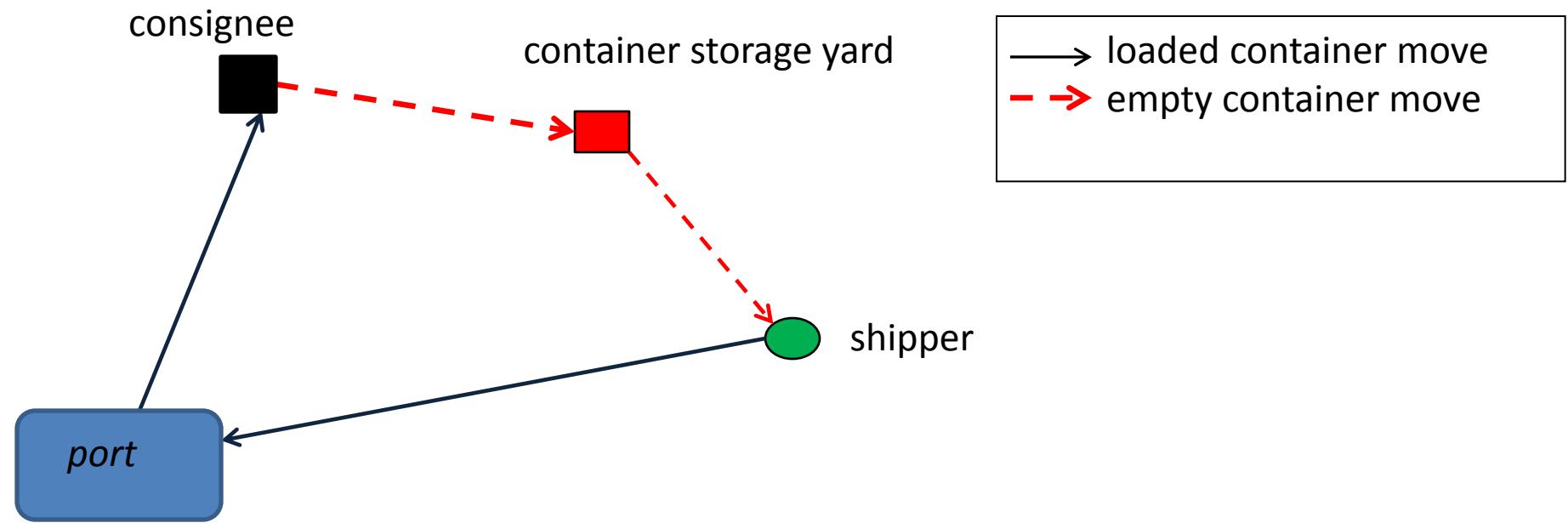
# Depicting container moves



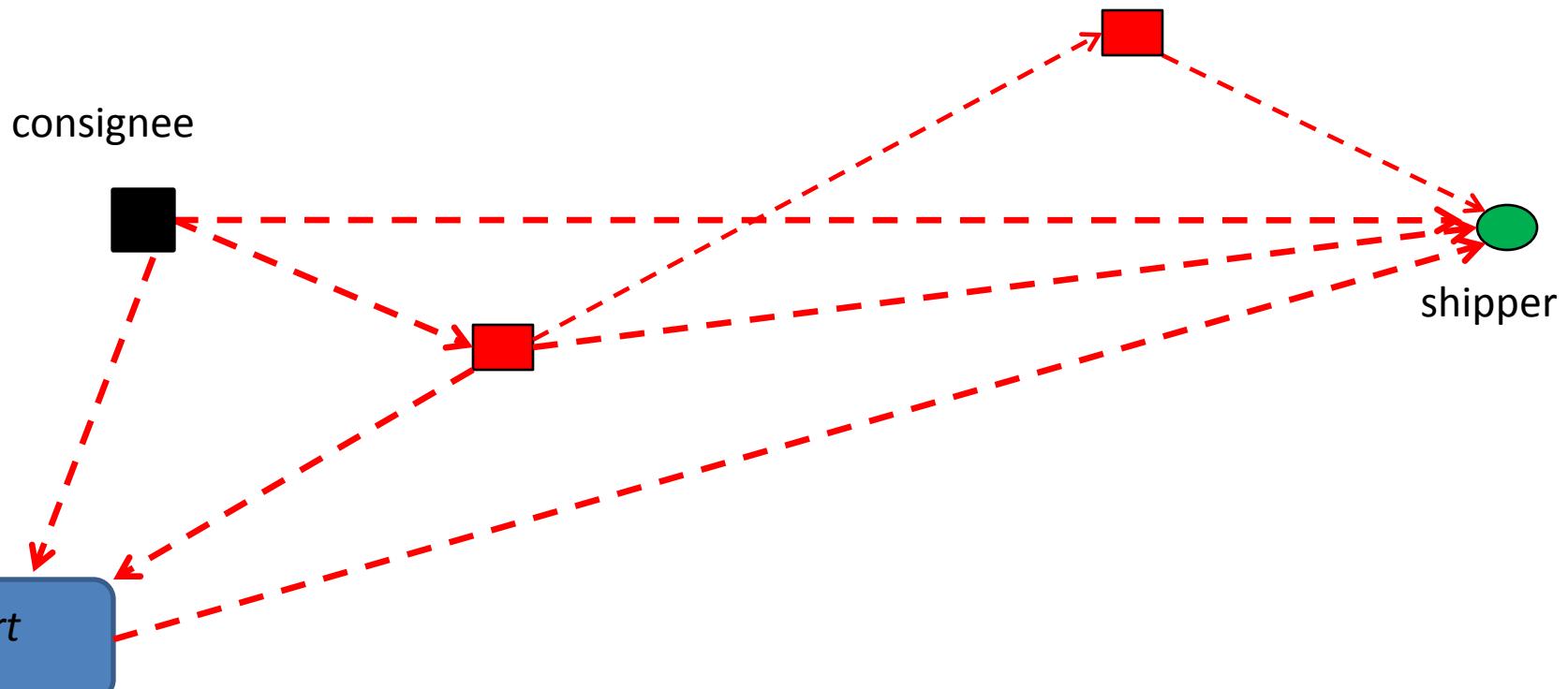
Empties can sometimes be taken directly to a shipper, thereby reducing a move to the port and a subsequent move from the port

Such moves are supported through the use of a virtual container yard

# Depicting container moves



# Empty container management



Note: Since moves of full containers are fixed; the issue is to focus on the movement of empties and keep empty VMT as small as possible

# Why focus on empty containers?

- Full container moves are fixed, from port to consignees and from shippers to port
- Empty container moves are flexible
  - Street turns are possible with a virtual container yard, reducing VMT
  - Storage yards may reduce VMT
- Can reduce traffic into and out of port area by storing empties away from port
- Empties can be exchanged...full containers cannot
- Reducing VMT of drayage trucks may have a significant impact on improving air quality

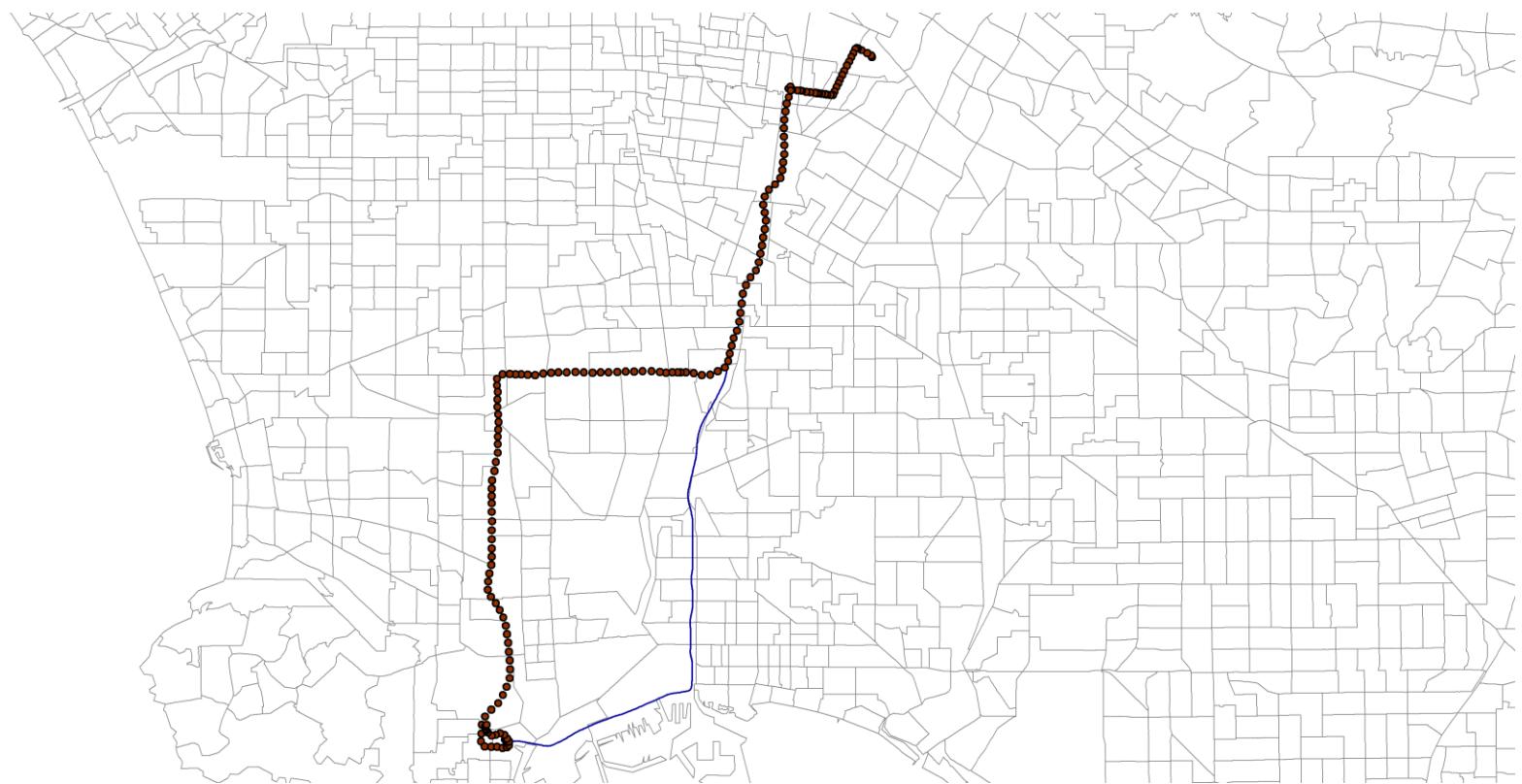
# Modeling truck routes

- Data: TeleAtlas network & actual truck routes (GPS coordinates every 12 seconds)
- Model: shortest path problem
  - Uses travel times reported by TeleAtlas
- Compare computer generated routes and actual truck routes
  - report routes in terms of distances and times

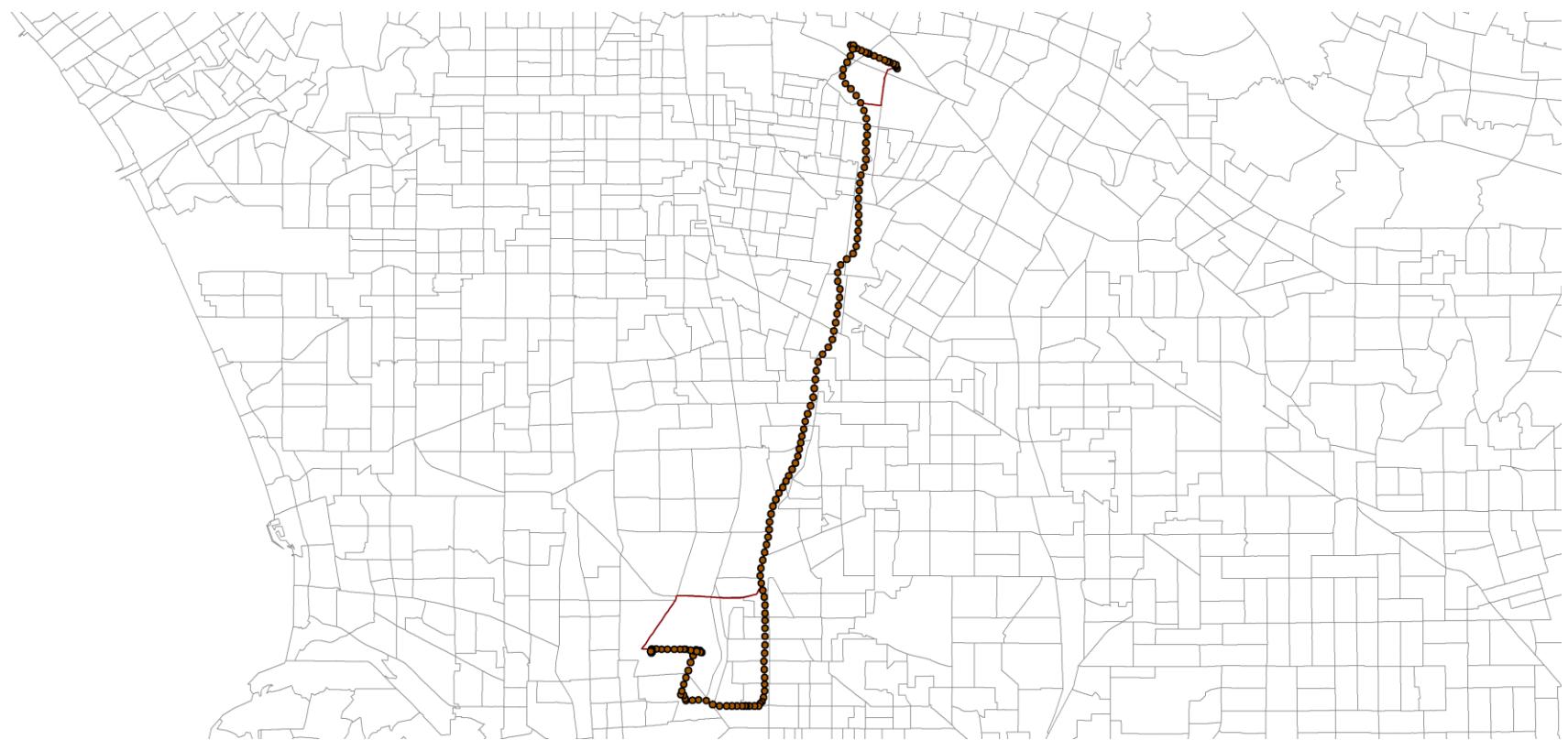
# An example of GPS points coinciding with shortest time path



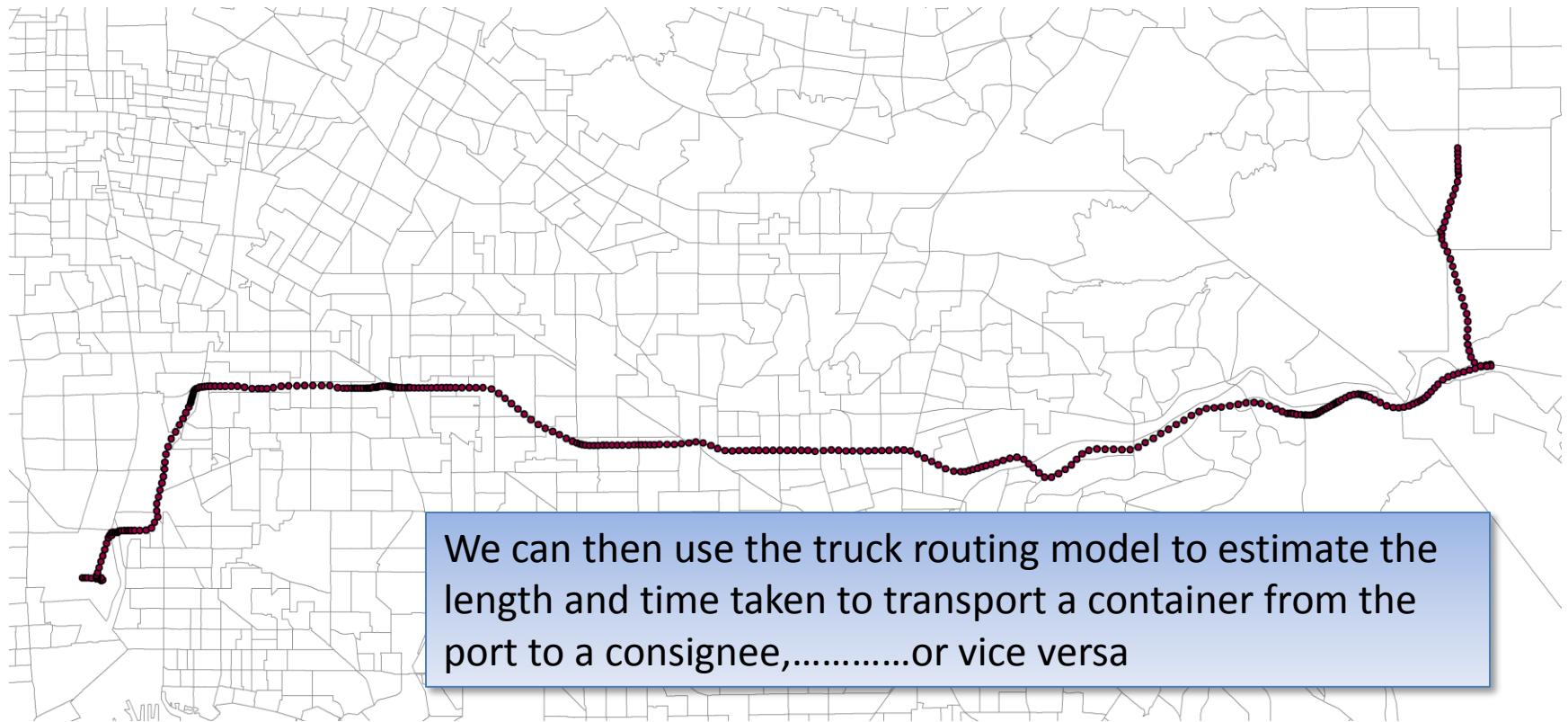
# a second example



# a third example



# A fourth example

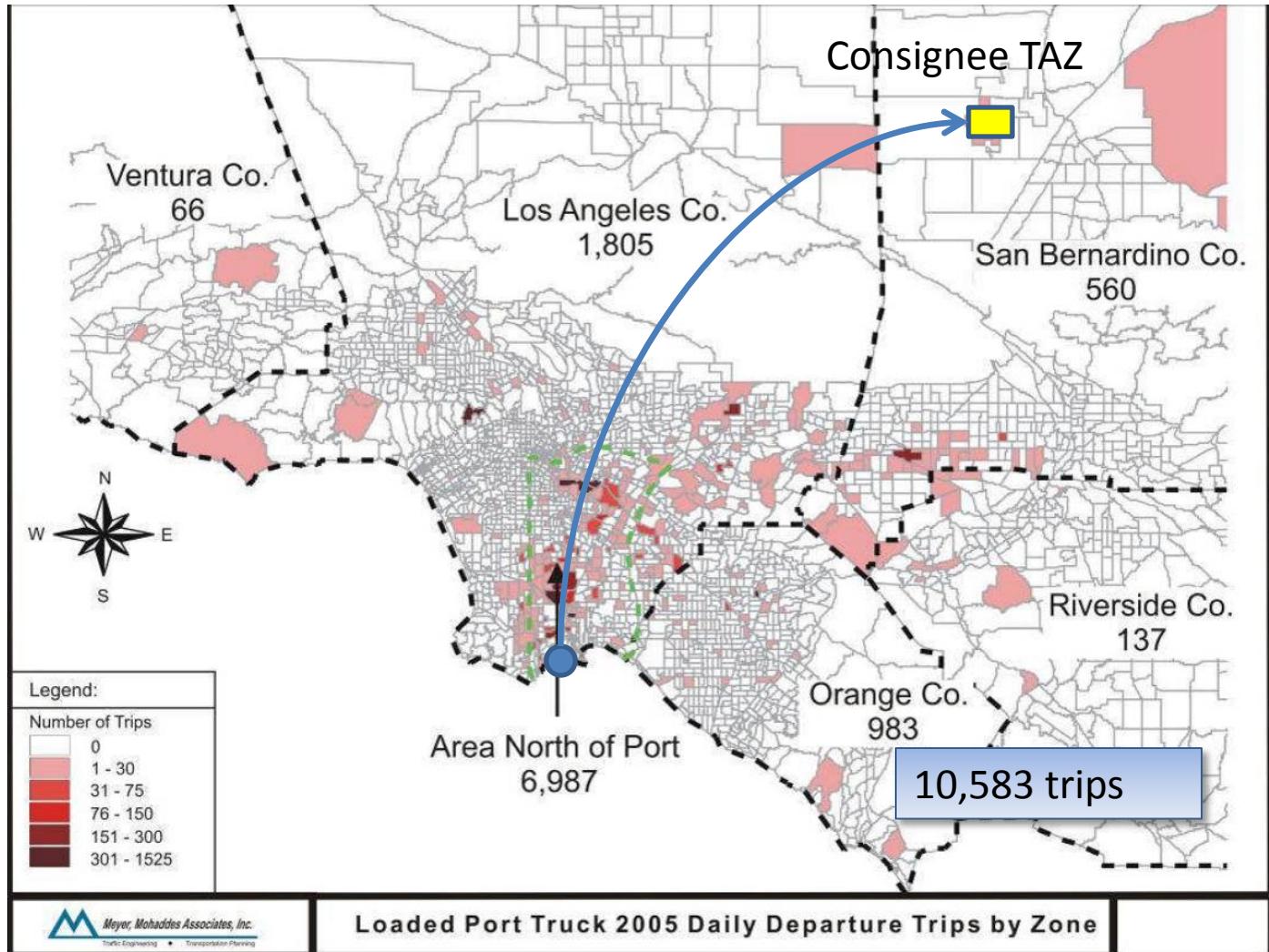


# Modeling the movement of empties

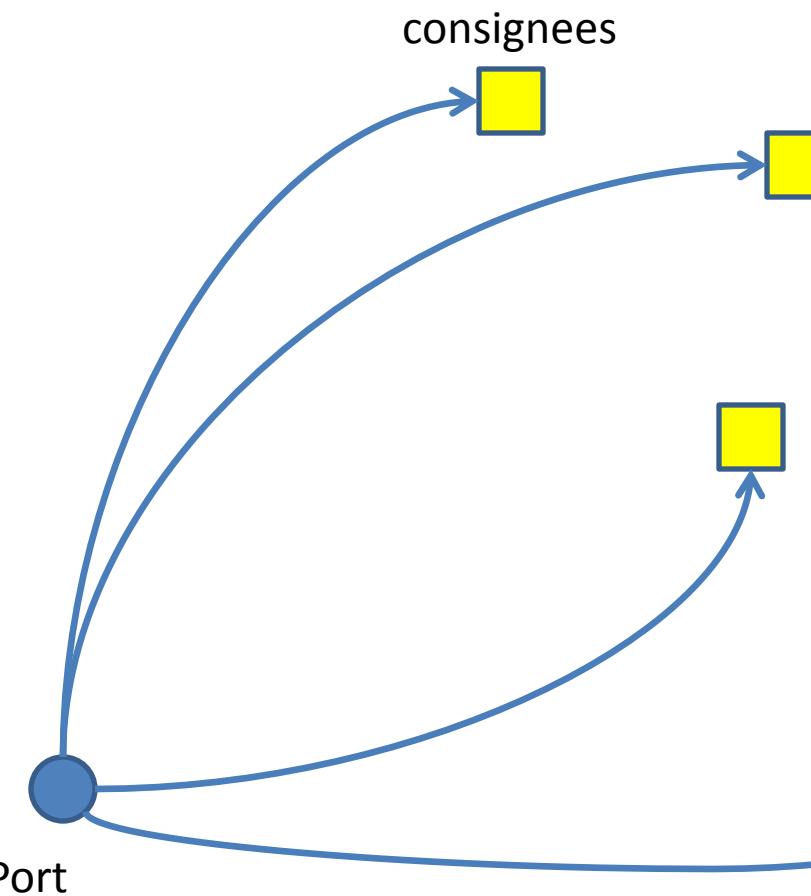
- Construct a spatially distributed data set of:
  - consignee locations
  - shipper locations
- Estimate movement of containers: full & empty
  - Base case: port is the only storage yard & all empties are stored at the port
  - Truck routing model can be used to estimate mileage of each trip

# Distribution of consignee locations

Trips from  
port to TAZs



We can then calculate the distance traveled to all consignees in transporting all 10,538 full containers (A)

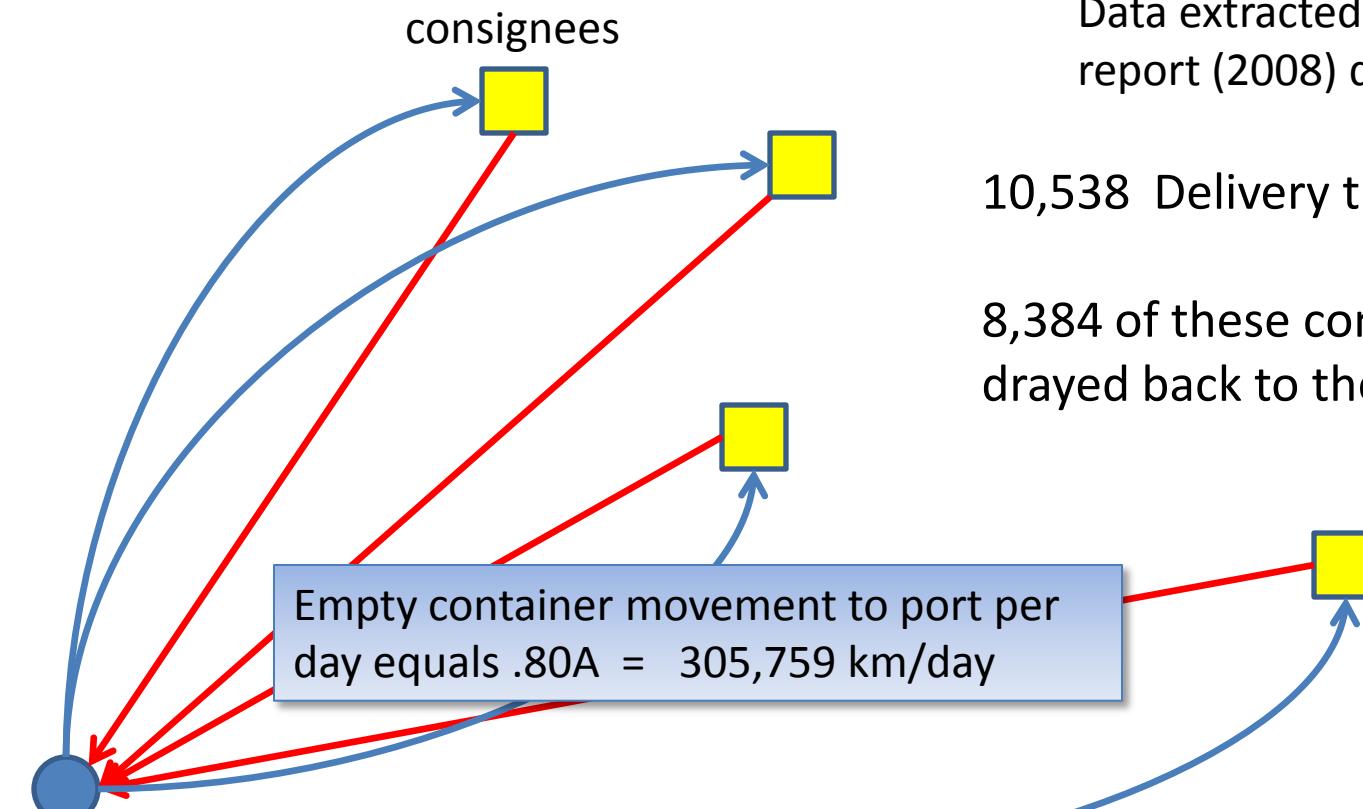


Data extracted from Tioga report (2008) daily volumes

10,538 Delivery trips per day

$$A = 382,199 \text{ km/day} !$$

# Estimating empty container VMT



Data extracted from Tioga report (2008) daily volumes

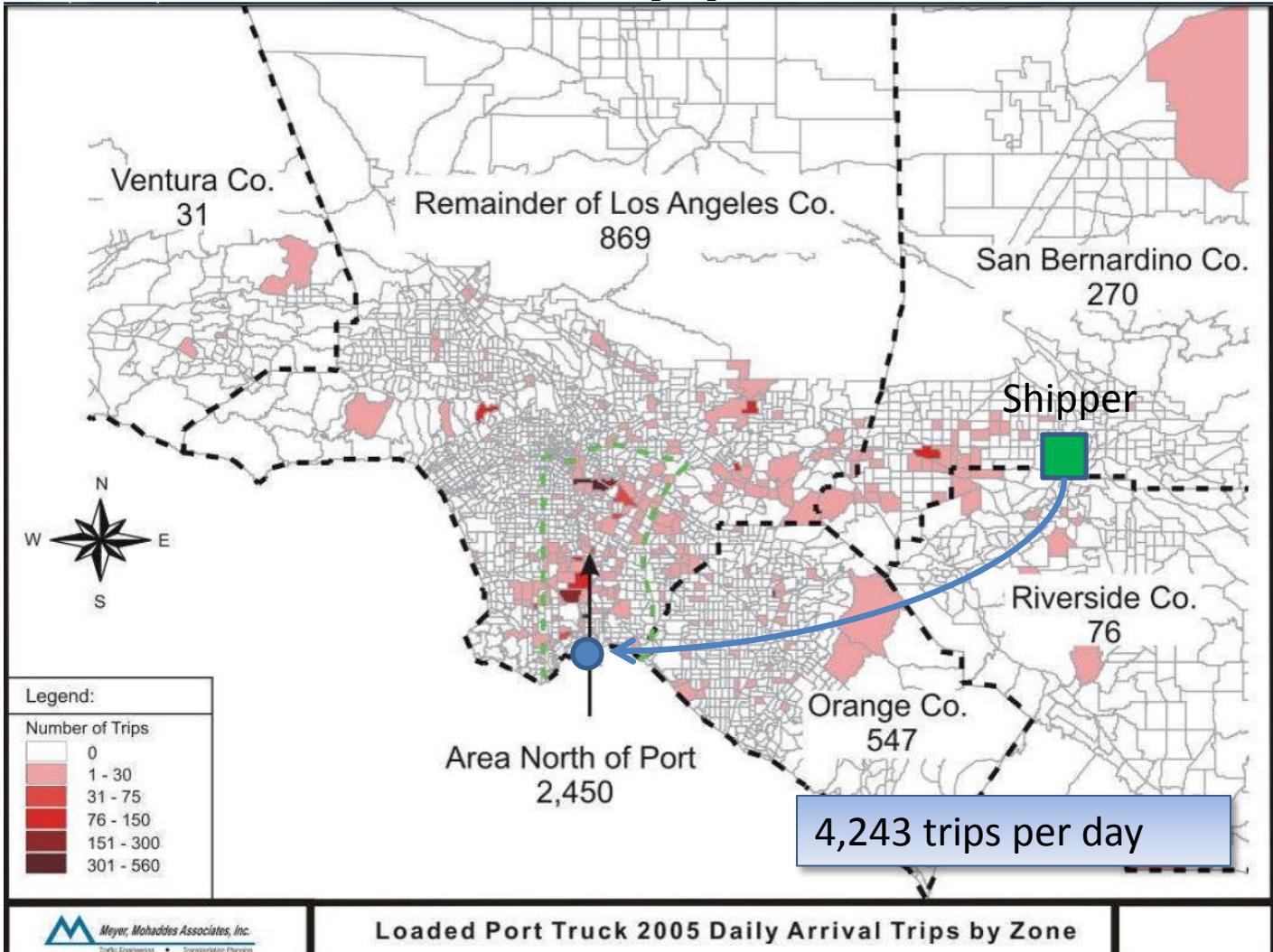
10,538 Delivery trips per day

8,384 of these containers are drayed back to the port as empties

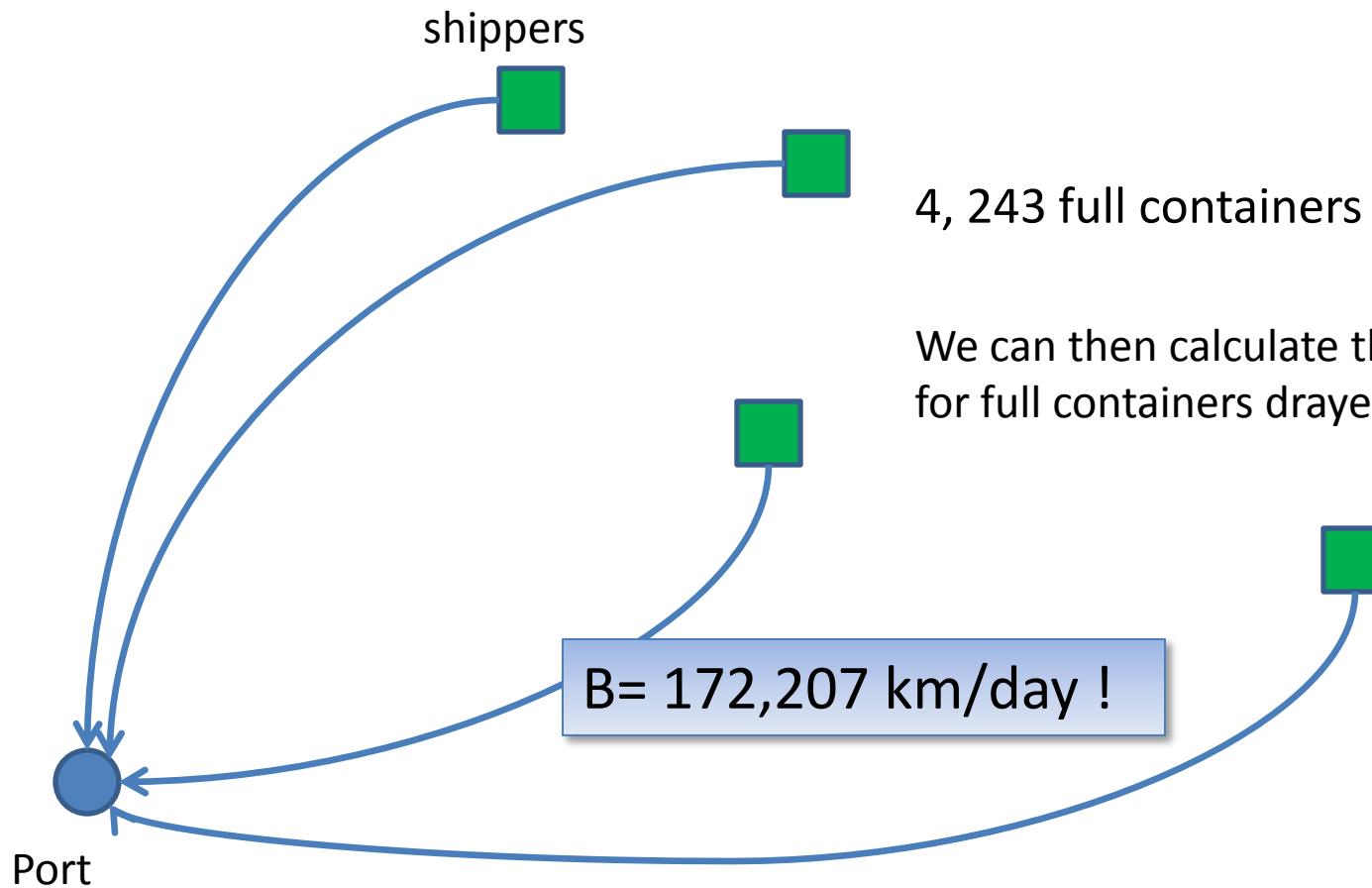
$$8,384 / 10,538 = .80 \text{ or } 80\% \text{ of containers are emptied and taken directly to port}$$

# Distribution of shipper locations

Trips from  
port to TAZs



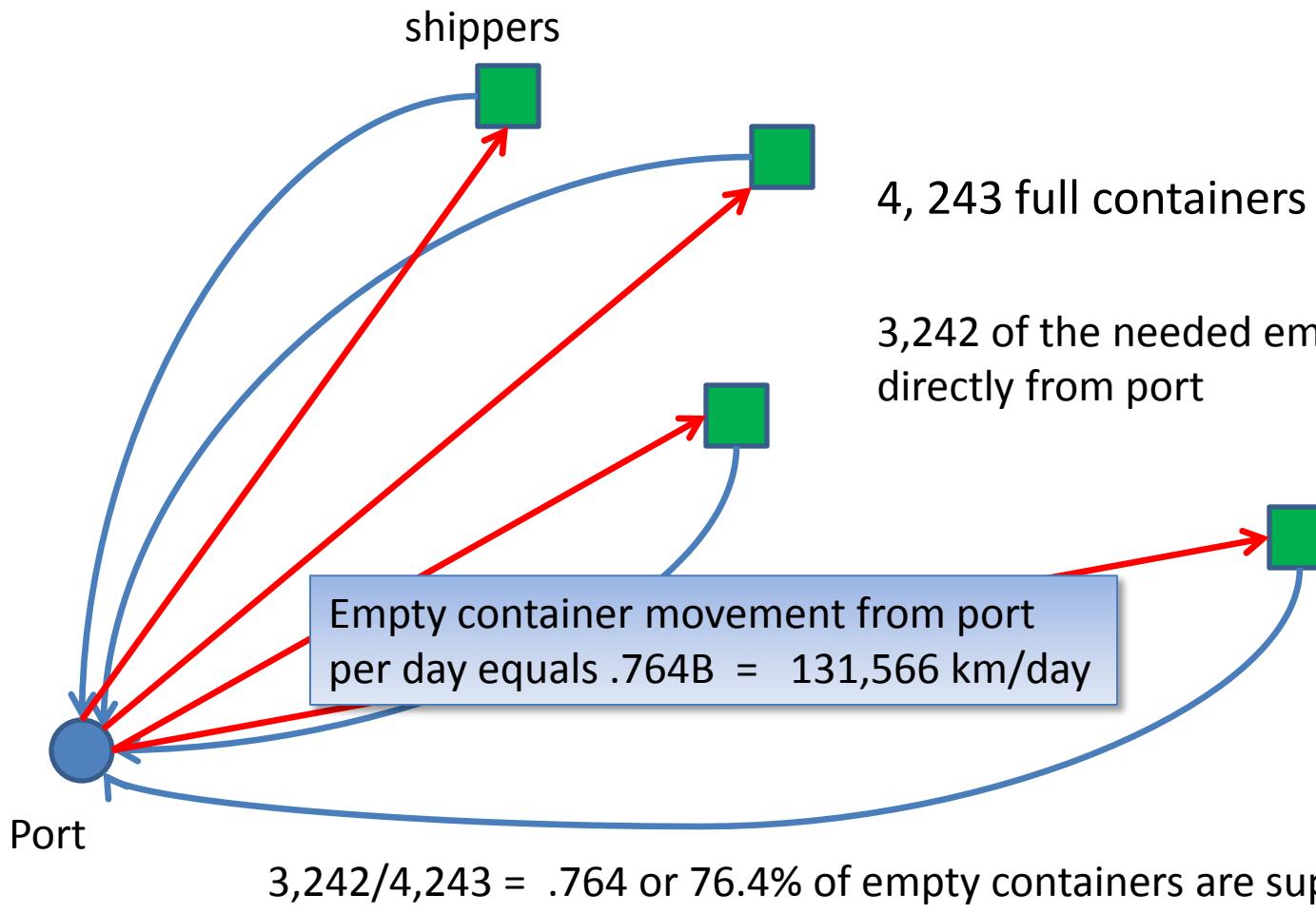
Data extracted from Tioga report (2008) daily volumes



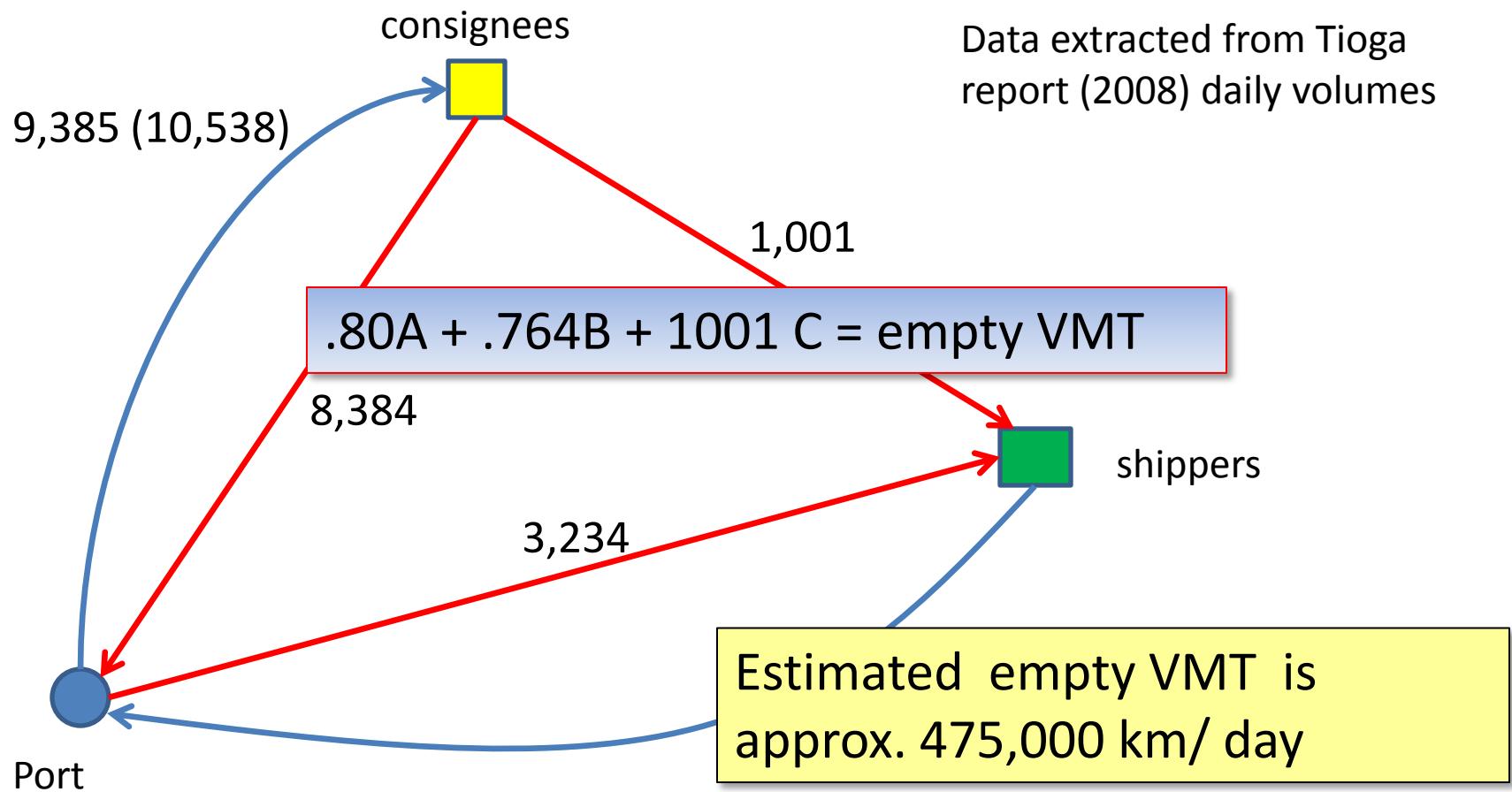
4,243 full containers taken to port

We can then calculate the distance traveled for full containers drayed to port (B)

Data extracted from Tioga report (2008) daily volumes



# Estimating total empty container VMT



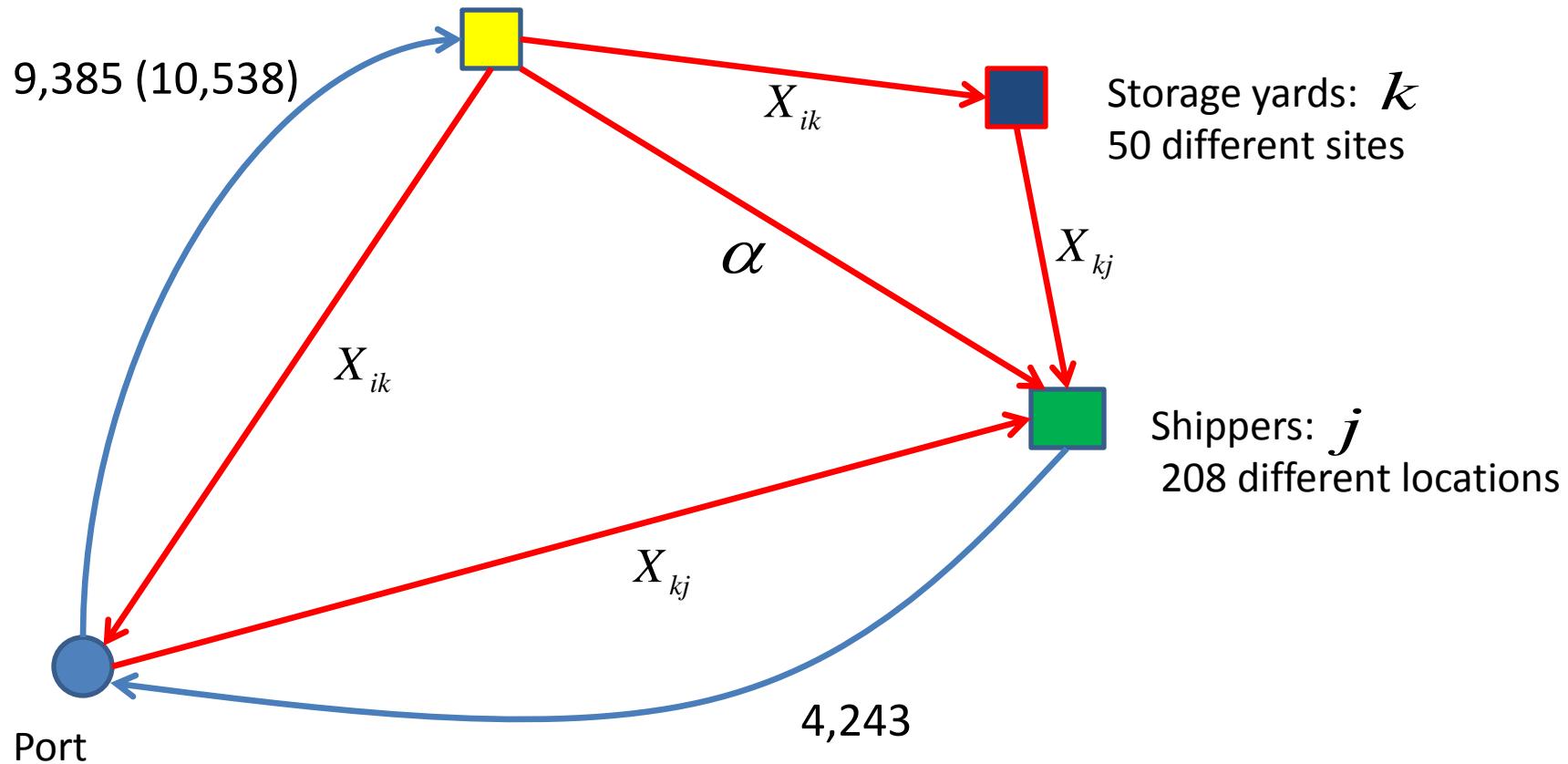
# OSEM models: Operating perspectives

- System optimal (OSEM1)
  - In a system optimal model, the system operates in such a manner that empty container miles are minimized
  - Truckers may be told to drop off empties at far away yards
  - Solving for system optimality allows us to determine the highest efficiency achievable
- User optimal (OSEM2 & OSEM3)
  - In a user optimal model, the system tries to achieve similar objectives but at the same time respects user choice.
  - As the drayage business is fragmented and dominated by small and medium-sized companies, user optimality is a more realistic assumption. In this context, we assume user prefers closer depots.
  - Consequently, it will necessary to rebalance inventories among storage yards

# Basic problem format

consignees:  $i$

206 different locations



# OSEM Models: Notation

$i$  = index representing positions of consignees  $i = 1, 2, \dots, n$

$j$  = index representing positions of shippers,  $j = 1, 2, \dots, m$

$k$  = index representing potential locations for empty storage,

$k = 1, 2, \dots, S$  where  $k = 1$  represents the new depot

Technically speaking, the  $X$  variables in the first model need not be binary integer, but are continuous, representing the fraction of the trips assigned to a given depot

$e_{tk}$  = the volume of empty flow from depot  $t$  to depot  $k$

$y_k = 1$ , if a depot is selected at site  $k$ , 0 otherwise

$x_{ik} = 1$ , if consignee  $i$  uses depot  $k$  to drop off empties, 0 otherwise

$x_{kj} = 1$ , if shipper  $j$  picks up empties from depot  $k$ , 0 otherwise

# OSEM1: System Optimal

Minimize EMT: empty container miles traveled

$$\text{Minimize } Z = \sum_{t=1}^K \sum_k^K d_{tk} e_{tk} + \sum_{k=1}^K \sum_{i=1}^n d_{ik} (1-\alpha_i) S_i x_{ik} + \sum_{k=1}^K \sum_{j=1}^m d_{kj} (1-\beta_j) D_j x_{kj}$$

$$\sum_{k=1}^K x_{ik} = 1, \quad \forall i \in I$$

$$\sum_{k=1}^K x_{kj} = 1, \quad \forall j \in J$$

$$x_{ik} \leq y_k, \quad \forall i \in I, k \in K$$

$$x_{kj} \leq y_k, \quad \forall j \in J, k \in K$$

$$\sum_{t \neq k} e_{tk} + \sum_{i=1}^n (1-\alpha_i) S_i x_{ik} - \sum_{t \neq k} e_{kt} - \sum_{j=1}^m (1-\beta_j) D_j x_{kj} = \begin{cases} D_{port}, & \text{if } k = 1 \\ 0, & \text{otherwise} \end{cases} \quad \forall k \in K$$

$$\sum_{t \in K} e_{tk} + e_{kt} \leq M \cdot y_k, \quad \forall k \in K$$

$$\sum_{k=1}^K y_k = p$$

Locate  $p$  storage depots

percentages of street turns  
Empties from consignees must be sent out to depots

Meet demand for global repositioning of empties at port; and keep empty container inventories balanced at other depots.

# OSEM2 model

OSEM 2: Optimizes driver efficiency, assuming drayage companies drop off at the **closest** depot to the consignee or pick up at the **closest** depot to the shipper

That is, assume the driver is very “greedy”

A “hot potato” approach to representing the drivers actions

## OSEM2

$$\text{Minimize } Z = \sum_{t=1}^K \sum_k^K d_{tk} e_{tk} + \sum_{k=1}^K \sum_{i=1}^n d_{ik} (1 - \alpha_i) S_i x_{ik} + \sum_{k=1}^K \sum_{j=1}^m d_{kj} (1 - \beta_j) D_j x_{kj}$$

$$\sum_{k=1}^K x_{ik} = 1, \quad \forall i \in I$$

$$\sum_{k=1}^K x_{kj} = 1, \quad \forall j \in J$$

$$x_{ik} \leq y_k, \quad \forall i \in I, k \in K$$

$$x_{kj} \leq y_k, \quad \forall j \in J, k \in K$$

$$\sum_{q \in C_{ik}} x_{iq} + x_{ik} \geq y_k, \quad \forall i \in I, k \in K$$

$$\sum_{q \in C_{jk}} x_{qj} + x_{kj} \geq y_k, \quad \forall j \in J, k \in K$$

$$\sum_{t \neq k} e_{tk} + \sum_{i=1}^n (1 - \alpha_i) S_i x_{ik} - \sum_{t \neq k} e_{kt} - \sum_{j=1}^m (1 - \beta_j) D_j x_{kj} = \begin{cases} D_{port}, & \text{if } k = 1 \\ 0, & \text{otherwise} \end{cases}, \quad \forall k \in K$$

$$\sum_{t \in K} e_{tk} + e_{kt} \leq M \cdot y_k, \quad \forall k \in K$$

$$\sum_{k=1}^K y_k = p$$



Require that consignee  $i$  uses its closest depot



Require that shipper  $j$  is served by its closest depot

# OSEM3 model

Model 3: Also optimizes driver efficiency, but it assumes that drayage companies would select a mix of drop off locations (and pick up locations) for empties based upon relative closeness of the depots

- Drayage companies might have reasons for picking up an empty container (or dropping off an empty container) at a storage yard location other than the closest
- For example, a farther facility may be on their way to a subsequent destination

# OSEM3

percentage of times the  $l^{\text{th}}$  closest depot is used

$$\text{Minimize } Z = \sum_{t=1}^K \sum_k^K d_{tk} e_{tk} + \sum_{l=1}^L \sum_{k=1}^K \sum_{i=1}^n \theta_{il} d_{ik} (1 - \alpha_i) S_i x_{ik}^l + \sum_{l=1}^L \sum_{k=1}^K \sum_{j=1}^m \theta_{jl} d_{kj} (1 - \beta_j) D_j x_{jk}^l$$

$$\sum_{k=1}^K x_{ik}^l = 1, \quad \forall i \in I, l = 1..L$$

$$\sum_{k=1}^K x_{kj}^l = 1, \quad \forall j \in J, l = 1..L$$

$$x_{ik}^l \leq y_k, \quad \forall i \in I, k \in K$$

$$x_{kj}^l \leq y_k, \quad \forall j \in J, k \in K$$

$$\sum_{q \in C_{ik}} x_{iq}^l + \sum_{s \leq l} x_{ik}^s \geq y_k \quad \forall i \in I, l = 1, 2, 3, \dots, L$$

$$\sum_{q \in C_{jk}} x_{qj}^l + \sum_{s \leq l} x_{kj}^s \geq y_k \quad \forall j \in J, l = 1, 2, 3, \dots, L$$

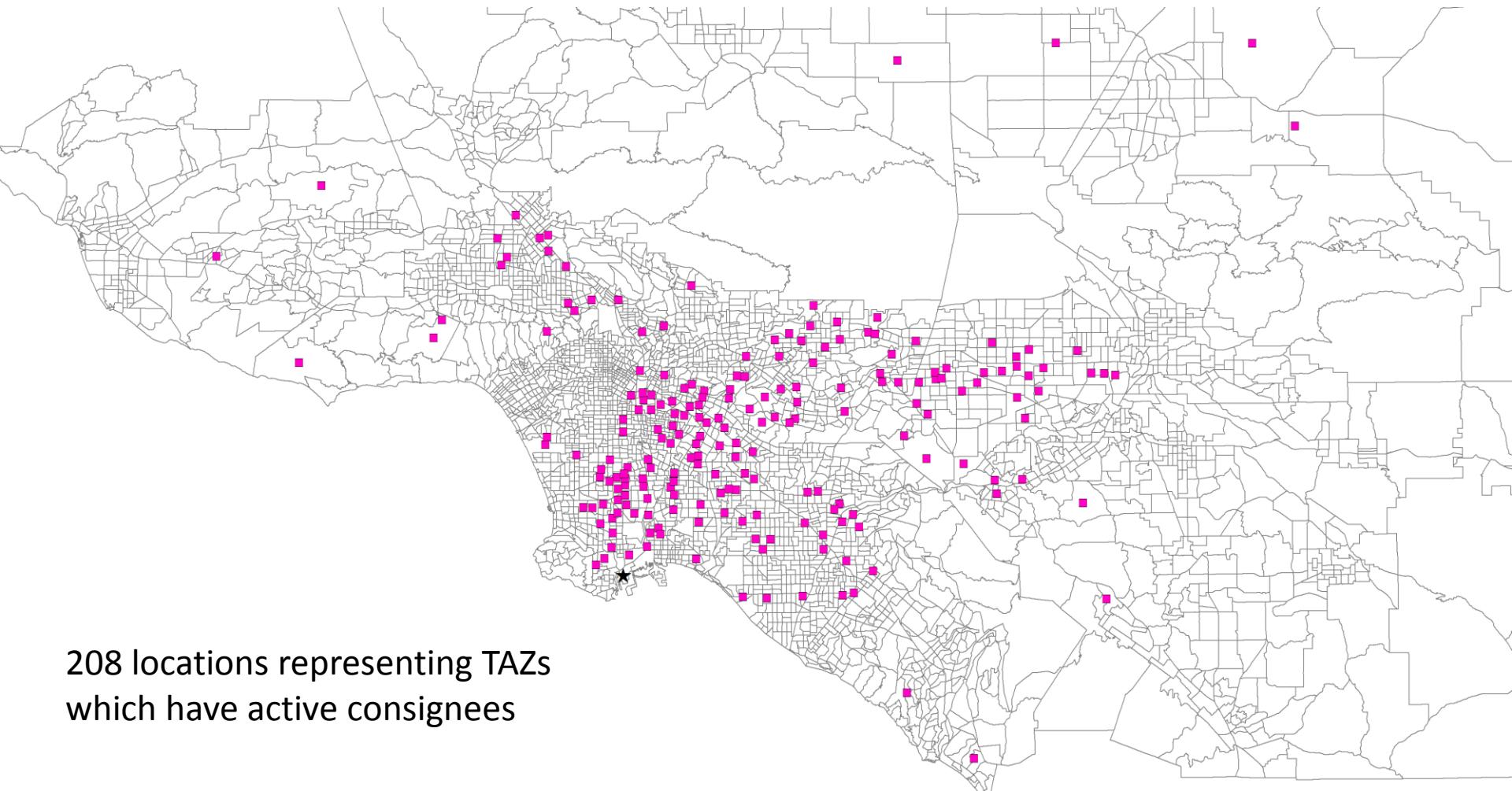
$$\sum_{t \neq k} e_{tk} + \sum_{l=1}^L \sum_{i=1}^n \theta_{il} (1 - \alpha_i) S_i x_{ik}^l - \sum_{t \neq k} e_{kt} - \sum_{l=1}^L \sum_{j=1}^m \theta_{jl} (1 - \beta_j) D_j x_{jk}^l = \begin{cases} D_{port}, & \text{if } k = 1 \\ 0, & \text{otherwise} \end{cases}$$

$$\sum_{t \in K} e_{tk} + e_{kt} \leq M \cdot y_k, \quad \forall k \in K$$

$$\sum_{k=1}^K y_k = p$$

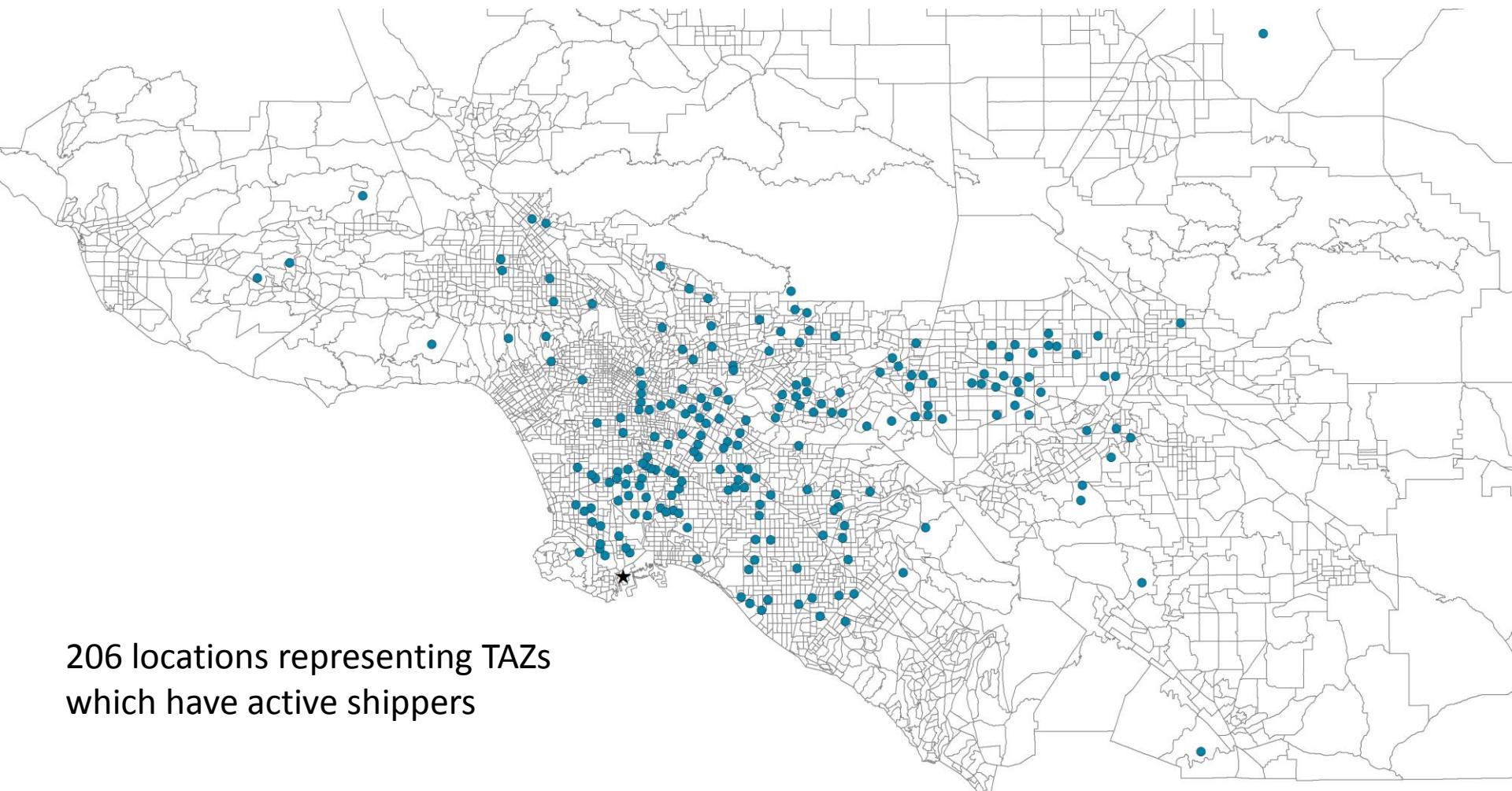
Forces  $x_{ik}^l$  to be 1 if  $k$  is the  $l^{\text{th}}$  closest depot to consignee  $i$ .  
 (Generalized Closest Assignment constraint due to Church and Cohen)

# Consignee Locations



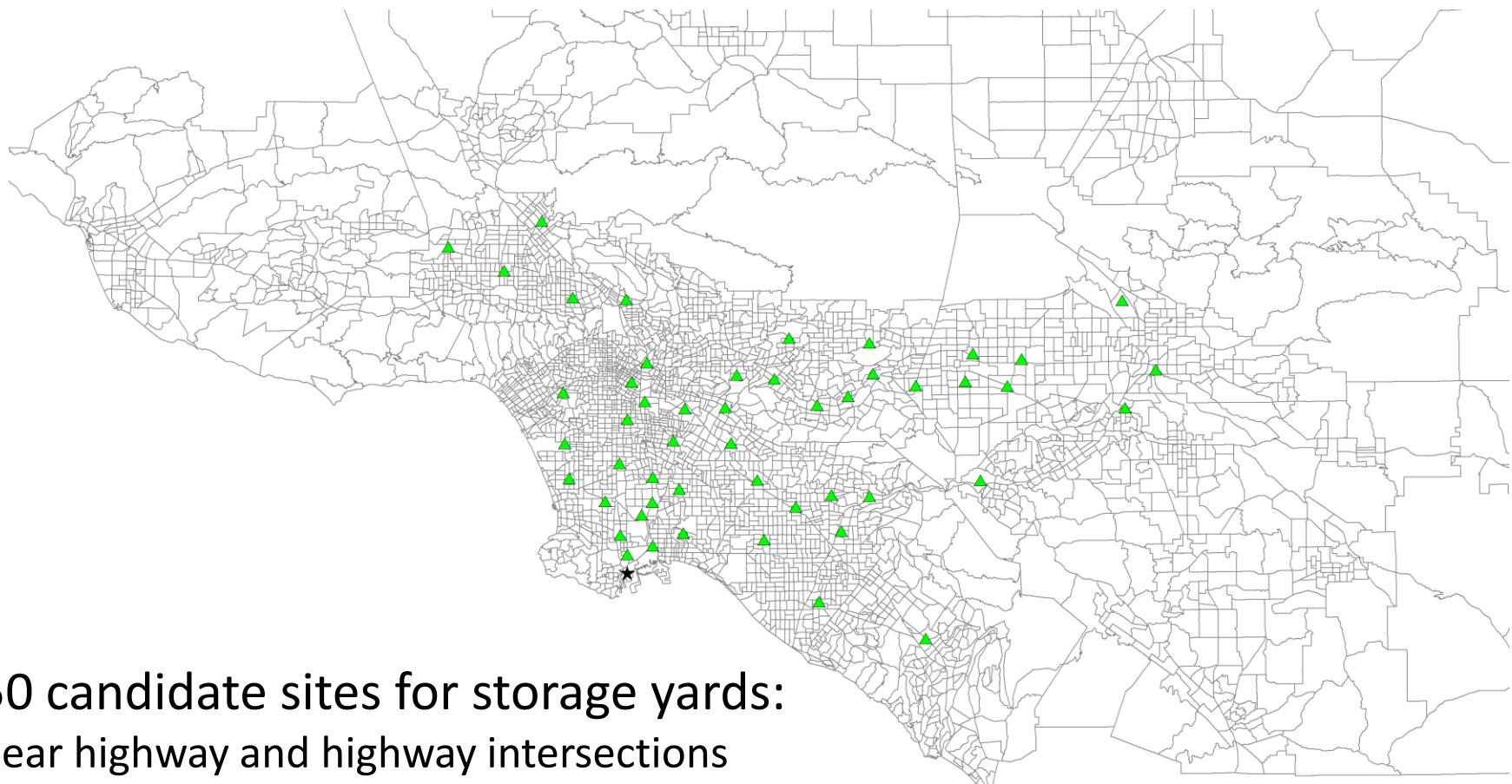
208 locations representing TAZs  
which have active consignees

# Shipper locations



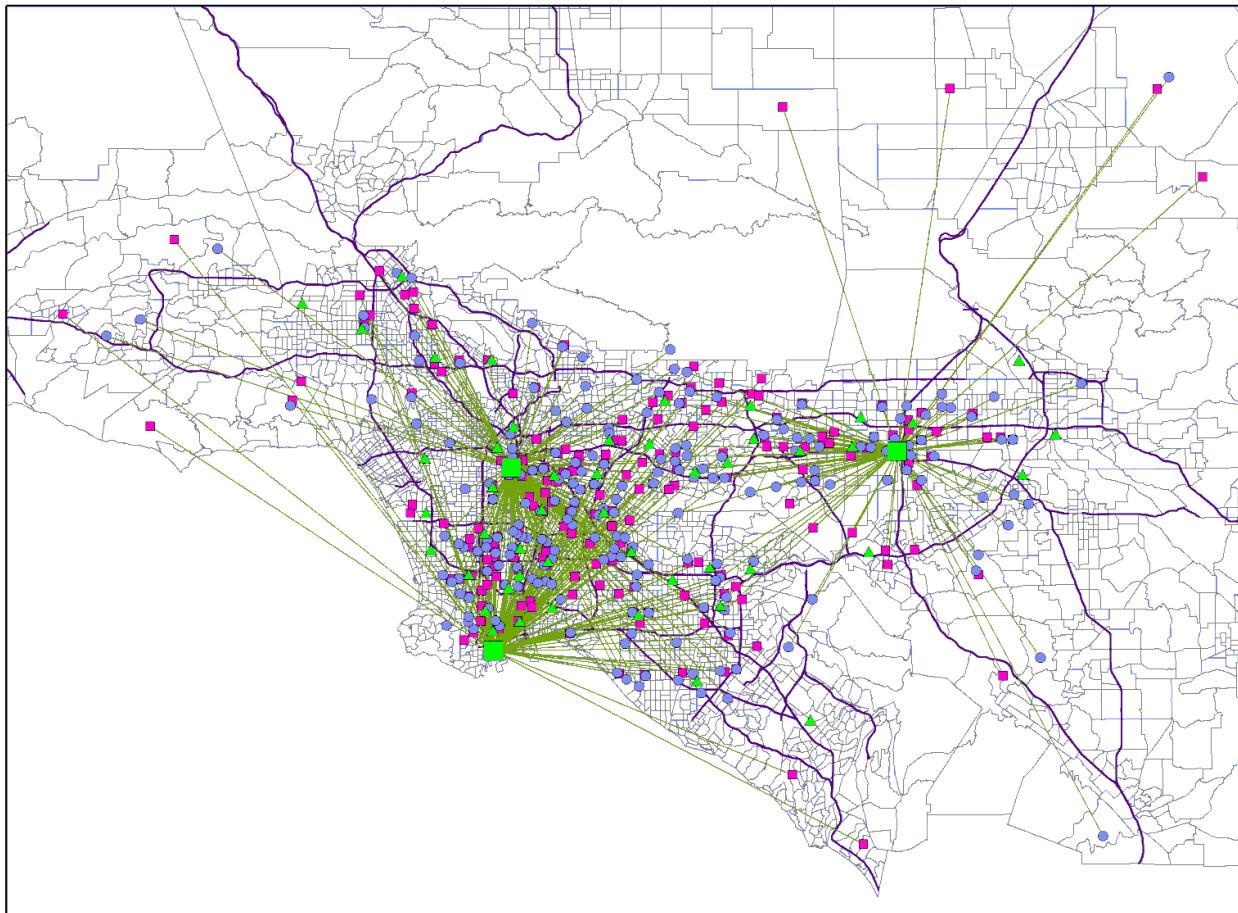
206 locations representing TAZs  
which have active shippers

# Potential sites



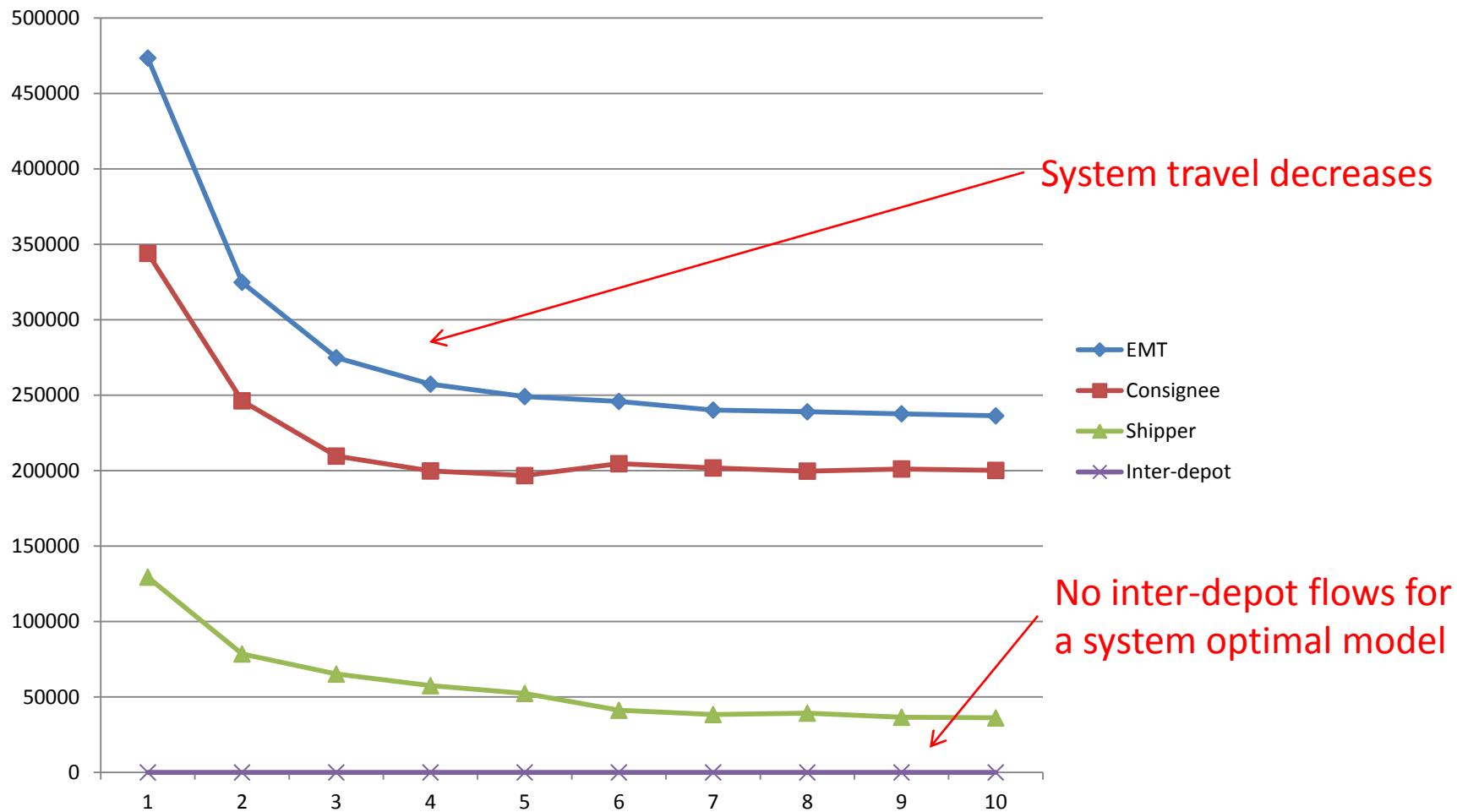
50 candidate sites for storage yards:  
near highway and highway intersections  
where there exists a high concentration of distribution centers.

# OSEM1 result for 10% street turns and 3 storage yards (including port)



VMT in moving empty containers can be reduced by more than 30% using 1 depot away from the port!

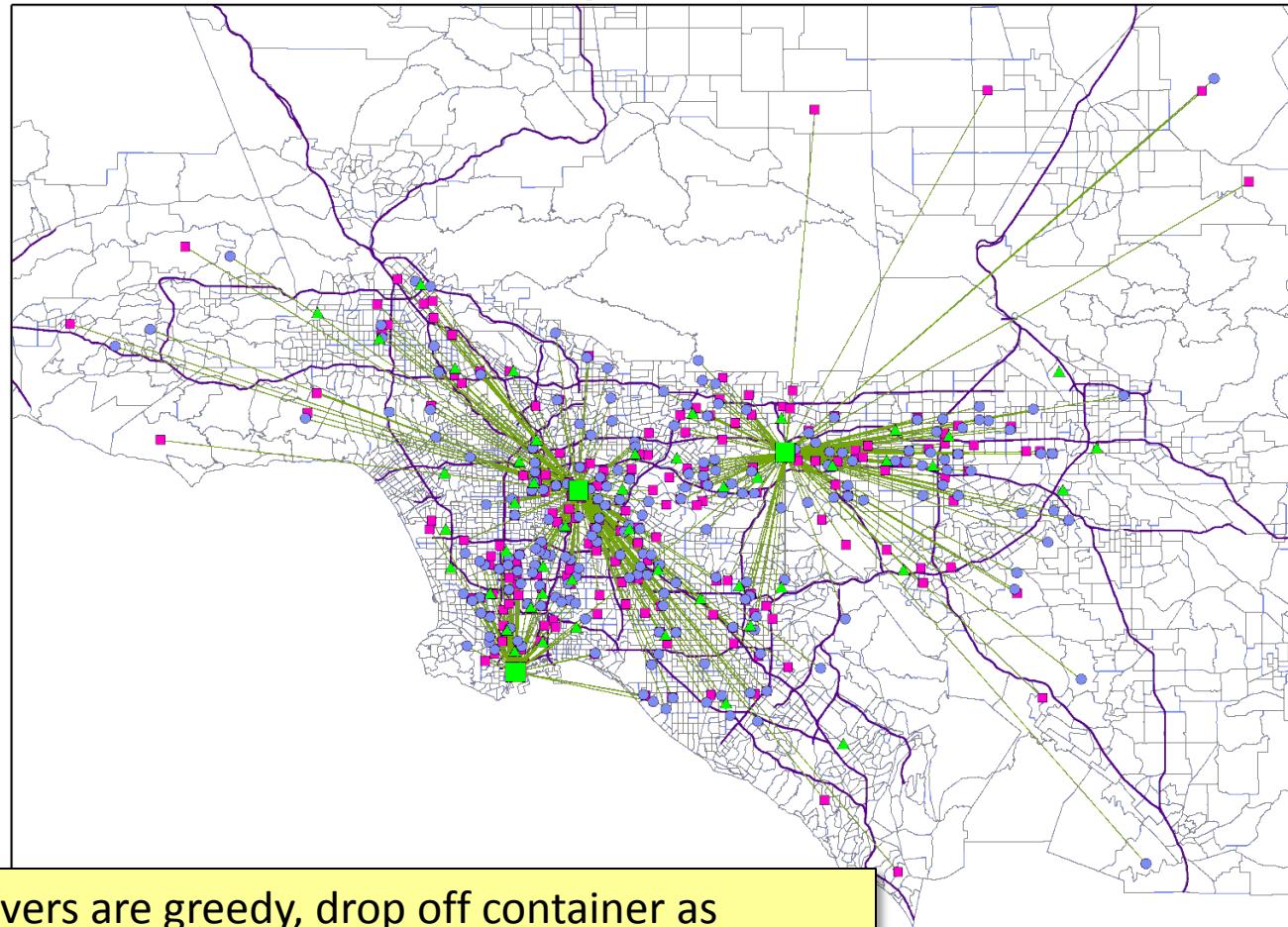
### OSEM1 Travel breakdown with street turns = 10%



# Perspective: achieving **only half** of the savings yields.....

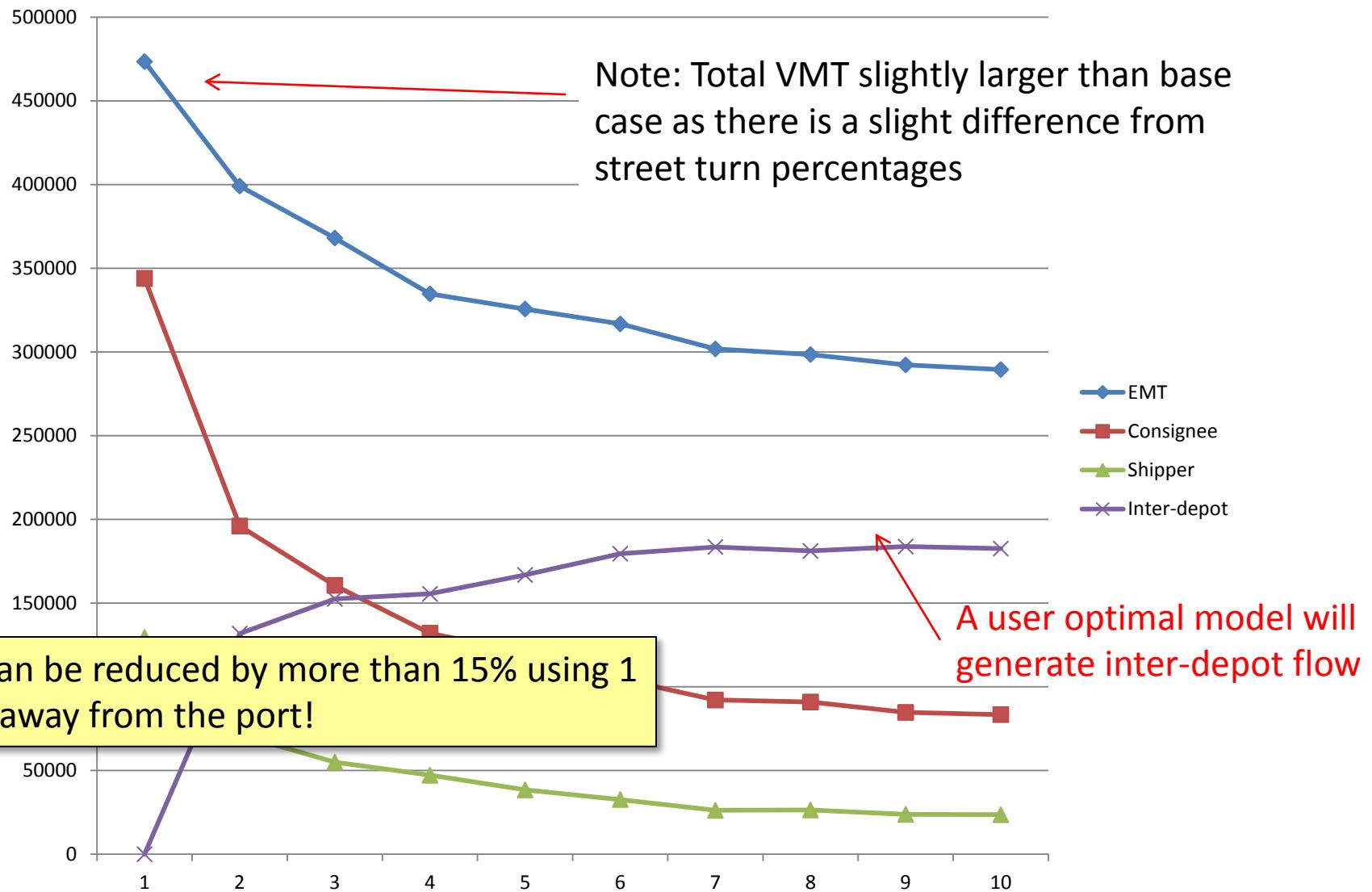
- 75,000 km / day reduction for 1 additional storage yard
- Equals 46,500 miles/day reduction in VMT
- saves 5,200 gallons of fuel (9 mpg)
- Saves \$15,600 per day in fuel (\$3 /gal.)
- Reduces CO<sub>2</sub> emissions by 115,000 lbs per day

# OSEM2 result for 10% street turns and 3 storage facilities

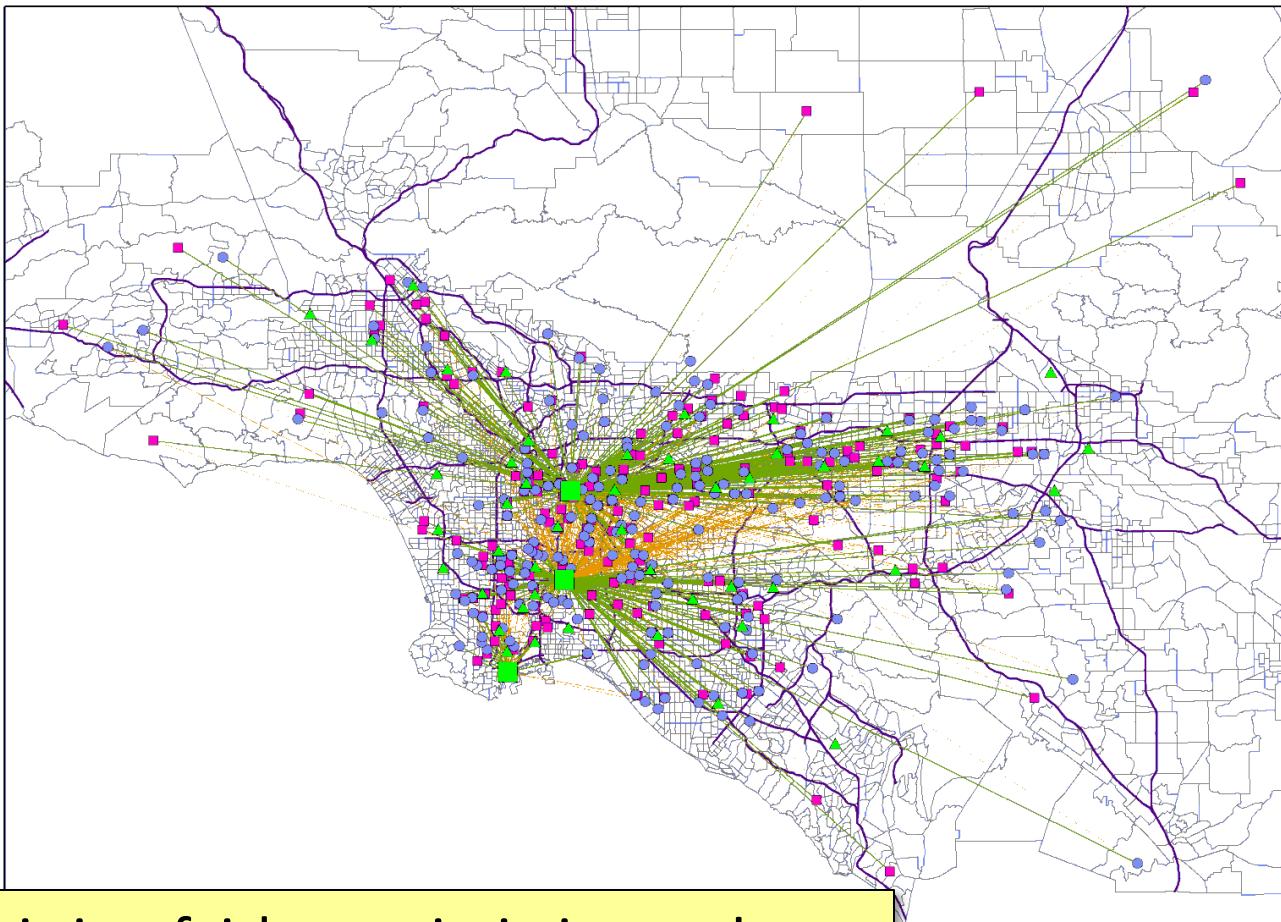


Drivers are greedy, drop off container as quickly as possible

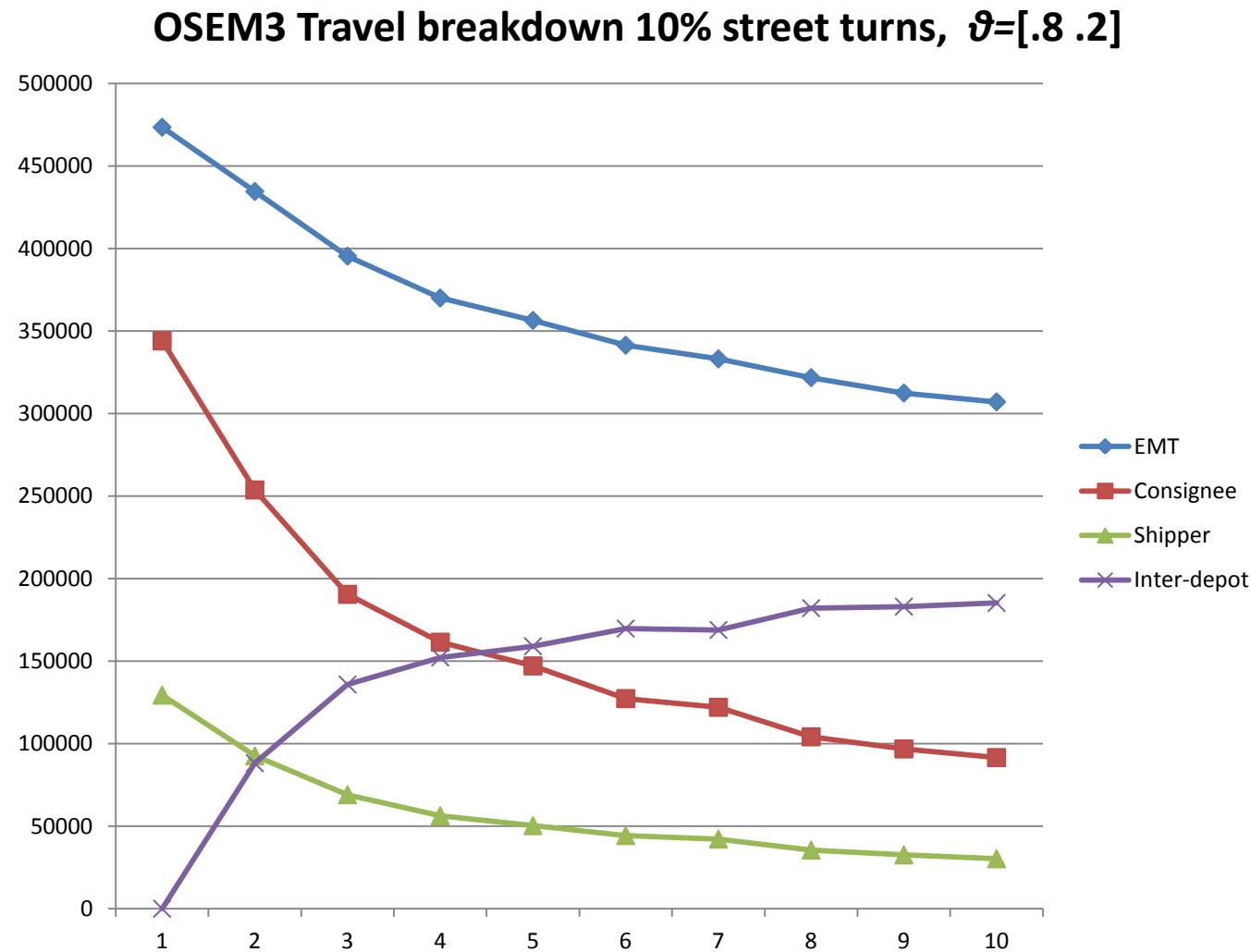
## OSEM2 Travel breakdown with 10% street turns



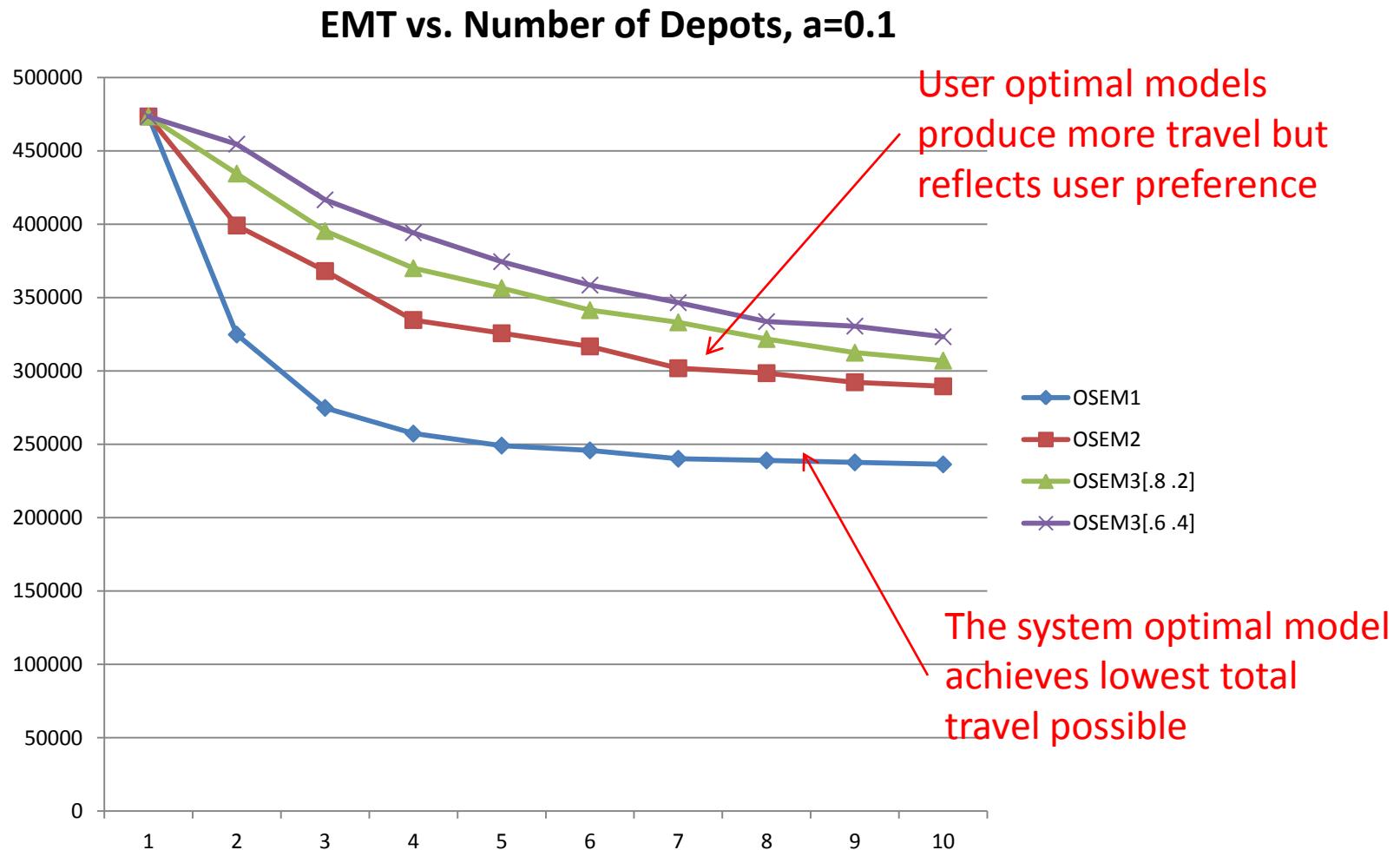
# OSEM3 result for 10% street turns and 3 storage yards, with [0.8,0.2]



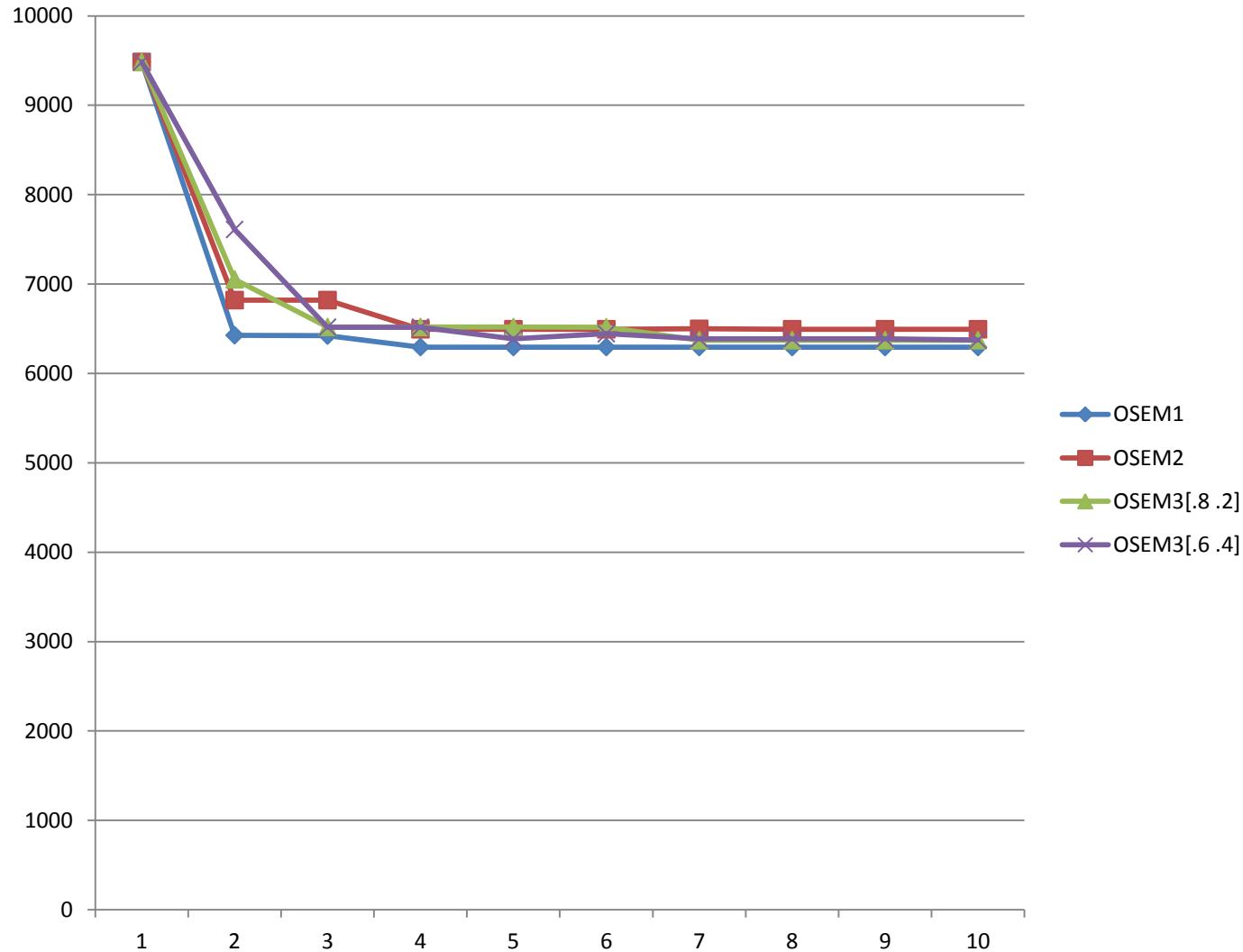
VMT can be reduced by more than 10% using 1 depot away from the port!



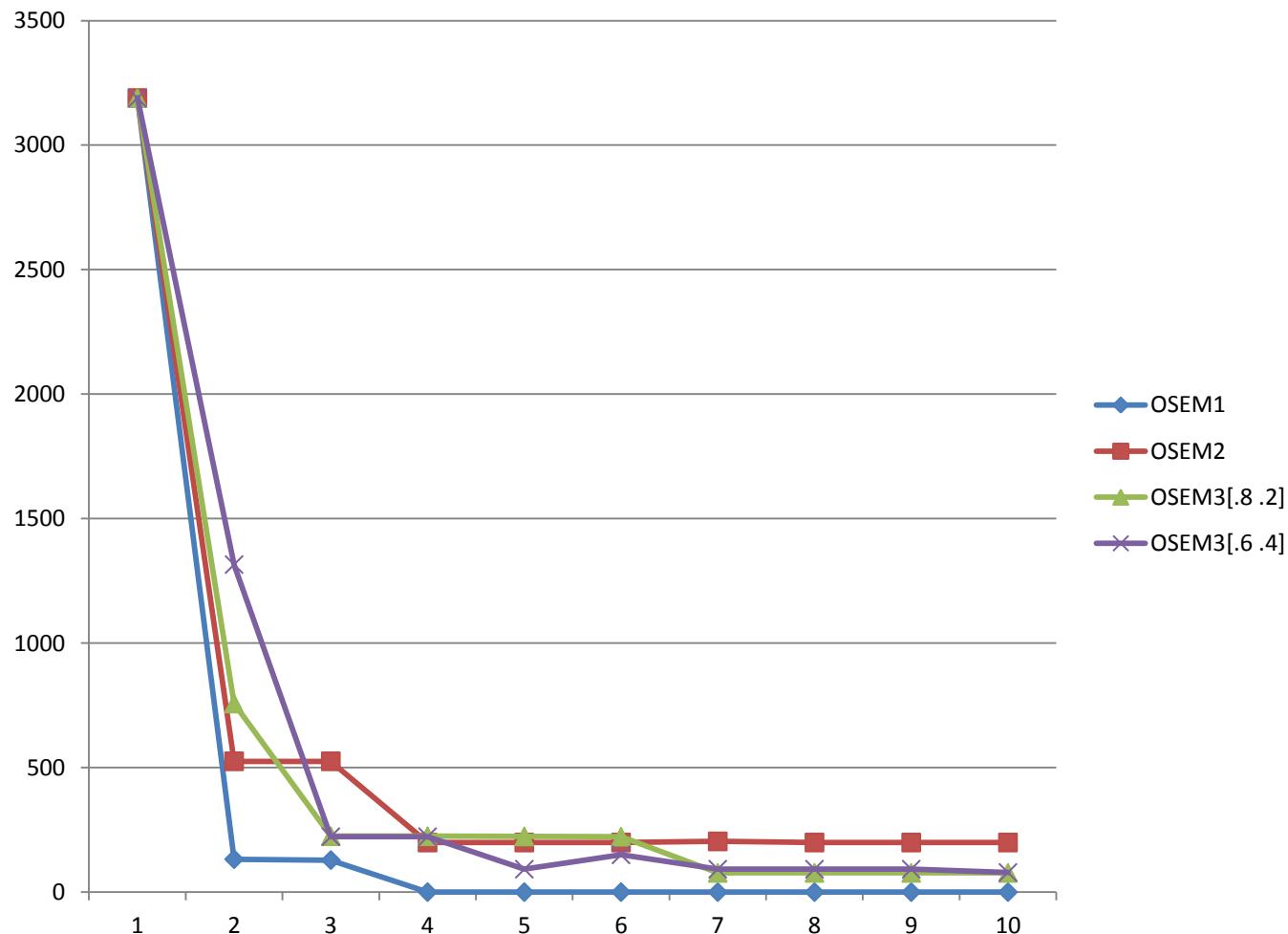
# Model results: User opt. vs. System opt.



# Model results: Empties entering the port



# Model results: Empties leaving the port



# Empties moving in/out of port: 1 storage yard

- Empties entering: 8,300 reduced to 6,500
- Empties leaving: 3,200 reduced to 500
- Total reduction of empties entering or leaving port 4,500 per day
- Note: many trips are preceded by a bobtail leg:
  - Entering as a bobtail to pick up an empty or full
  - Exiting as a bobtail after dropping off an empty or full
  - Thus, there is the possibility of better trip coordination to reduce traffic further

# Summary

- We now have an accurate picture of the potential savings associated with developing away from port storage yards for empties
  - Significant reductions in VMT
  - Significant reductions in port entries
  - Significant reduction in vehicle operator times (may allow them to do more trips in a given day)
  - Fuel savings and emissions reductions

# End/Aft



Image from [gcaptain.com/maritime/blog](http://gcaptain.com/maritime/blog)

# What makes sense as a next step

- Simulate empty transport trips and estimate impacts on air emissions with added storage yards
- Estimate traffic impacts on I-710, I-110, and 47
- Develop a truck simulation model for simulating movement of drayage truck activity to focus on bobtail movement (moves when the truck is not pulling an empty container)

# References

This presentation is based principally upon the following two papers:

- Lei and Church (2011) "Constructs for Multilevel Closest Assignment in Location Modeling, *International Regional Science Review*"
- Lei and Church (2011), Locating Short term empty container storage facilities to support port operations: a user optimal approach, *Transportation Research E*

The following references are relevant to the subject of empty container storage and movement

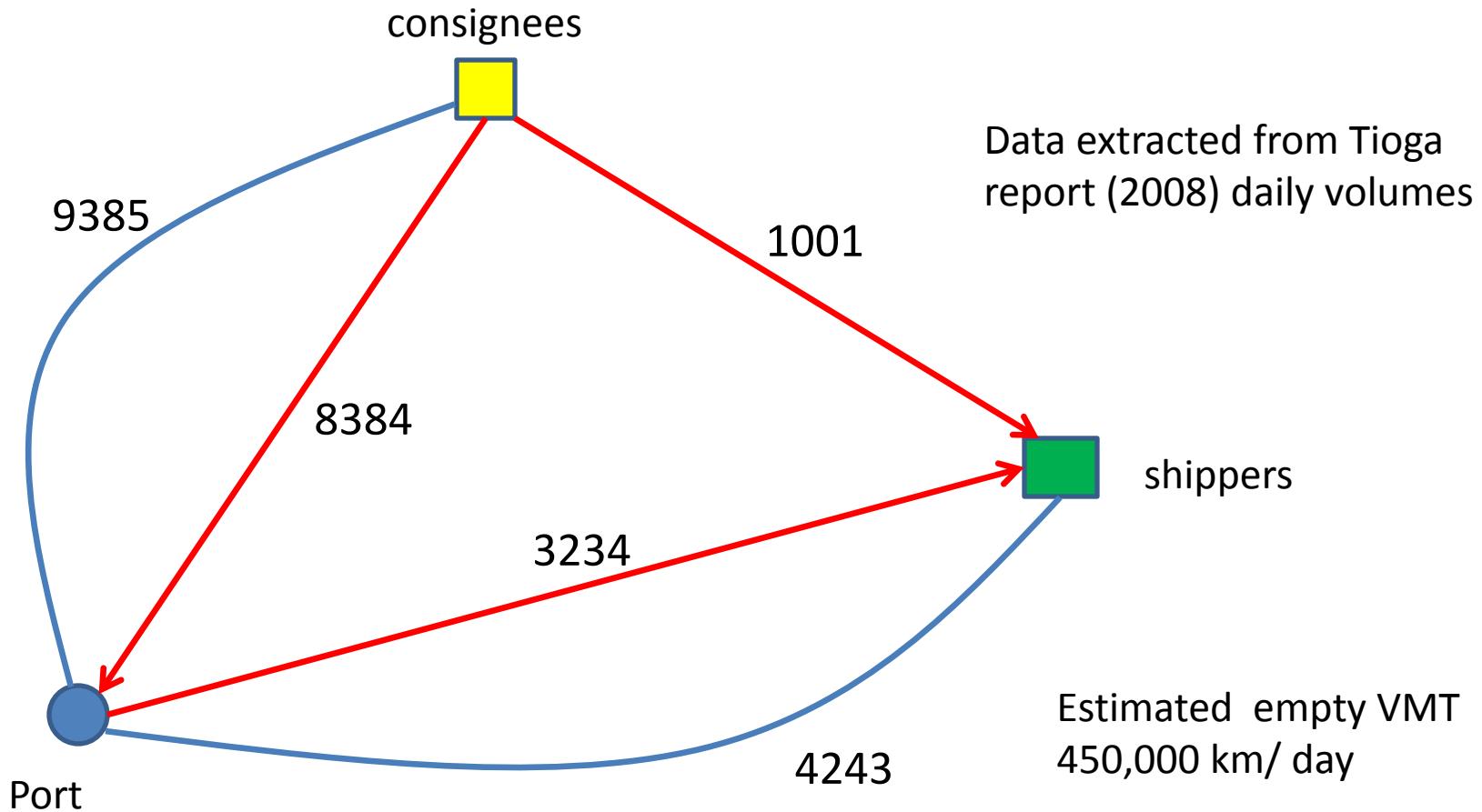
- Gendron, B. and T.G. Crainic (1995) "A branch and bound algorithm for depot location and container fleet management," *Location Science* 3: 39-53.
- Imai, Nashimura and Current (2007)
- Shen & Khoong (1995)
- Namboothiri & Erera (2004)
- Jula, Dessouky, Ioannou, & Chassiakos (2005)
- Lopez, E. (2003)
- Davies, P. (2006)
- Cheu, Chew, and Wee (2003)
- Boile, M. (2007) TRB
- Crainic, Gendreau, and Dejax (1993)
- Jula, Chassiakos, and Ioannou (2006)
- Choong, Cole, and Kutanoglu (2002)
- Chang, Jula, Chassiakos, Ioannou (2006)
- Bourbeau, Crainic, and Gendron
- Dejax and Crainic (1987)
- Crainic, Gendreau, Soriano, and Toulouse (1993)
- Gendron and Crainic (1995)
- Crainic, Dejax, and Delorme (1989)

# *Models incorporating assignment beyond the closest facility*

- At times the closest facility may be busy and unable to serve
  - Weaver, J.R. and R.L. Church (1985) "A median location model with nonclosest facility service," *Transportation Science* 19: 58-74.
  - Pirkul, H. and D. Schilling (1989) "The capacitated maximal covering location problem with backup service," *Annals of Operations Research* 18: 141-154.
  - Narasimhan, S., H. Pirkul and D.A. Schilling (1992) "Capacitated emergency facility siting with multiple levels of backup," *Annals of Operations Research* 40: 323-337.
- At times the closest facility may fail or be closed due to an emergency
  - Snyder, L.V. and M.S. Daskin (2005) "Reliability Models for Facility Location: the expected failure cost case," *Transportation Science* 39: 400-416.
- The properties of maintaining closest assignment constraints
  - Gerrard, R.A. and R.L. Church (1996) "Closest assignment constraints and location models: properties and structure," *Location Science* 4: 251-270.
- Planning for system failure :
  - Church, R.L., M.P. Scaparra, and R. Middleton (2004) "Identifying critical infrastructure: interdiction median and covering problems," *Annals of the Association of American Geographers* 94:

the following slides are for reference only

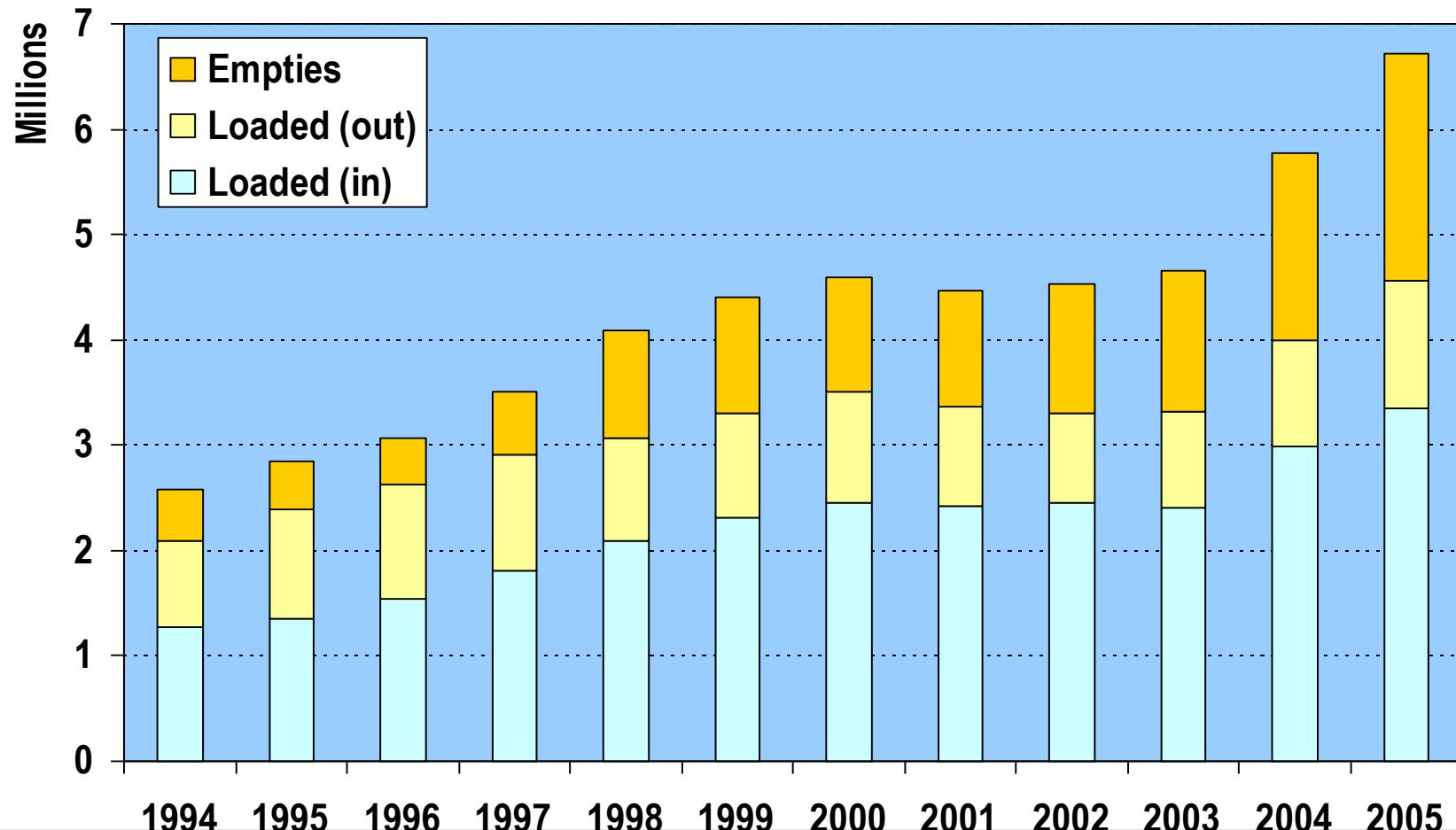
# Estimating empty container VMT



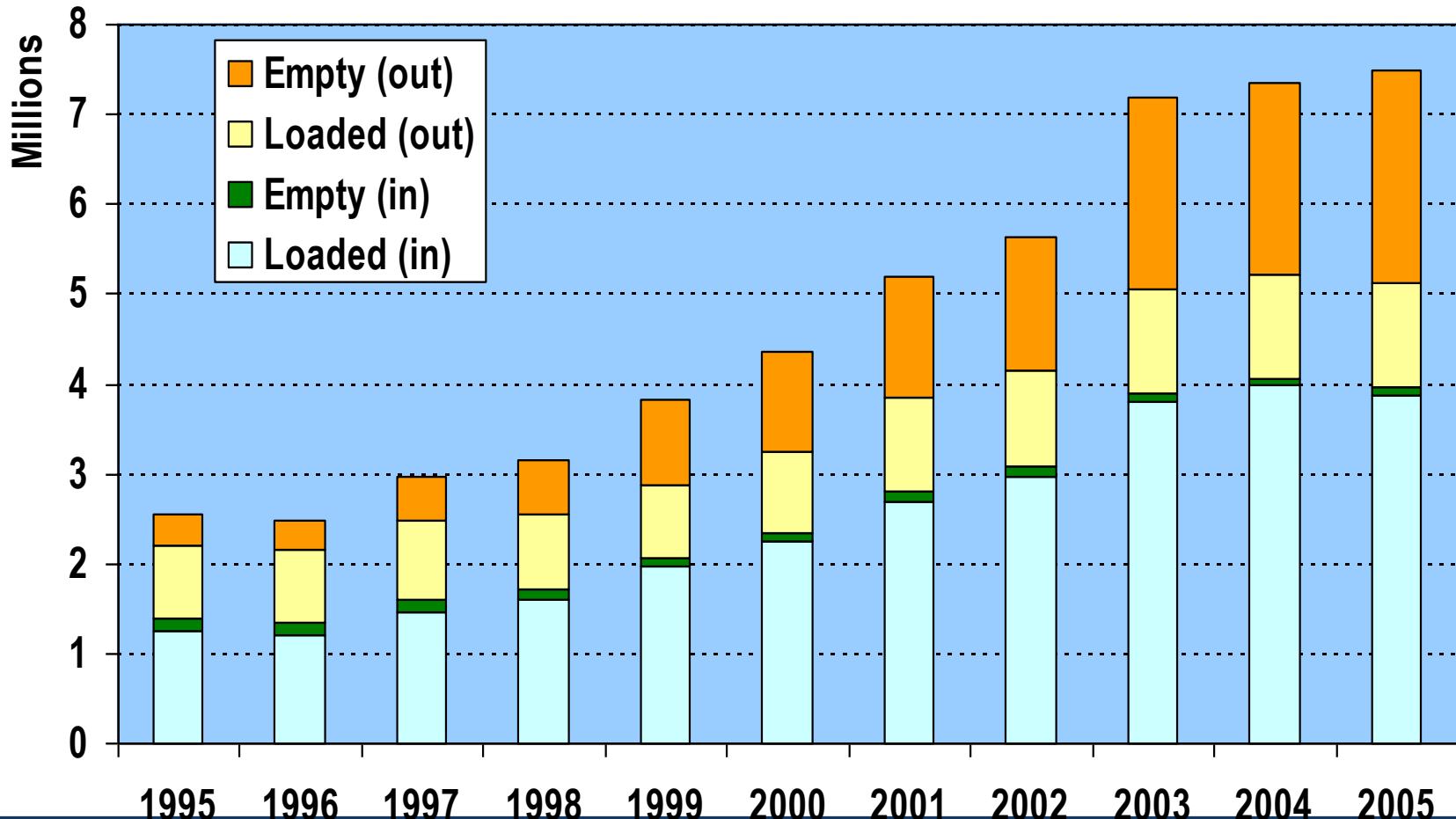
# Import vs. Export

- Trade imbalance: imports exceed exports
  - Imports: nearly 100% full
  - Exports: nationally 70% full  
LALB, 30-40% full
- Export containers to China: wastepaper, electronic waste, and scrap metals
- Terminals want empties returned as soon as possible
  - Makes sense to terminal operator since many are reloaded onto ships empty

# Containers handled by Port of LB, in millions of TEUs



# Containers handled by Port of LA, in millions of TEUs



# Optimal Storage of Empties Model (OSEM)

- System-wide objectives:
  - Minimize the total empty container travel in terms of distances or travel times
  - Respect the need for empties at the port for global repositioning to *e.g.* Asia
  - Keep empty container traffic at the port complex to a minimum



Port of long beach image FTR International INC