

# **Optimal Location of Refueling Stations for Hydrogen Railroads**

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# Outline of Presentation

1. **Why Hydrail?**
2. **Prior Research on Locating Refueling Stations**
3. **The Flow-Refueling Location Model**
4. **Extending the Model to Railroads**
5. **Conclusions and Future Work**

# Hydrogen Road Transport Faces a Chicken-and-Egg Dilemma...

## Which Comes First?

**Mass  
Production of  
Vehicles**



**Refueling  
Infrastructure**



# Hydrail: No Dilemma!



Source: [http://www.uprr.com/customers/intermodal/emp/graphics/emp\\_map\\_lg2.gif](http://www.uprr.com/customers/intermodal/emp/graphics/emp_map_lg2.gif)

# Why Hydrail?

	<b>Rail</b>	<b>Highway</b>
<b>Carriers</b>	<b>7 Class I 549 Total Railroads</b>	<b>662,000 motor carriers</b>
<b>Powered Vehicles</b>	<b>20,000 locomotives (53% pre-1990)</b>	<b>79,000,000 trucks 139,000,000 cars</b>
<b>Miles</b>	<b>170,000</b>	<b>3,906,000</b>
<b>Freight ton- miles</b>	<b>1.60 billion</b>	<b>1.26 billion</b>
<b>CO<sub>2</sub> emissions</b>	<b>43 Tg</b>	<b>341 Tg (trucking)</b>

# Purpose of Our Research

**To facilitate the transition to a hydrogen economy by optimizing the development of the hydrogen refueling infrastructure.**

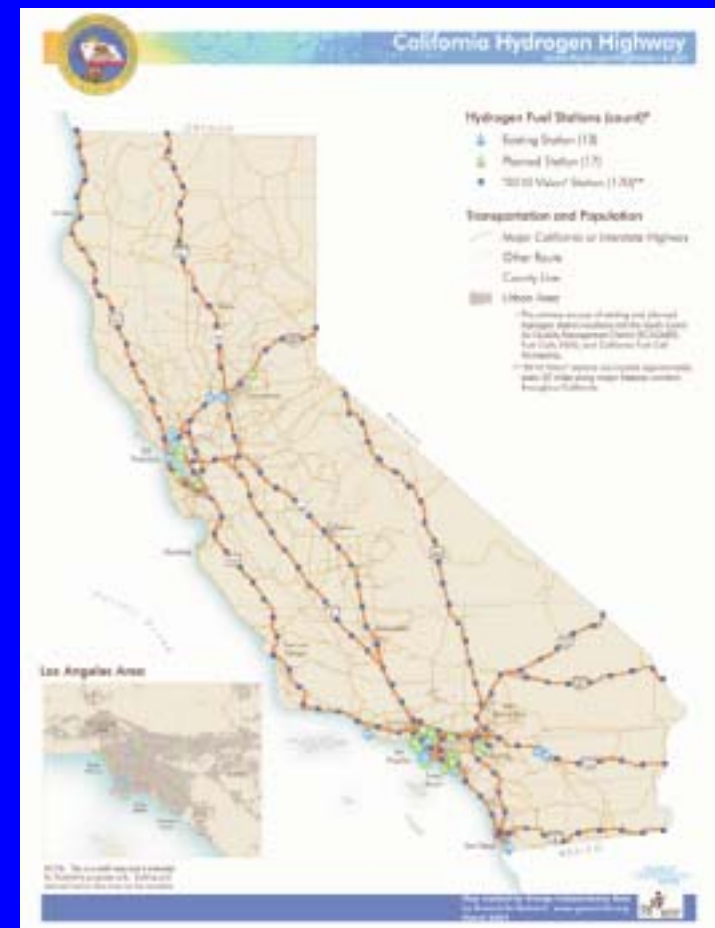
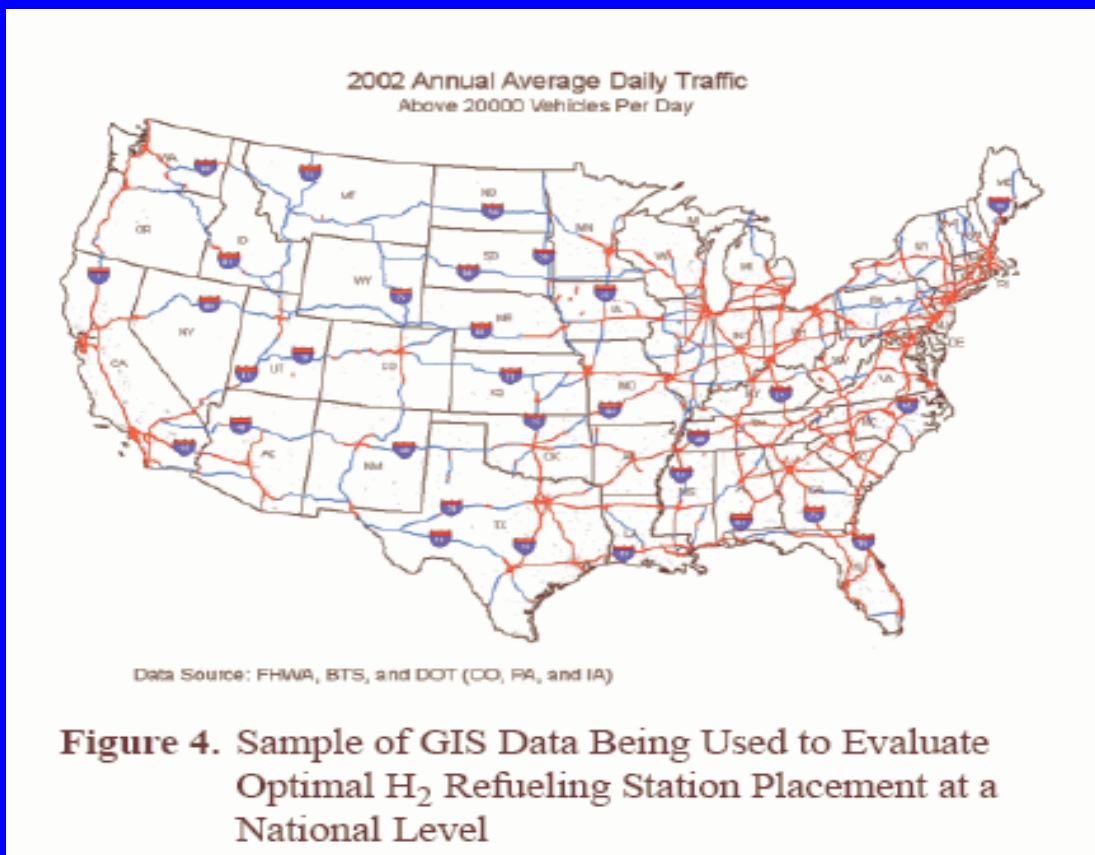
# Prior Research on Optimal Location of Refueling Stations



# GIS Approaches

## National Renewable Energy Lab (NREL)

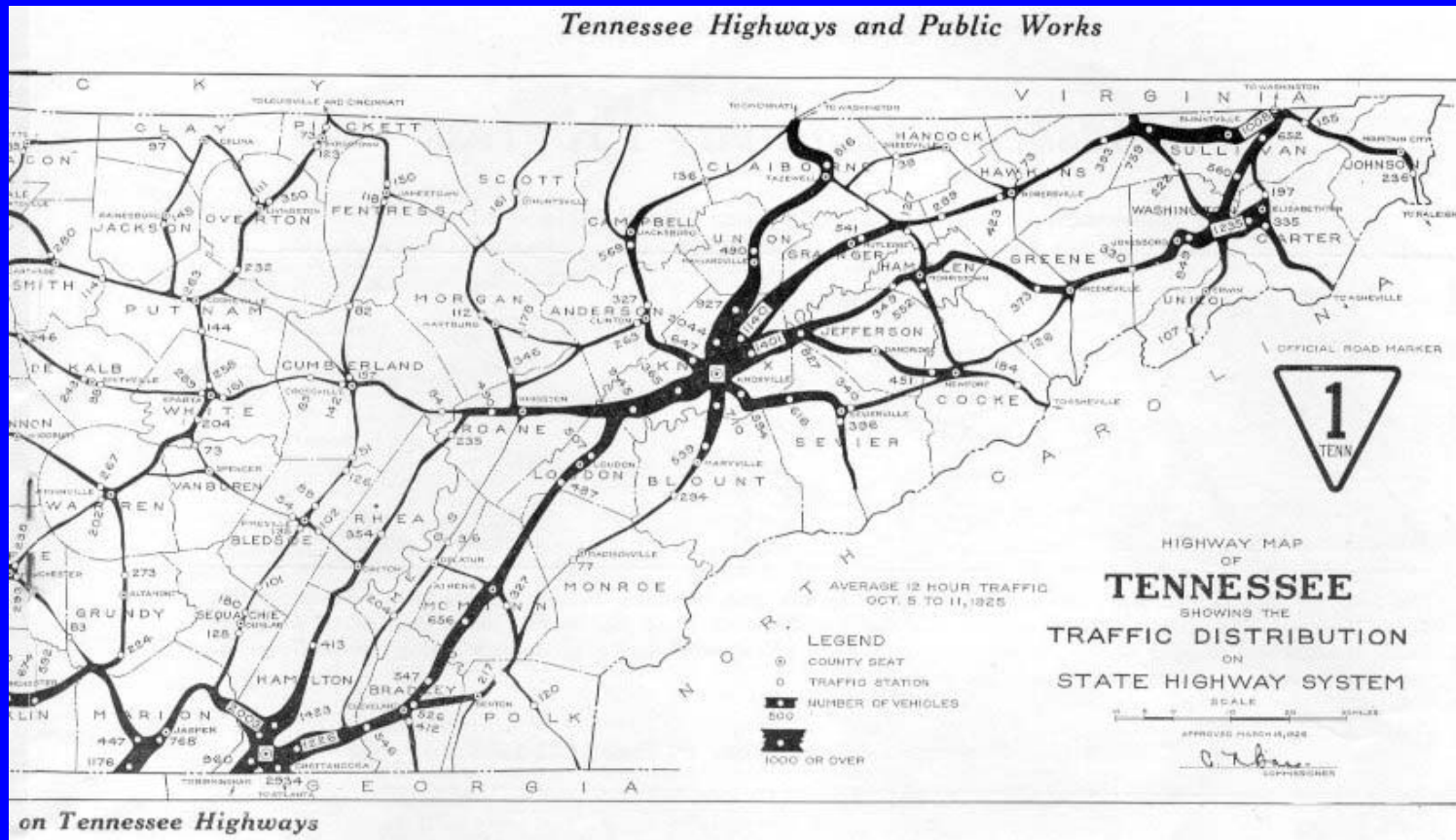
## California Hydrogen Highway





# Maximize Arc Flows

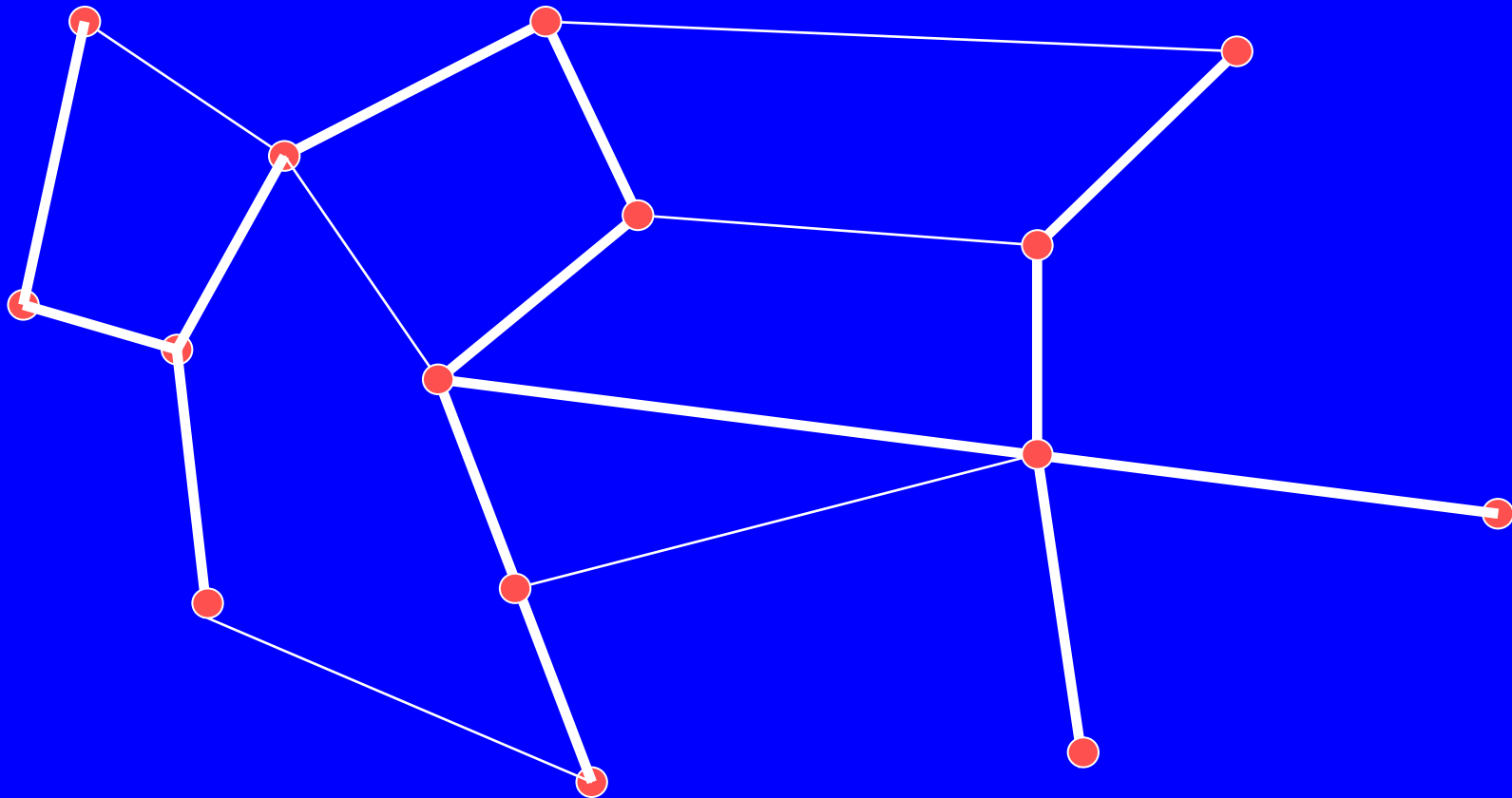
- Goodchild and Noronha (1987)



*Note: Map is not from Goodchild and Noronha, but for illustrative purposes only.*

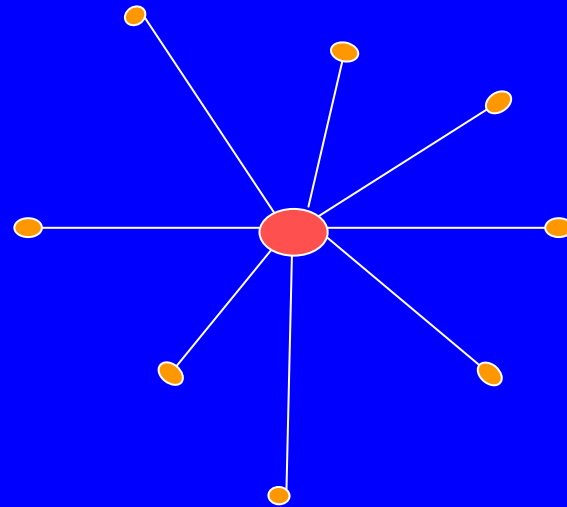
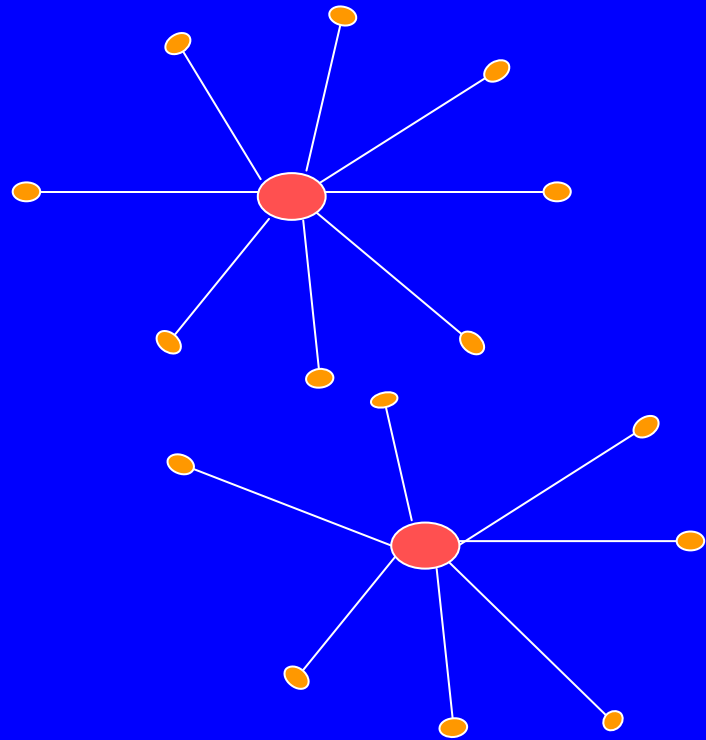
# Minimum Spanning Tree

- Bapna et al. (2002)



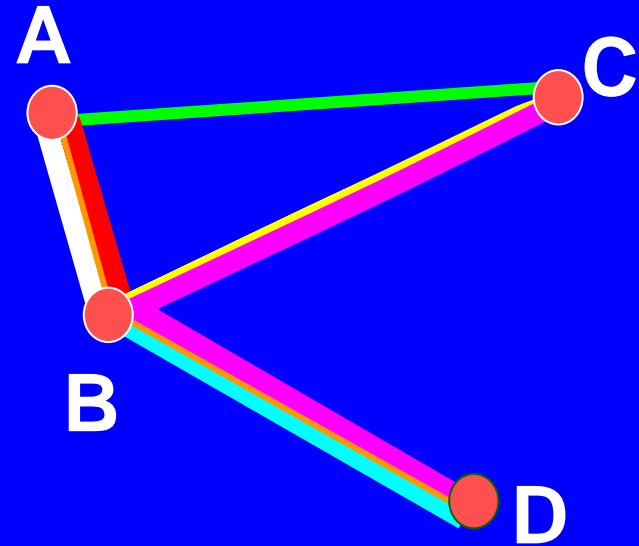
# Mimize Average Distance

- **Nicholas (2004)**



# Flow-Capturing Models

- Hodgson (1990)
- Demand consists of paths, not points.
- Locate  $p$  facilities to capture the maximum volume of passing flows.



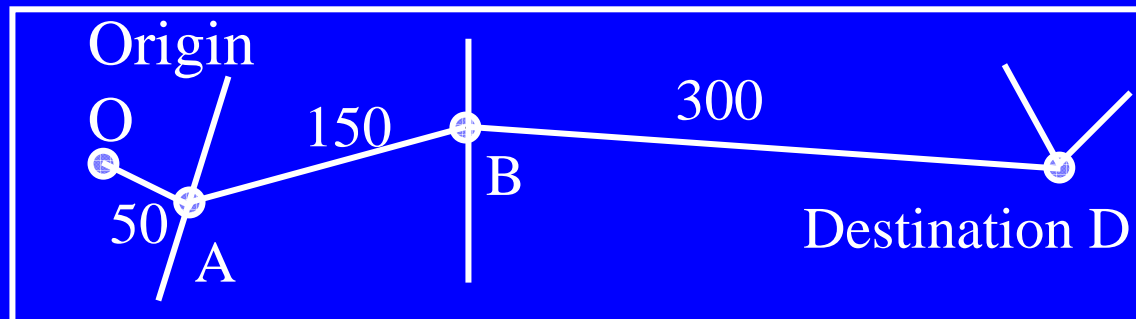
	A	B	C	D
A	-	12	7	2
B		-	3	5
C			-	9
D				-

# The Flow-Refueling Location Model (FRLM)

- **Flow capturing** assumes that a single facility anywhere on the path can capture the demand.
- For **flow refueling**, however, the limited range of vehicles means that some trips require multiple refuelings.
- **Range** = maximum distance a vehicle can travel between refuelings.

# Dealing with Vehicle Range

- Round-trip distance.
- Nodes not necessarily optimal.
- Several facilities may be necessary to refuel a path.



# The Flow-Refueling Location Model is an Integer Linear Program

## Objective

$$\text{Max} \sum_{q \in Q} f_q Y_q$$

## Constraints

$$\sum_{h \in H} b_{qh} v_h \geq Y_q \quad \forall q \in Q$$

$$a_{hk} X_k \geq v_h \quad \forall h \in H; k \in K$$

$$\sum_{k \in K} X_k = p$$

$$X_k \in \{0,1\} \quad \forall k$$

$$0 \leq Y_q \leq 1 \quad \forall q; \quad 0 \leq v_h \leq 1 \quad \forall h$$

## Variables

$Y_q = 1$  if path  $q$  is refueled; else 0

$v_h = 1$  if all facilities in combination  $h$  are open; else 0

$X_k = 1$  if facility  $k$  is open; else 0

## Coefficients

$f_q$  = flow volume on path  $q$

$b_{qh} = 1$  if combo  $h$  can refuel path  $q$

$a_{hk} = 1$  if combo  $h$  includes facility  $k$

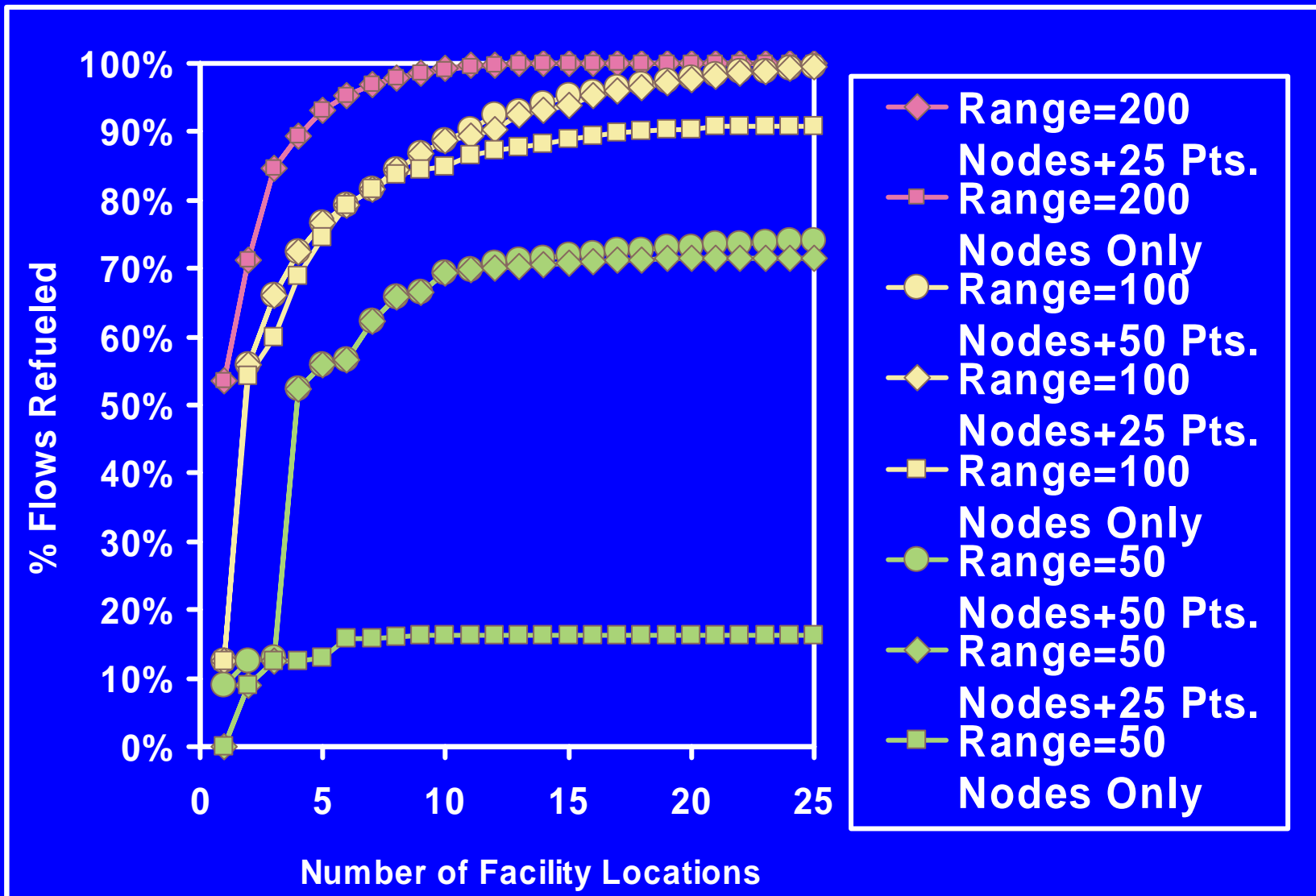
$p$  = number of facilities to be located

# Arizona Highway Case Study

- 25 largest cities.
- Main Interstate, US, and AZ highways.
- Inter-city flows only.



# Tradeoff Curve: Refuelable Trips vs. Number of Facility Locations



# p=2, Range=50, Nodes Only





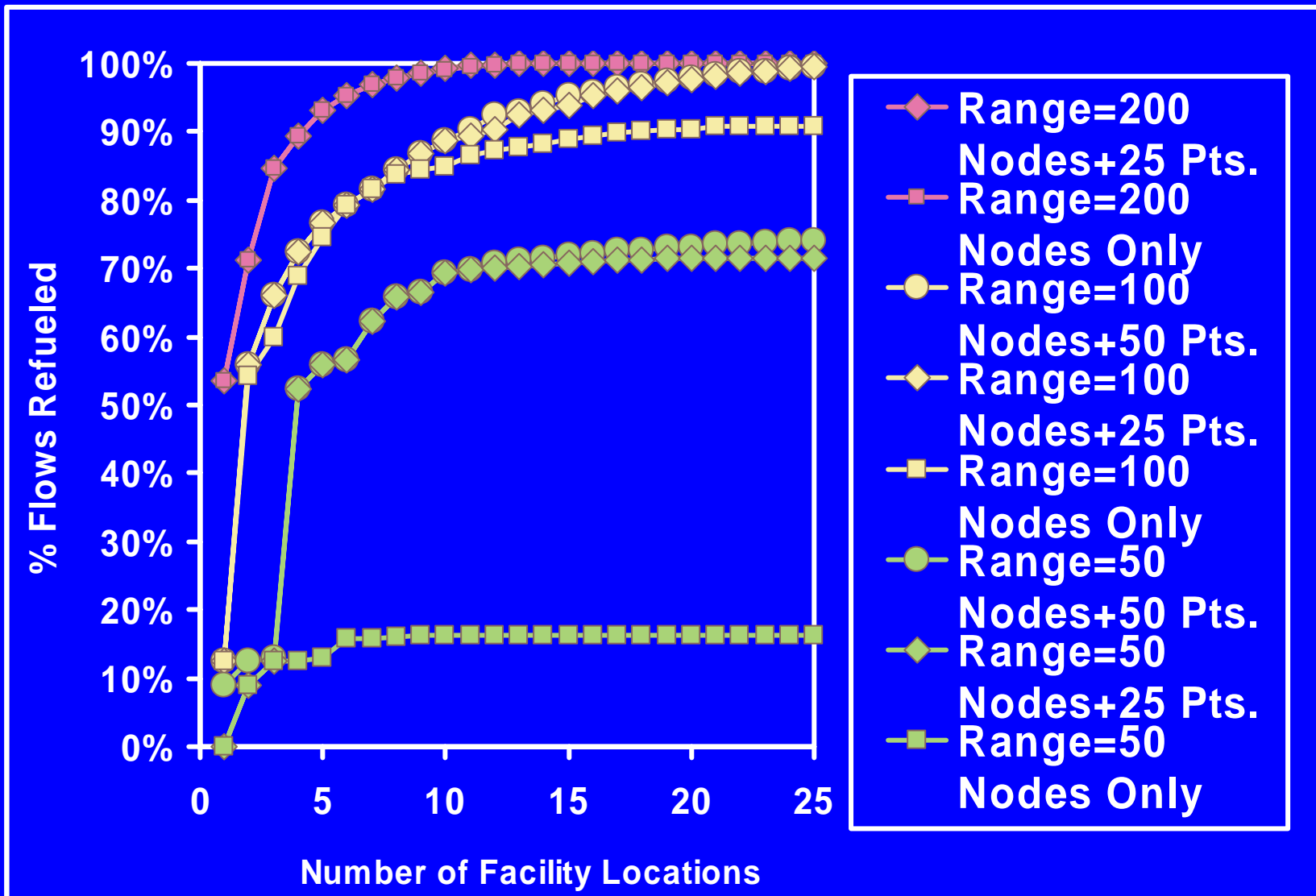
# p=4, Range=50, Nodes Only



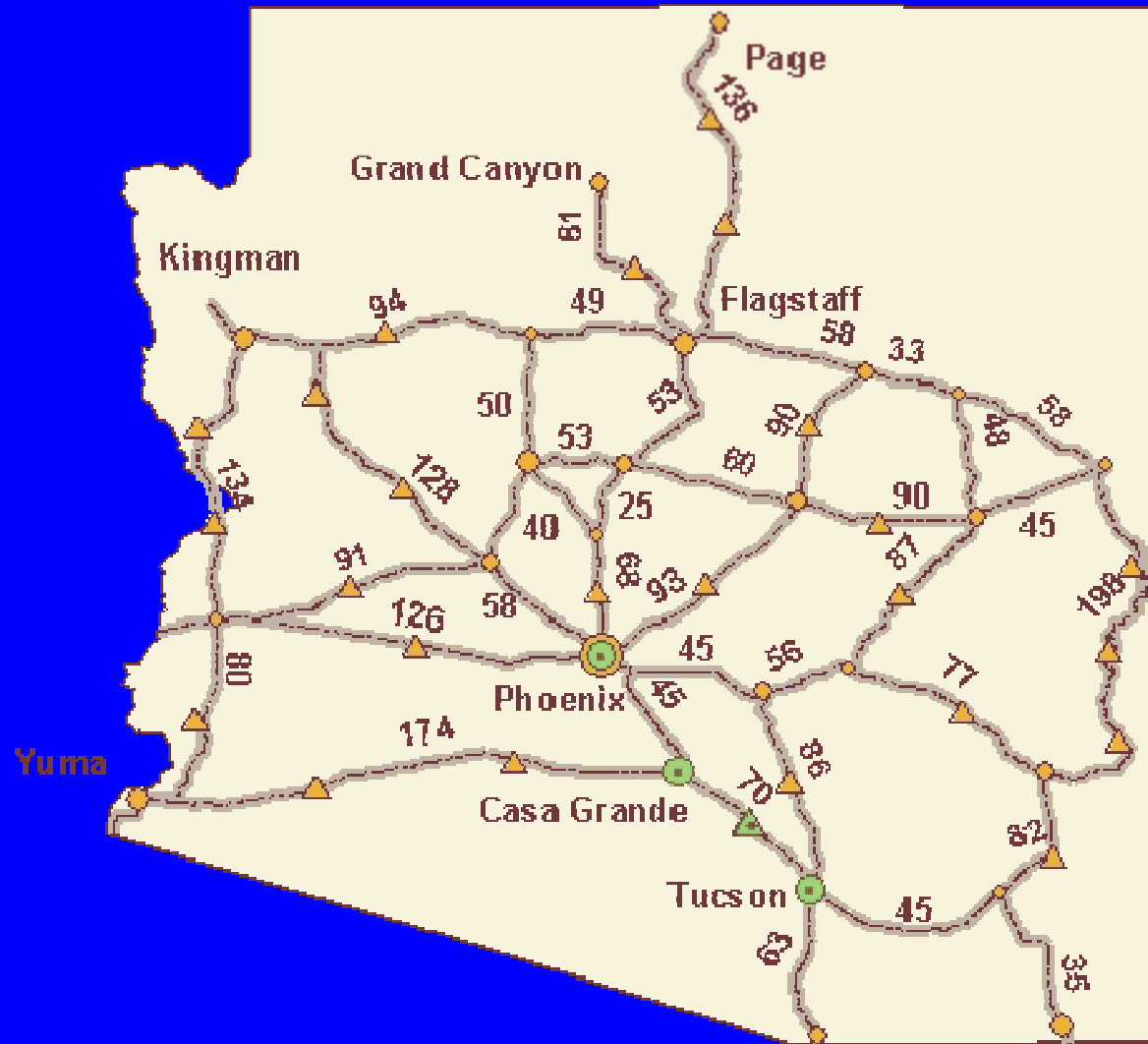
# p=5, Range=50, Nodes Only



# Tradeoff Curve: Refuelable Trips vs. Number of Facility Locations



**p=4, Range=50, Nodes+25 Minimax Pts**



**p=4, Range=100, Nodes+25 Minimax Pts**



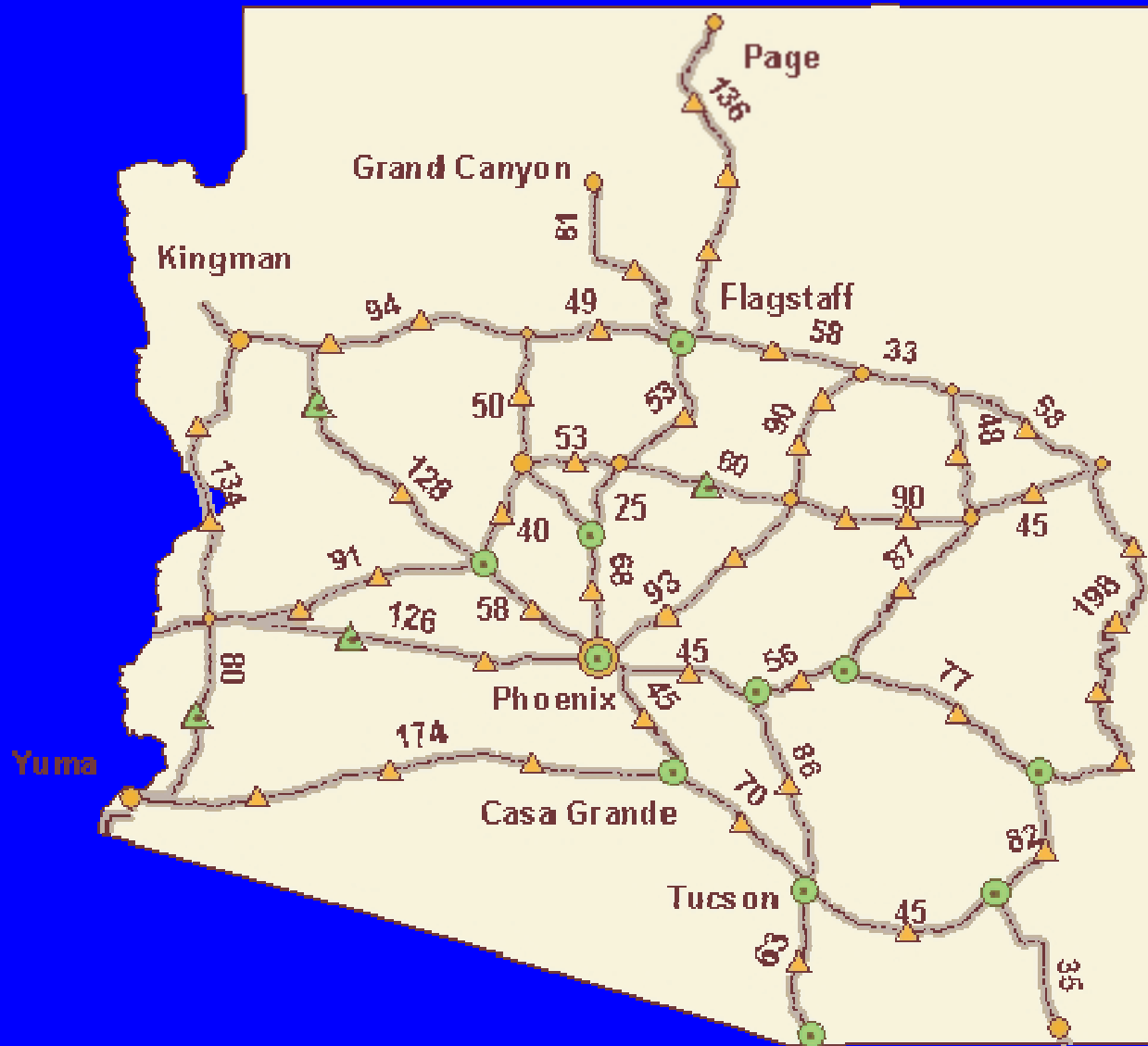


# p=4, Range=200, Nodes Only





$p=15$ , Range=100, Nodes+50 Pts

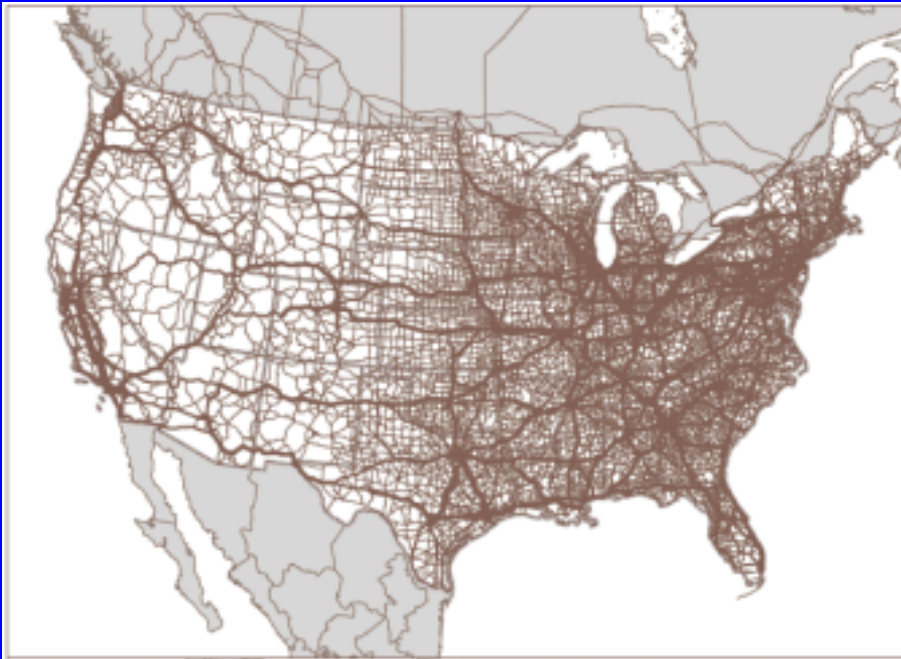


# Current and Future Research

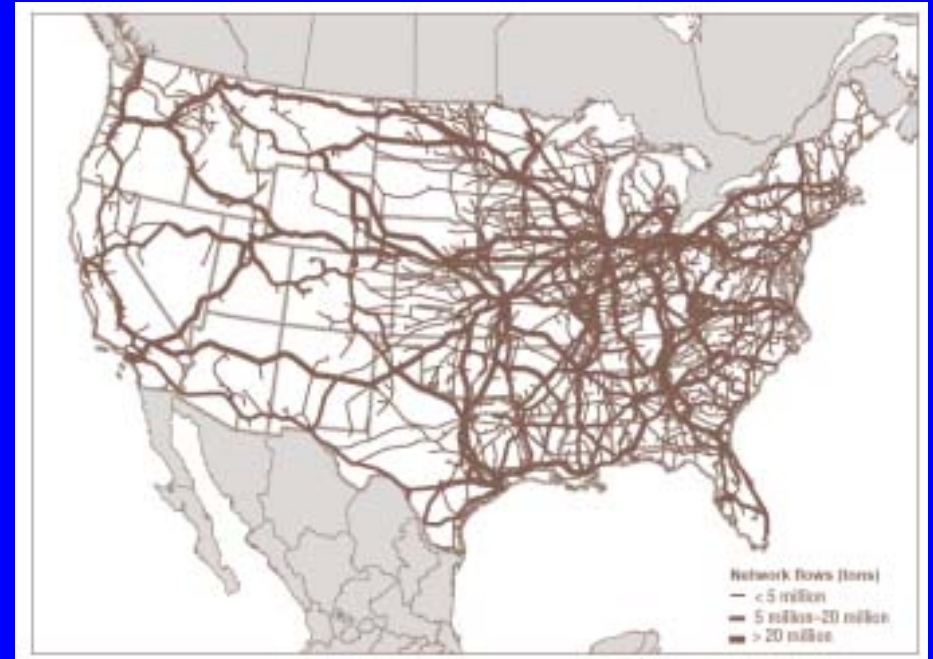
- **Capacitated facilities**
- **Faster solution methods**
- **Hydrogen rental car fleet in Orlando  
(funded by Florida Hydrogen Initiative)**
- **Detouring off shortest paths**

# H<sub>2</sub> Refueling—Road vs. Rail: Detouring Less Likely for Rail

Road



Rail



*Source: 2004 Transportation Statistics Annual Report, Figures 2-13, 2-14.*

# H<sub>2</sub> Refueling—Road vs. Rail: Railroads Minimize Total Costs



<http://www.uprr.com/aboutup/maps/sysmap/index.shtml>

- Railroads own and operate vehicles and stations →
- Minimize total costs consisting of the sum of fixed and variable costs of H<sub>2</sub> supply, H<sub>2</sub> refueling, and train re-routing.

# Remote Refueling by Tender Car Delivery, Instead of Re-routing Trains or Building More Stations



Source: <http://www.snowcrest.net/photobob/ccnf30.html>



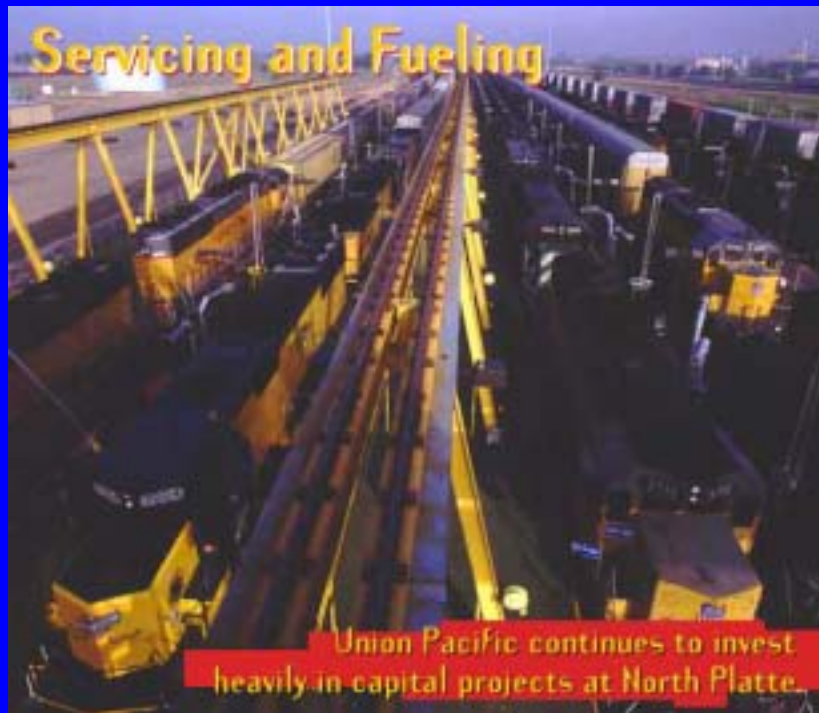
# H<sub>2</sub> Refueling—Road vs. Rail: Max Range (if any) Depends on Weight *and* Number of Hydrogen Tenders



Source: <http://www.snowcrest.net/photobob/ccnf2.html>



# H<sub>2</sub> Refueling—Road vs. Rail: Economies of Scale in H<sub>2</sub> Generating Plants/Stations



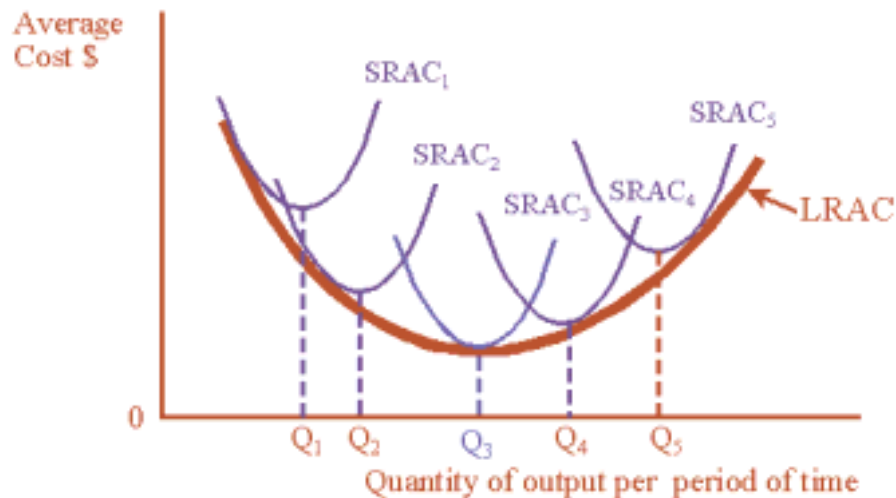
Source: <http://www.uprr.com/aboutup/history/bailey/byserv.shtml>



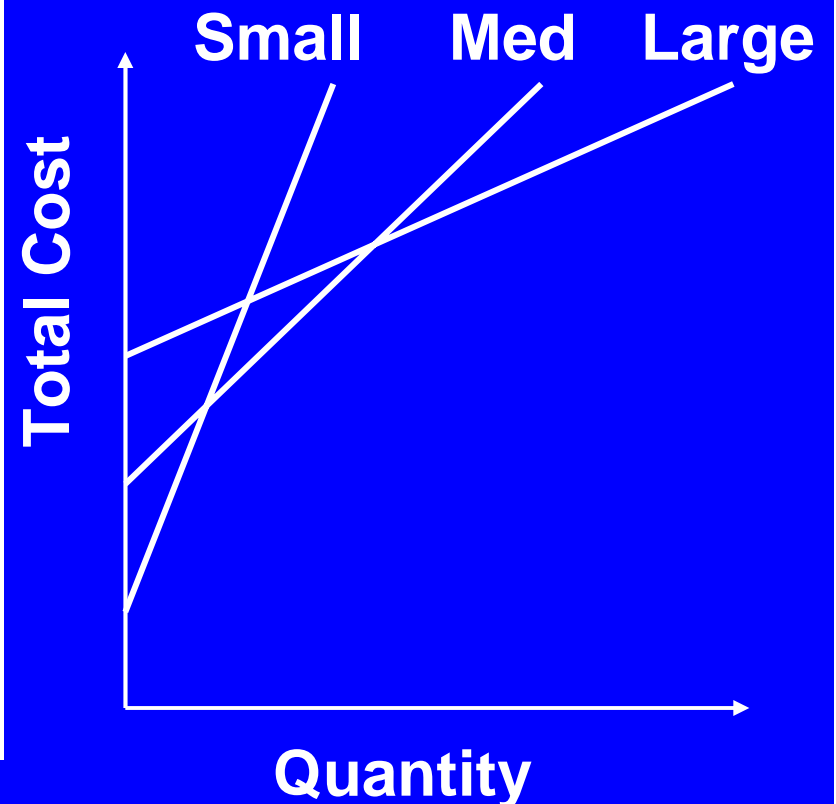
Source: <http://www.hynet.info/>

# H<sub>2</sub> Refueling—Road vs. Rail: Economies of Scale in H<sub>2</sub> Generating Plants/Stations

U-Shaped Long Run Average Cost Curve for Alternative Plant Sizes Showing Economies of Large-Scale Production



SRAC = Short run average cost curves for alternative size plants.  
LRAC = Long run average cost curve.



# Conclusions

- **Location of refueling facilities has been overlooked in the optimization literature.**
- **Flow-capturing model provides good basis.**
- **Vehicle range necessitates use of facility combinations.**
- **Must add some locations on links.**

# Conclusions for Modeling Rail Refueling

- **Minimize total costs of transport and refueling**
- **Remote refueling**
- **Variable and extendable range**
- **Economies of scale**

# Acknowledgements

- This research was funded by NSF (Decision Risk and Management Science Program).
- FRLM paper has been published in *Socioeconomic Planning Sciences*.
- Added-Node Dispersion paper submitted to *Geographical Analysis*.
- MIP models solved with Xpress-MP software.