

# Discrete Choice Analysis of Consumer Preferences for Refueling Availability

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Project ID #: AN15

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# Overview

## Timeline

### Project start date:

September 2007

### Project end date:

July 2008

### Percent complete: 60%

(phase I complete)

## Budget

### Total project funding

- \$510 K (DOE)

### Funding received in FY07

- \$190 K (DOE)

### Funding for FY08

- \$320 K (DOE)

## Barriers

### Systems Analysis

A. Future Market Behavior: "...hydrogen supply, vehicle supply, and the demand for vehicles and hydrogen are all dependent and linked."

### Hydrogen Production

Reduce the cost of hydrogen to \$2.00-\$3.00/gge (delivered) at the pump.

- Depends upon size and number of early stations required.

## Partners

**Subcontractor:** PA Consulting  
(with Knowledge Networks)

**Project lead:** Marc Melaina, NREL

# Objectives

- Quantify consumer reluctance to purchase an alternative fuel vehicle due to a lack of refueling availability.
  - Based upon survey results
  - Reluctance is expressed as a cost penalty against the purchase price of a vehicle
- Compare survey results to comparable results derived from analytic models
  - Assuming a certain “cost of time” associated with the additional distance traveled to a station
- Develop a general discrete choice model for major urban areas

# Milestones

## System Analysis MYPP Milestone

- “Begin a coordinated study of market transformation analysis with H2A and Delivery models” (2007 MYPP, p. 4-14)

## Project Milestones

### Survey Work

- Design and field survey in 3 urban areas Nov. 2007
- Complete subcontractor report (phase I) Feb. 2008
- Design and field survey in 4 additional urban areas May 2008
- Complete final subcontractor report (phase II) Aug. 2008

### Other Work

- Compare results to analytic derivations July 2008
- Complete final synthesis report Sept. 2008

# Approach: Discrete Choice Methodology

- Discrete choice methods are commonly applied in decision analyses of preferences for products with similar attributes

*Hypothetical  
Example:*

Attribute	Product A	Product B
A - Color	A1	B1
B - Speed	A2	B2
C - Cost	A3	B3
Choice:	<input type="checkbox"/>	<input checked="" type="checkbox"/>

- Previous studies of vehicle choice have included refueling availability as an attribute, but none have treated this attribute with a sufficient level of detail
- Attributes included in survey:
  - Vehicle Purchase Price
  - Fuel Costs (\$/mo)
  - Vehicle range (miles)
  - Refueling availability
    - Various types  
(see below)

# Approach: Choosing between two hypothetical vehicles

## What we asked:

- Respondents were asked to choose between two vehicles:
  - Conventional Vehicle
  - Alternative Fuel Vehicle
- Both vehicles were described as being identical to the respondent's most recently purchased vehicle (with 3-4 years)

## The Alternative Fuel Vehicle (AFV)

Described as identical to the Conventional Vehicle (CV) in all respects, except two:

### 1) Social and Environmental Benefits

- Virtually no oil use, no smog-forming pollutants, and reduction in greenhouse gas emissions by 30%-70%

### 2) Limited refueling availability

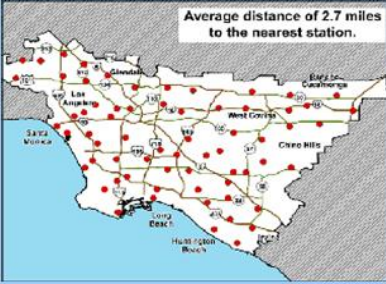


- Metropolitan, Regional and National geographic scales

# Approach: Ensuring Clarity and Consistent Responses

- A series of preliminary questions were used to familiarize the respondents with:
  - Concepts used in the survey (e.g., AFV; percent of stations)
  - Maps used for each geographic scale
    - e.g., asked them if they could locate their homes on map
  - Types of choices they would be making in the discrete choice portion of the survey
- Follow-up questions and one-on-one interviews inquired about the difficulty of the survey
  - Only a small fraction of respondents found the survey very difficult
  - Map sizes were increased after the first round of beta testing

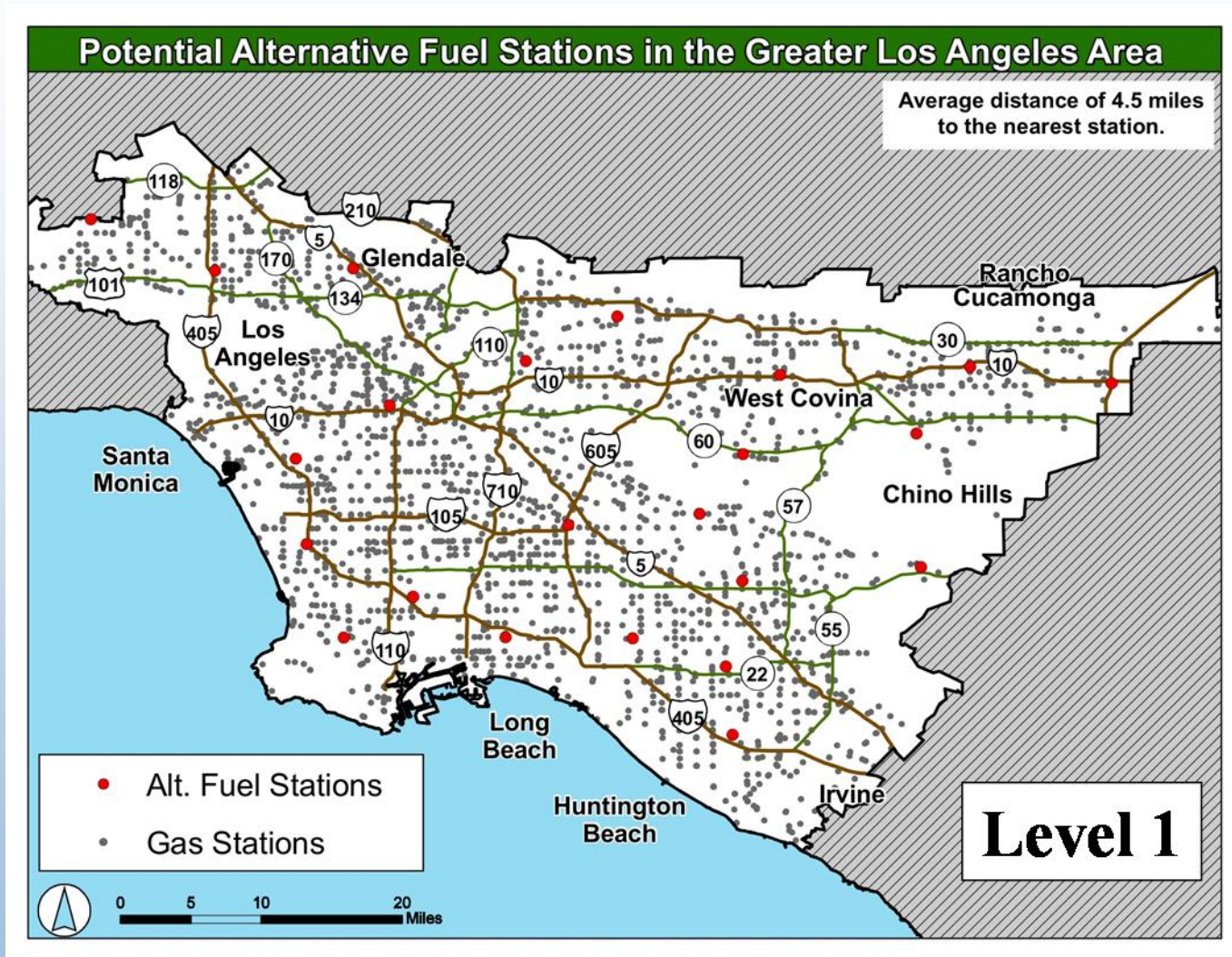
# Approach: Discrete Choice Survey Format (L.A. example)

Each refueling availability attribute has 4 levels

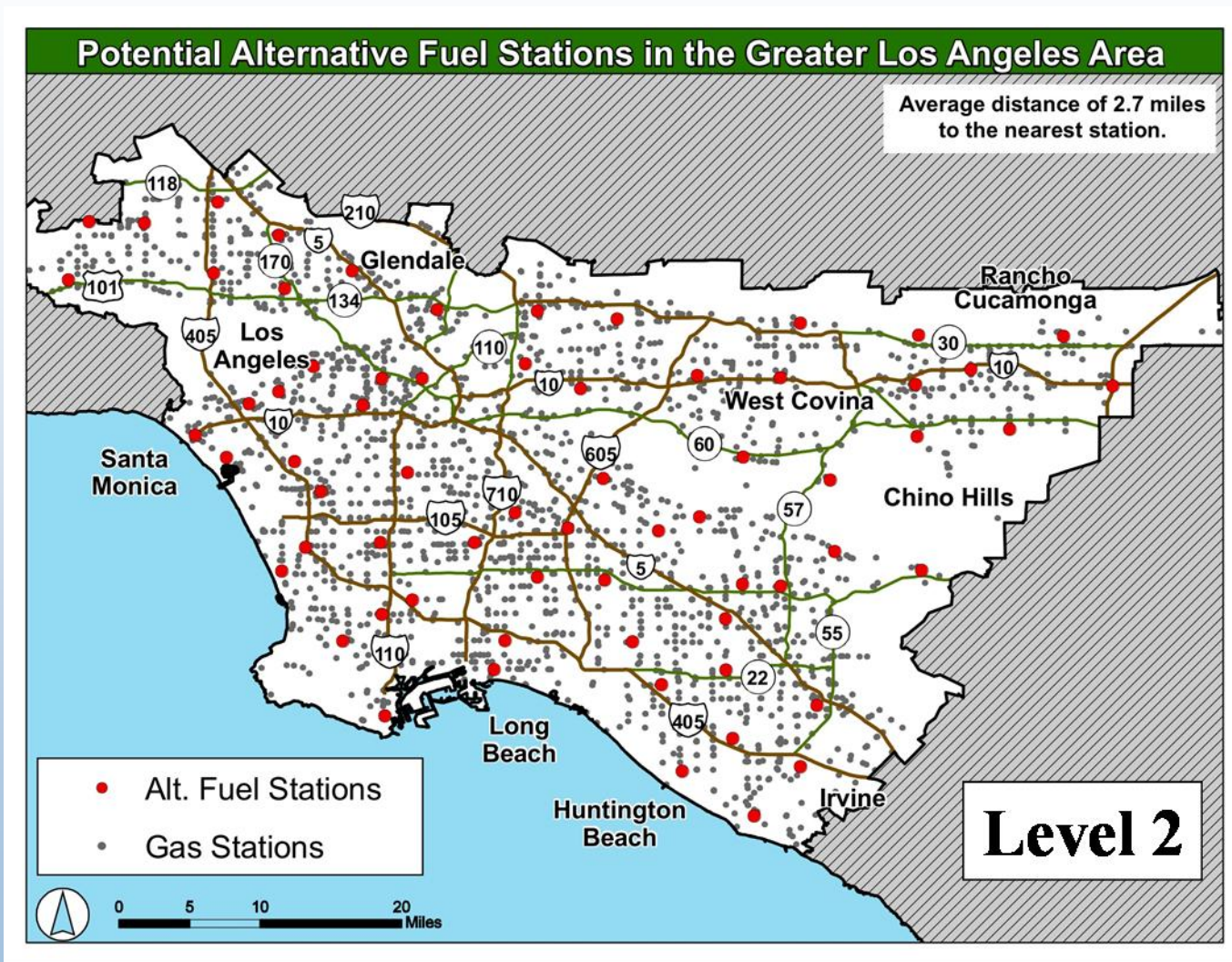
	Gasoline Vehicle Similar to YOUR VEHICLE	Alternative Fuel Vehicle Similar to YOUR VEHICLE
<i>Vehicle Attributes</i>		Virtually NO oil used or imported No smog emissions 30%-70% fewer Greenhouse Gas emissions
Driving Range	Same as YOUR VEHICLE	X miles
Average Distance to the nearest Metro Area Refueling Station	0.4 miles	 <p>Average distance of 2.7 miles to the nearest station.</p>
Number of stations within 150 miles of the metro area	3,000	 <p>3,000 stations within 150 miles of the metro region. Same as conventional vehicles.</p>
Long Distance Trips that are Possible	All destinations are possible	 <p>Potential Alternative Fuel Stations on Interstate Corridors from Los Angeles</p>
Distance Between Highway Stations Varies	Varies	X miles
Fuel Cost (\$/month)	\$ X	\$ X
Purchase Price	\$ X	\$ X
Vehicle you are MOST likely to purchase	<input type="checkbox"/>	<input checked="" type="checkbox"/>



# Approach: Metropolitan Maps (L.A., Level 1)

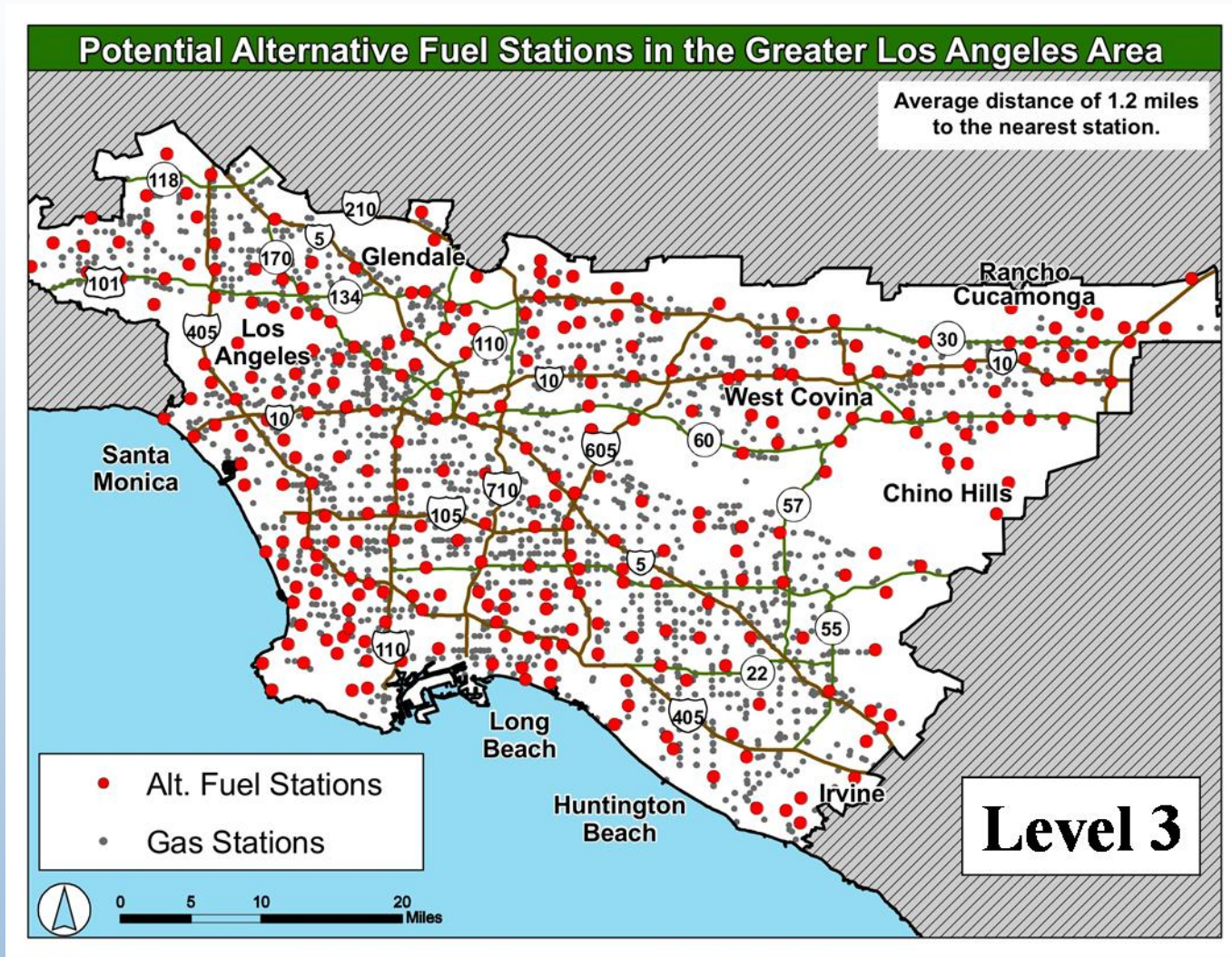


# Approach: Metro Area Maps (L.A., Level 2)



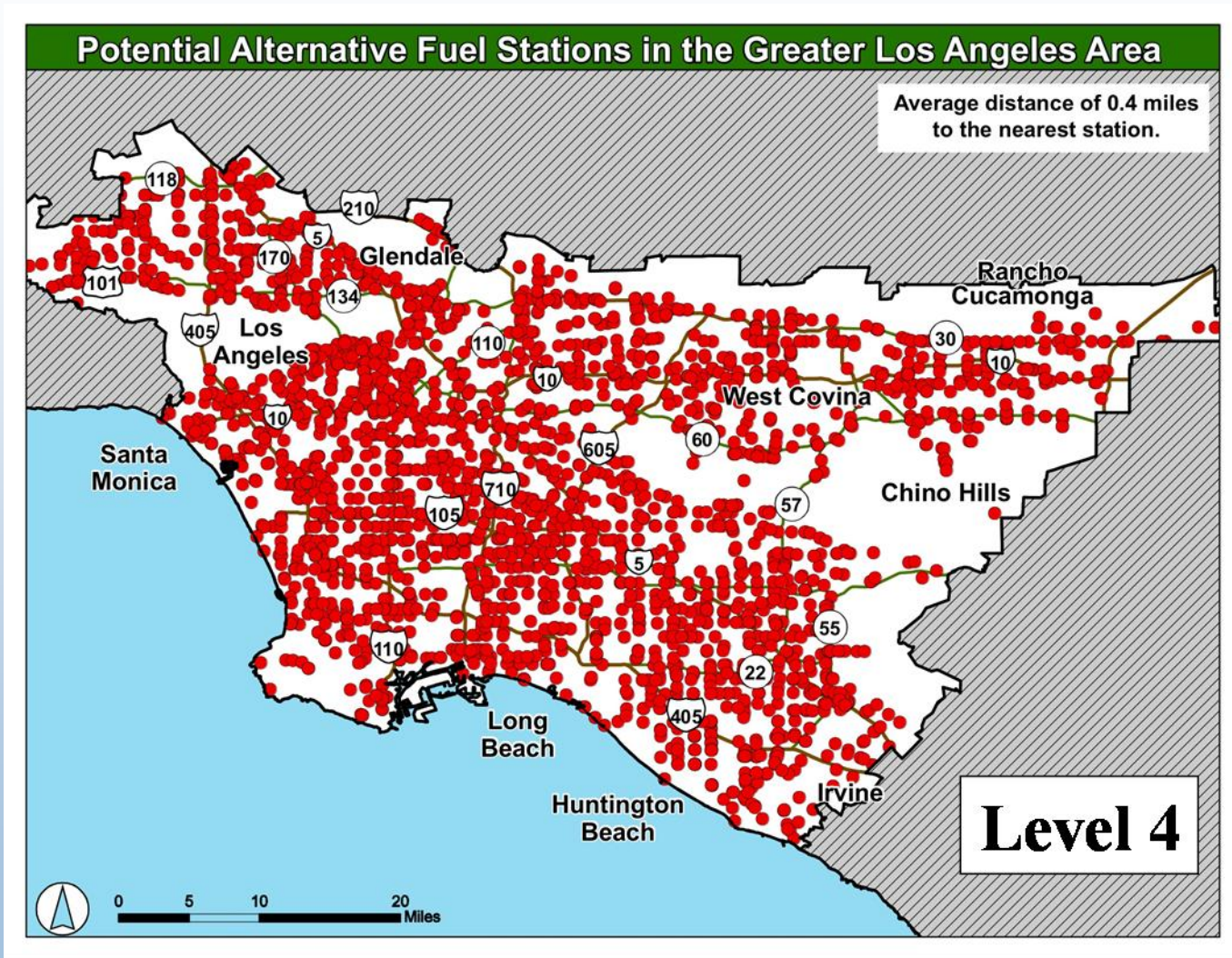


# Approach: Metro Area Maps (L.A., Level 3)

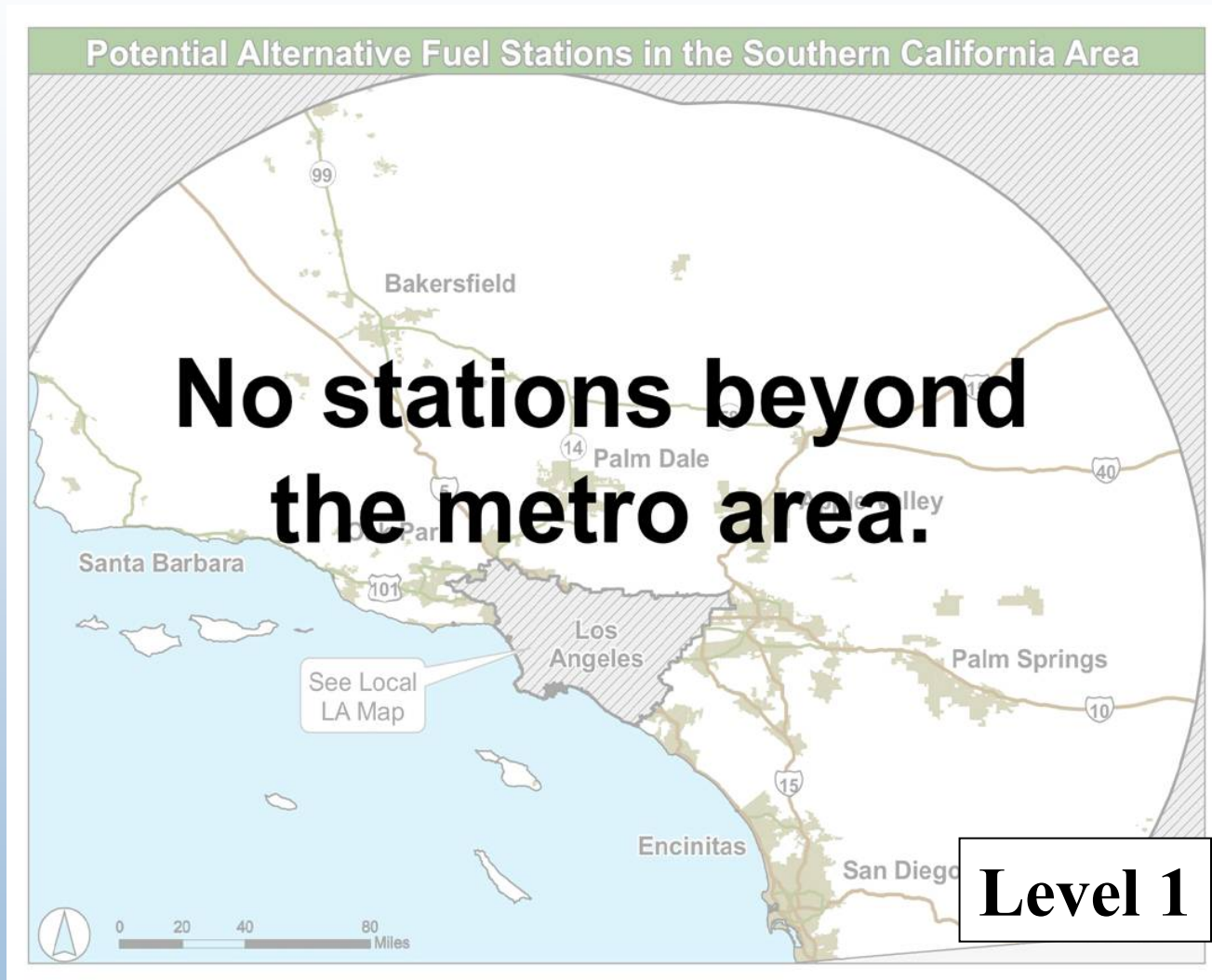




# Approach: Metro Area Maps (L.A., Level 4)

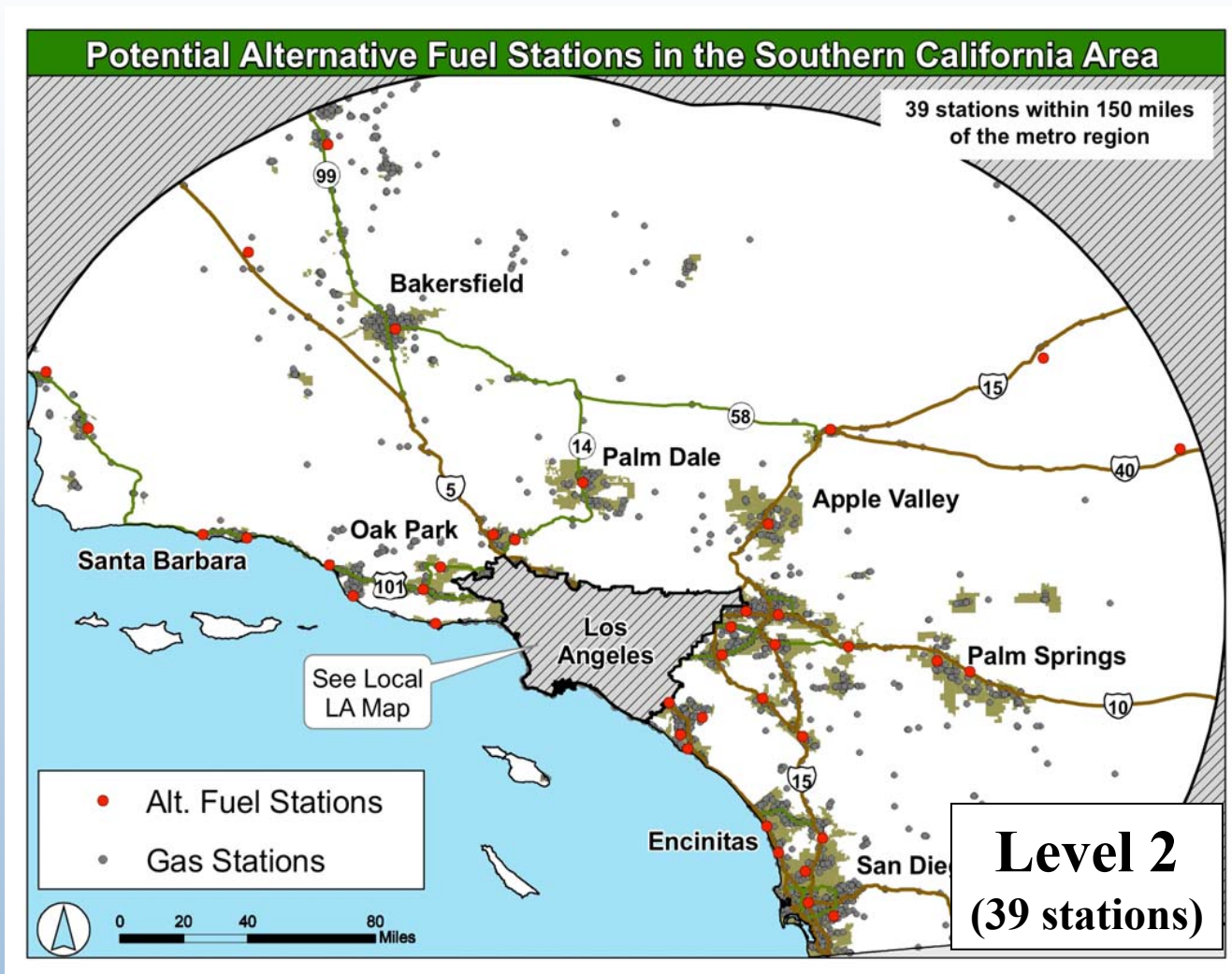


# Approach: Metro Region Maps (L.A., Level 1)

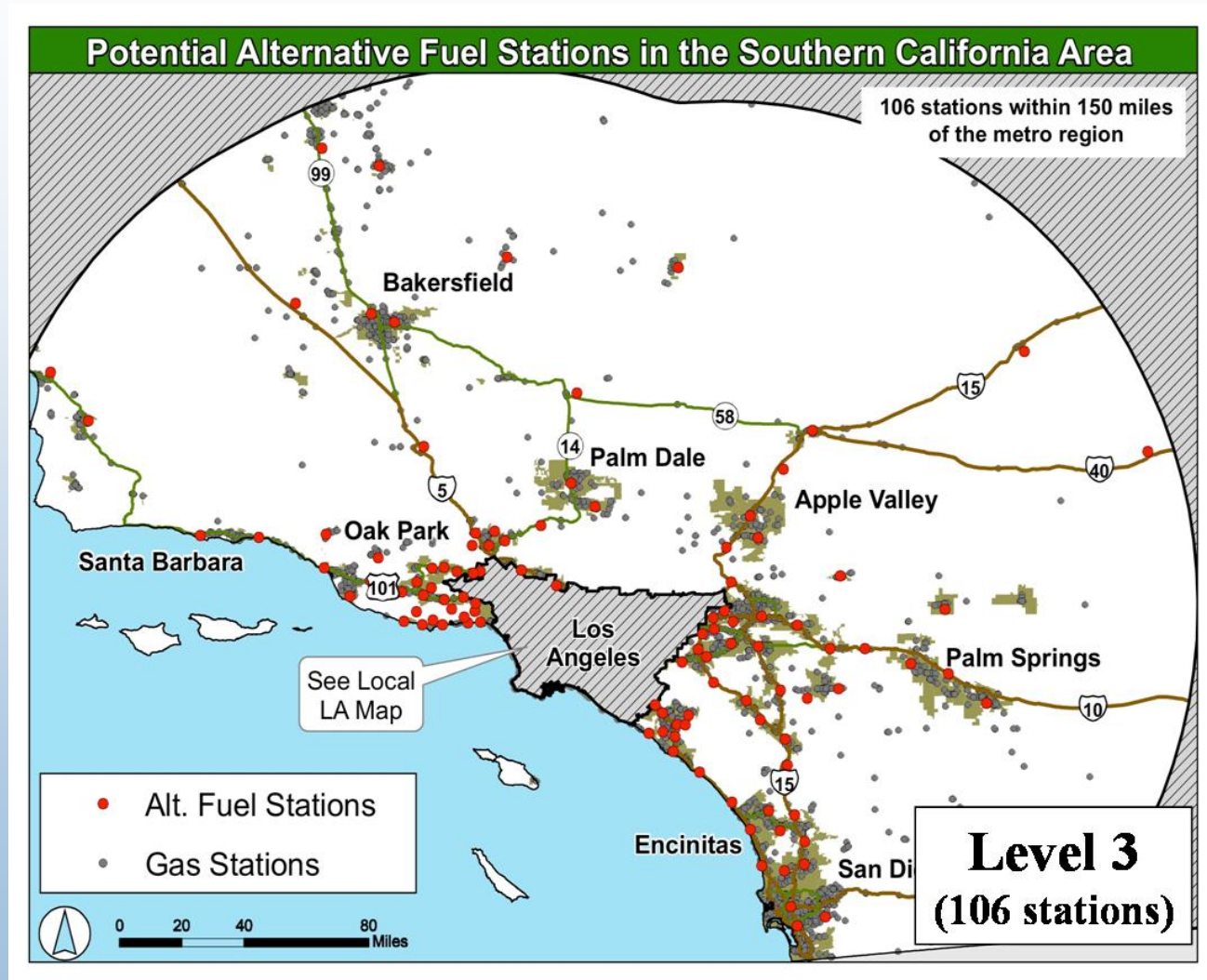




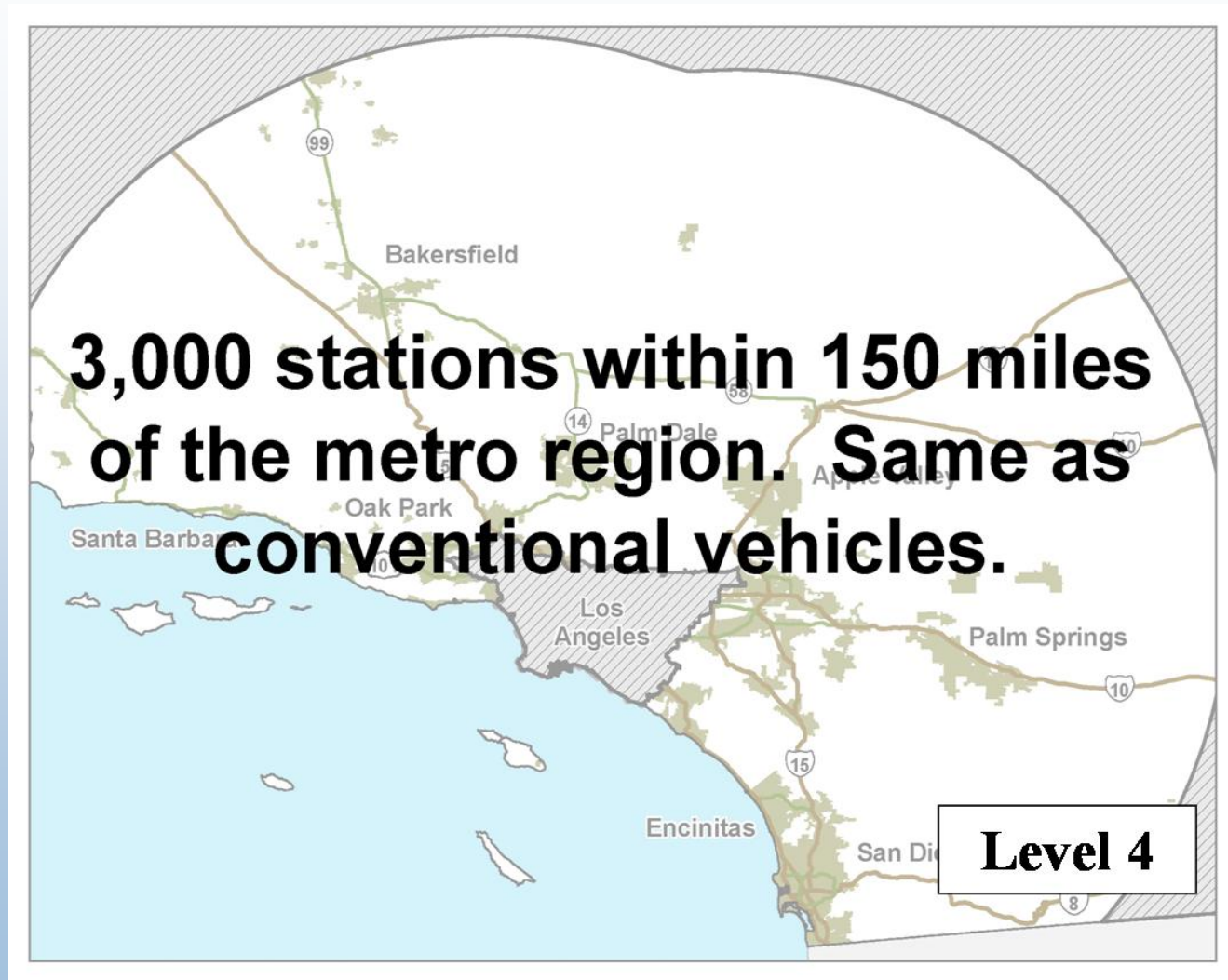
# Approach: Metro Region Maps (L.A., Level 2)



# Approach: Metro Region Maps (L.A., Level 3)

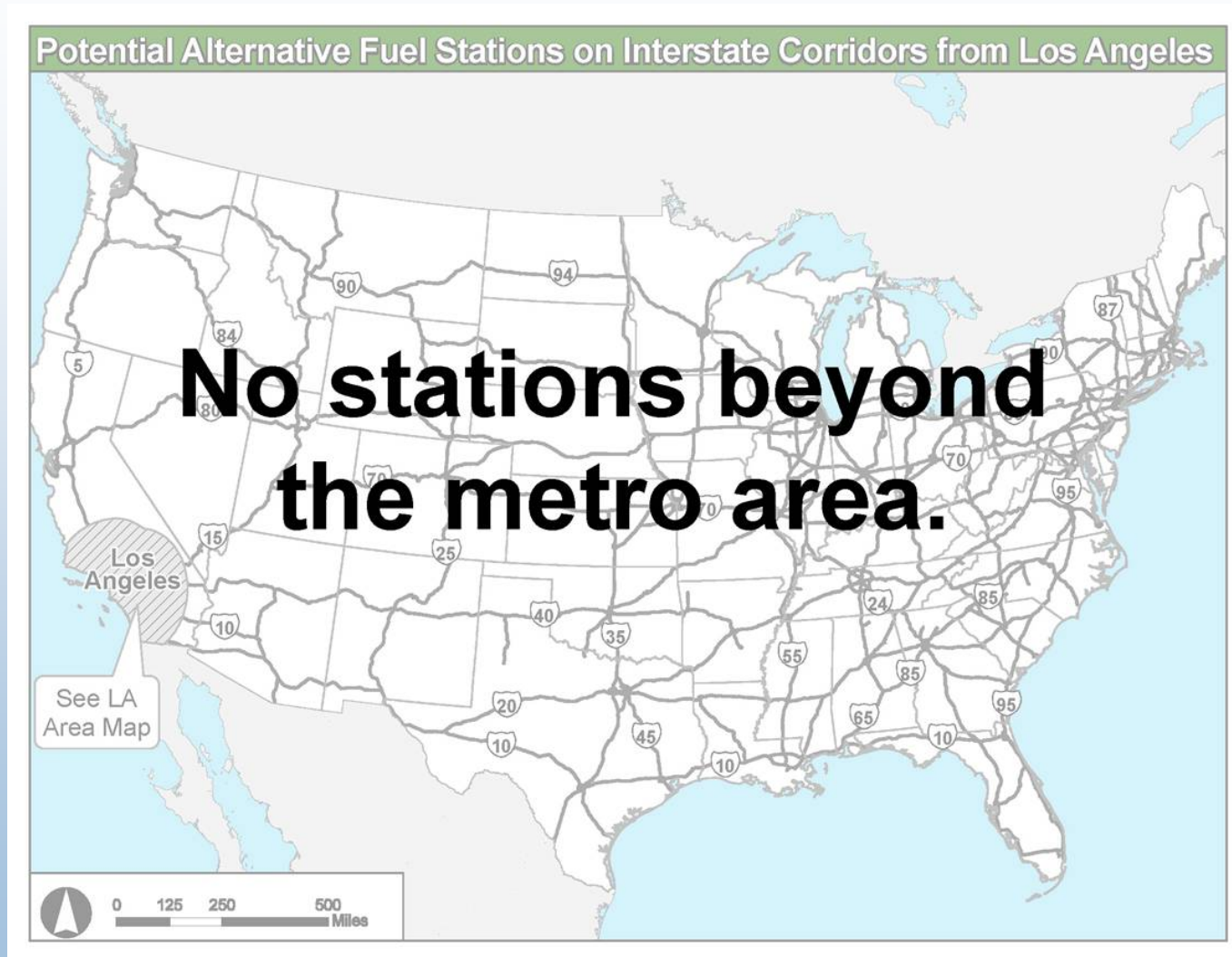


# Approach: Metro Region Maps (L.A., Level 4)

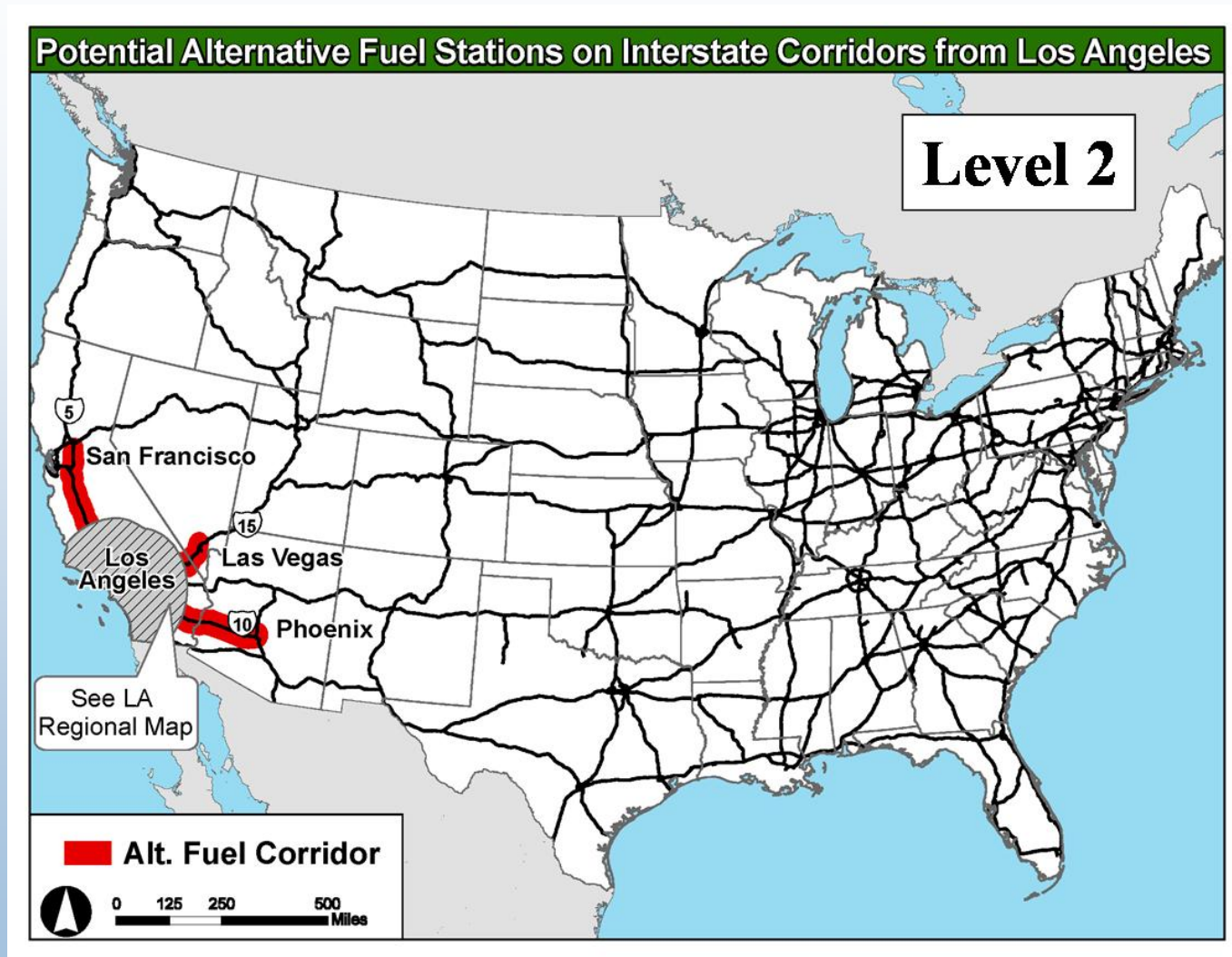




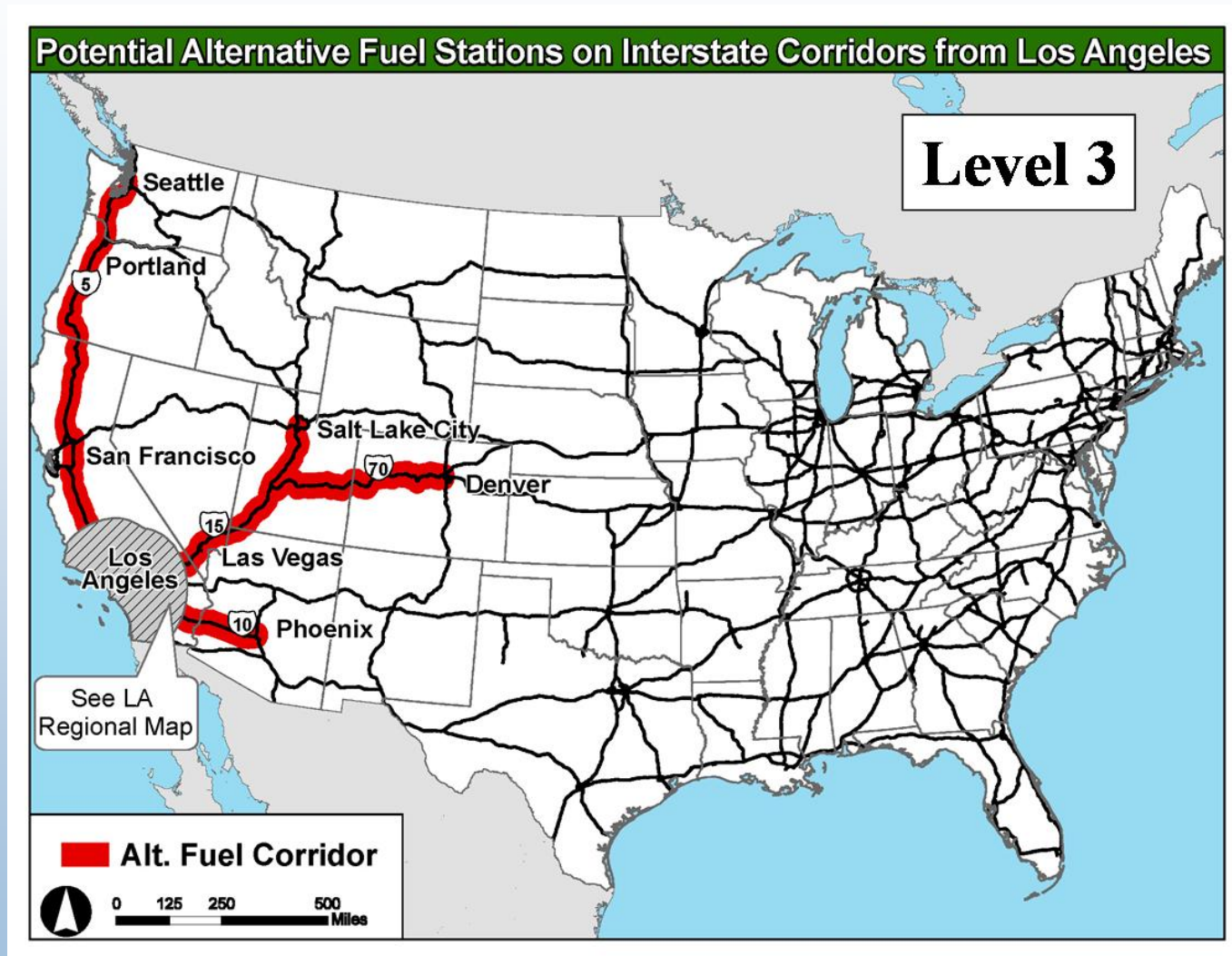
# Approach: Interstate Maps (L.A., Level 1)



# Approach: Interstate Maps (L.A., Level 2)



# Approach: Interstate Maps (L.A., Level 3)





# Approach: Interstate Maps (L.A., Level 4)



# Approach: Equivalent Dollar Values

- Cost penalty results can be expressed on the same dollar value basis as the purchase price of the vehicle
- Each attribute is included in a utility function, and parameters result from fitting the function to the survey responses
- The utility function includes attributes ( $X$ ) and corresponding coefficients ( $\beta$ ):

$$U_i = \beta_i X_i$$

Values for  $i$  represent distinct attributes

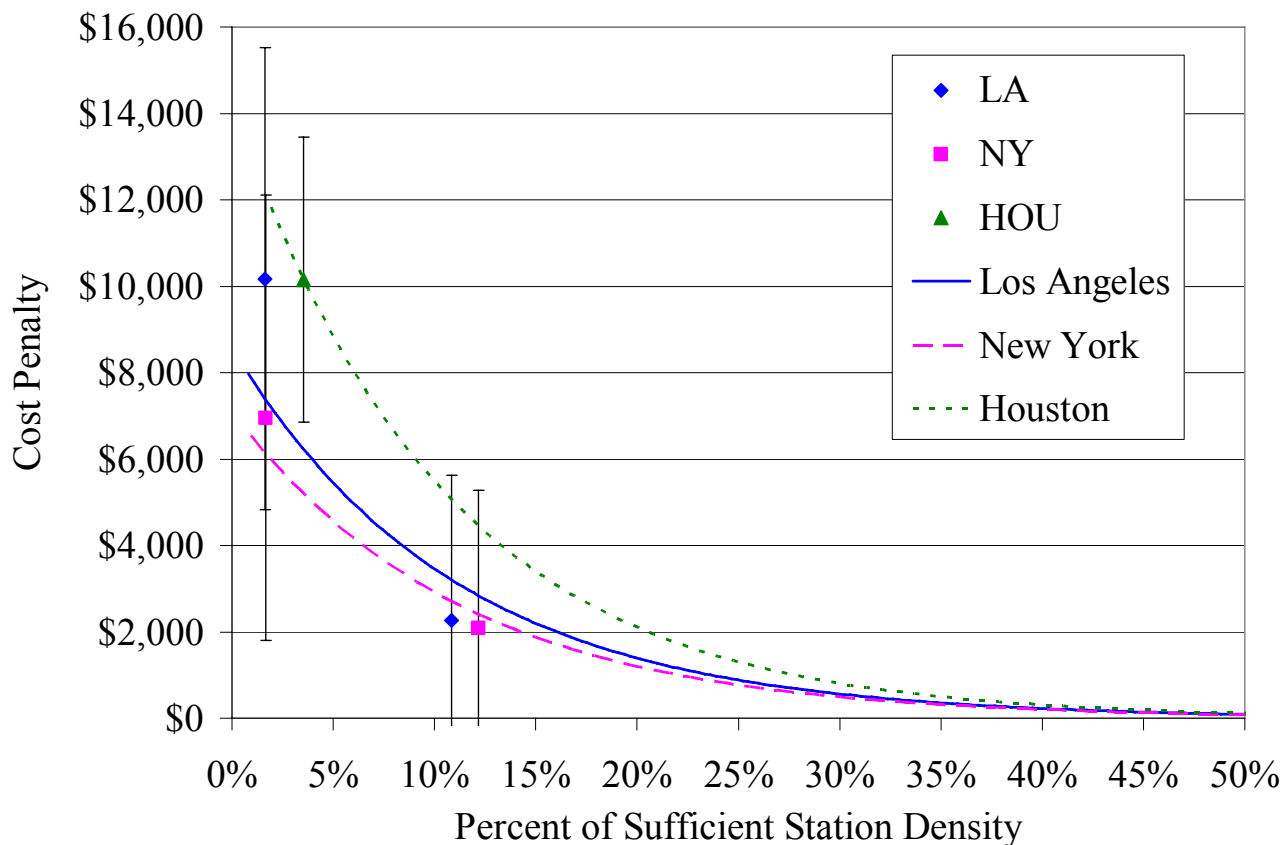
- The value of any attribute level can be expressed in terms of equivalent dollars values using the vehicle purchase price coefficient as a basis:

$$V_i = \frac{X_i \beta_i}{\beta_{VPP}}$$

# Results: Overview

- Fielded survey in households in 3 major urban areas
  - Los Angeles, Houston and New York
  - Total of 1486 completed surveys
- Cost penalty results were consistent with expectations
  - Penalties increase at lower levels of availability
  - Lower penalties found for higher density cities (e.g., NY)
  - Exception was regional result for L.A.
  - Additional survey work will help clarify regional results
- Found statistically significant results for most of the geographic levels of refueling availability
  - Some levels were not distinguishable for some cities
  - Additional survey work will make levels more visually distinct

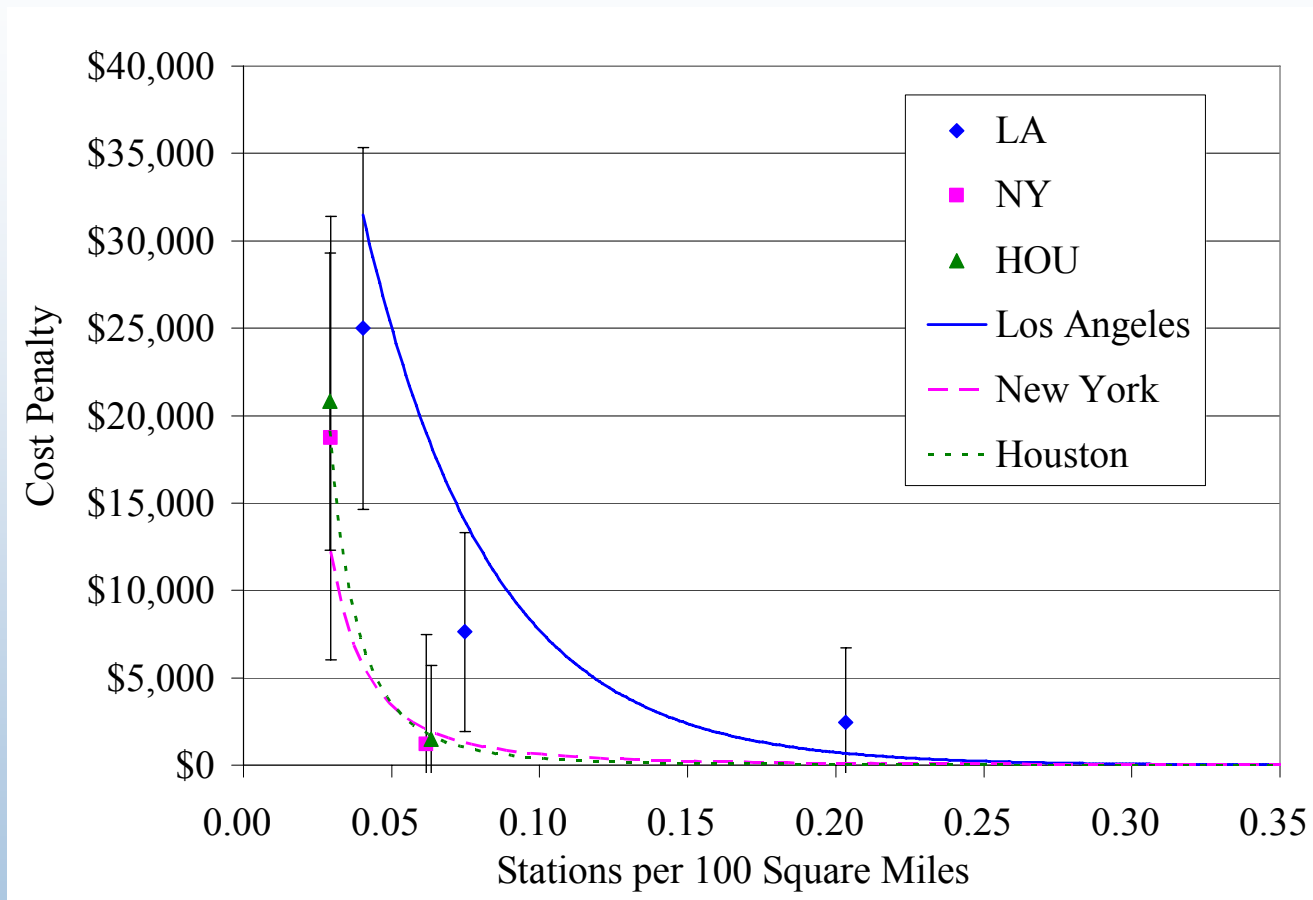
# Results: Cost Penalties for Metro Area Coverage follow an Exponential Trend



Note: HOU only has 2 data points

- Lower costs for higher population density: NY < LA < HOU
- Basis is percent of sufficient stations (less than existing stations).

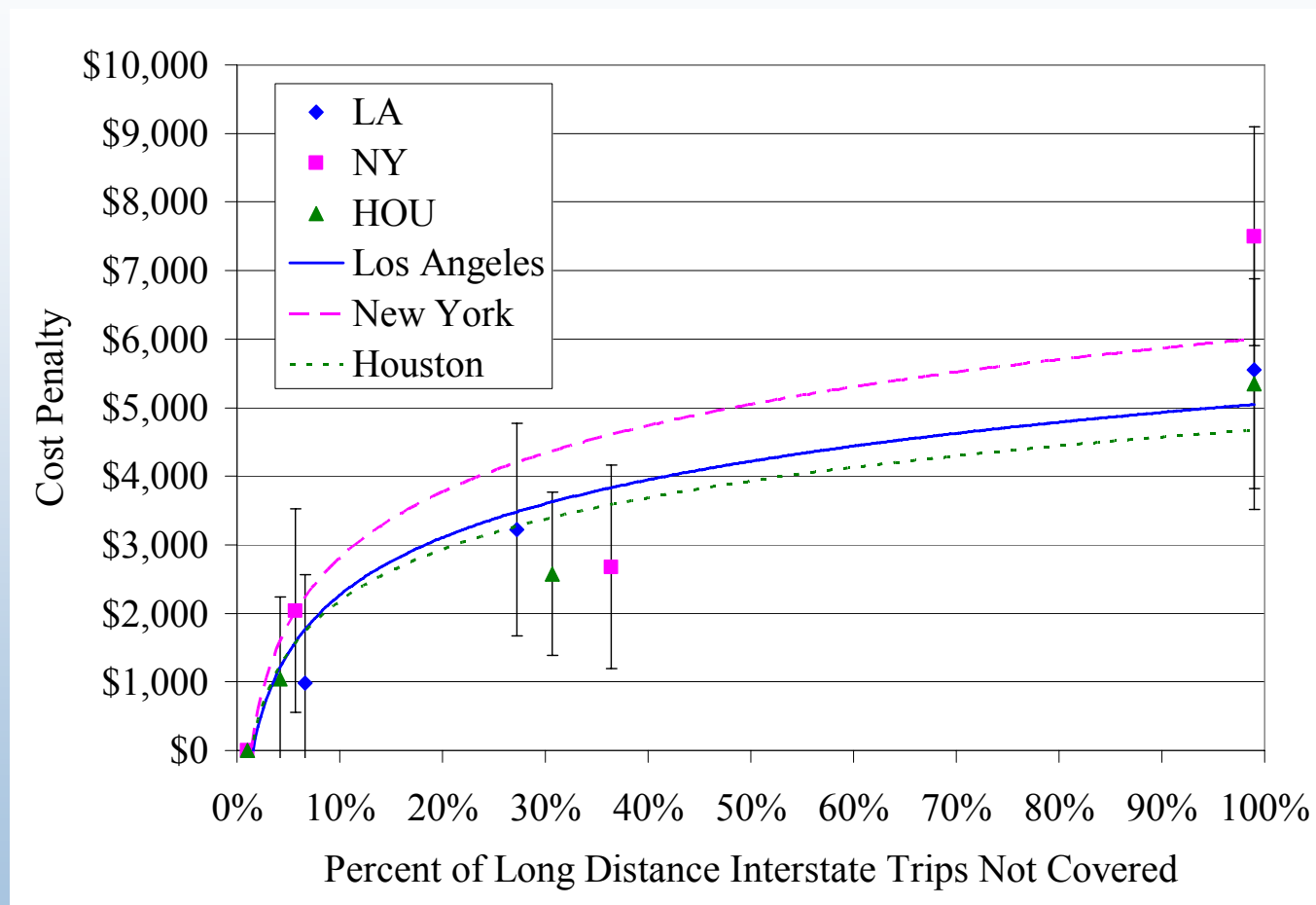
# Results: Regional Cost Penalties Follow Exponential (LA) and Power (NY, HOU) Trends



Higher cost penalties for LA warrant additional survey work to understand preferences for regional availability.

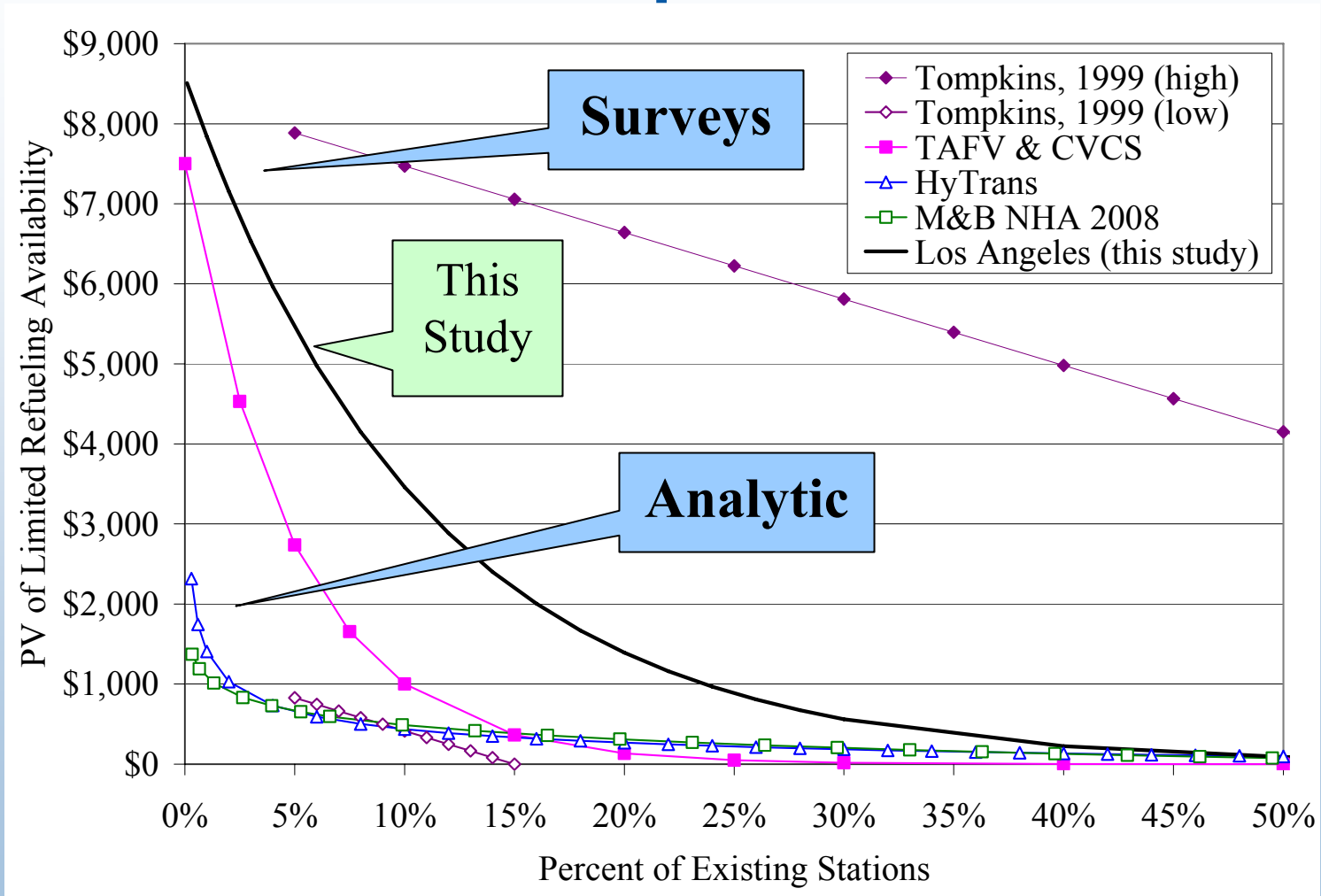


# Results: Significant cost penalties (\$1000-\$2000) remain even for long, infrequent trips



Note the inverted basis: long distance trips not covered

# Results: Metro cost penalties are high relative to comparable studies



At 10% of existing stations, cost penalty is \$3000 - \$4000

# Future Work

## Motivation for analysis of additional urban areas:

- We would like to have a general cost penalty function that can be extrapolated to a large number of major urban areas.
- Penalties may vary between different city sizes and densities.
- Some geographic levels could not be valued with statistical significance

## Analysis of preferences in four additional urban areas:

- Seattle, WA
- Minneapolis – St. Paul, MN
- Atlanta, GA
- Washington, DC

These four cities were chosen based upon their range of sizes and population densities.

- Expect results of additional surveys within 4 months of signing new subcontract with PA Consulting

# Summary

- Consumer cost penalties for limited refueling availability are higher than those reported in most other studies
  - \$3000-\$4000 for 10% coverage of existing urban stations
- The penalties for limited coverage at regional and interstate/national scales are comparable to those at the metropolitan area scale
- Cost penalties are probably exaggerated because they are based upon **stated preference** survey results
- Additional research is required to reconcile penalties based upon **stated preferences** and **analytic derivations**
- High cost penalties associated with limited refueling availability would provide a strong justification for financial support of more extensive hydrogen station networks for early vehicle markets