

# DEMAND FORECASTING AND UNCERTAINTIES

Recitation 4

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# MOTIVATION FOR DEMAND MODELING

- Why forecast demand?
  - To estimate future demand levels for planning purposes.
  - To analyze proposed projects or policies.
- Who does it?
  - Transportation planning agencies.
  - Private transportation service providers.

# MOTIVATION FOR DEMAND MODELING

- What other large-scale engineering systems might have a need to forecast demand?



**Energy**

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**Mobile Phones**



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**Internet**

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**Water**

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# TRAVEL DEMAND FORECASTING METHODS

- **Econometric “top-down” forecasting:**
  - Often used for national, and regional-level forecasts.
  - Examples: total annual air traffic between New York and Boston, total vehicle miles travelled in the U.S.
- **Choice-based “bottom-up” forecasting:**
  - Often used to determine mode choice.
  - Examples: mode share for travel between New York and Boston (auto, air, or rail), mode choice for daily commute (personal vehicle, transit, biking or walking).

# TRAVEL DEMAND FORECASTING METHODS

- Econometric “top-down” forecasting:

Functional form:

$$\begin{aligned}y &= \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_n x_n + \varepsilon \\ &= \beta x + \varepsilon\end{aligned}$$

- Choice-based “bottom-up” forecasting:

- Functional form:

$$U_{in} = \beta_{in} x_{in} + \varepsilon_i$$

We compare  $U_1, U_2, U_3, \dots, U_n$ . Select  $i$  with highest utility.

# DISCRETE CHOICE FRAMEWORK

- Decision-Maker (e.g. traveler)
  - Attributes of Decision-Maker (e.g. age, gender, income, etc.)
- Alternatives (e.g. auto, high-speed rail, auto)
  - Attributes of Alternatives (e.g. travel time, cost, frequency)
- Choice
  - Decision-maker  $n$  selects one and only one alternative from set  $C_n = \{1, 2, \dots, i, \dots, J_n\}$  with  $J$  alternatives.
- Decision Rule
  - Dominance, satisfaction, utility, etc.
  - Utility = happiness

# CHOICE EXAMPLE: INTERCITY TRAVEL

- Decision maker: an individual traveler.
- Choice: whether to travel between Boston and New York by<sub>air</sub> , high-speed rail, or auto.
- Goods: air, high-speed rail, auto.
- Utility function:  $U(X) = U(\text{Air}, \text{HSR}, \text{Auto})$
- Consumers maximize utility:
  - If  $U(\text{Air}) > U(\text{HSR}), U(\text{Auto}) \rightarrow$  choose Air
  - If  $U(\text{HSR}) > U(\text{Air}), U(\text{Auto}) \rightarrow$  choose ?
- What goes in  $U(X)$ ?

# CONSTRUCTING THE UTILITY FUNCTION

- $U(\text{Air}) = U(\text{travel\_time}, \text{access\_time}, \text{cost}, \dots)$
- Assume linear (in the parameters)
  - $U(\text{Air}) = \beta_1 * \text{travel\_time} + \beta_2 * \text{access\_time} + \dots$
- Parameters represent tastes, which may vary over people
  - Include socio-economic characteristics (e.g. age, income)
  - $U(\text{Air}) = \beta_1 * \text{travel\_time} + \beta_2 * \text{access\_time} + \beta_3 * (\text{cost}/\text{income}) + \dots$

# EVALUATING FUTURE CHANGES

Given this framework:

- $U(\text{Air}) > U(\text{HSR}), U(\text{Auto}) \rightarrow$  choose Air
- $U(\text{HSR}) > U(\text{Air}), U(\text{Auto}) \rightarrow$  choose HSR
- $U(\text{Auto}) > U(\text{Air}), U(\text{HSR}) \rightarrow$  choose Auto

How might utility and choice change:

- If air fares go up?
- If cost of traveling by auto goes up?
- If congestion goes up?
- If high-speed rail travel time goes down?

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