

21. Travel Cost Model

1. Introduction

- Measure values of recreation sites
 - entire sites (beach)
 - characteristics of sites (water quality on a lake)
- Revealed preference, based on observed behavior (visits to a site)
- Travel Cost Model
- Examples of applications
 - ↳ fishing/boating on a lake or lakes
 - ↳ swimming at a beach or beaches
 - ↳ viewing a nature site
 - ↳ hunting
 - ↳ rock climbing
 - ↳ camping in the mountains

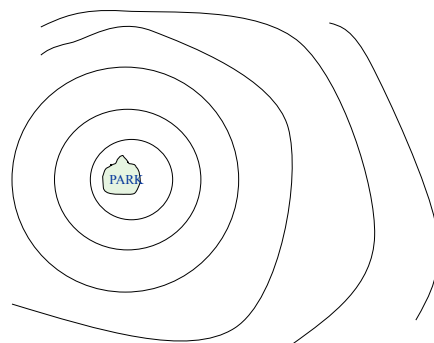
→ Outline

- Intuition and stories
- Modern single site model
 - ↳ set-up
 - ↳ issues
- Modern multiple site model

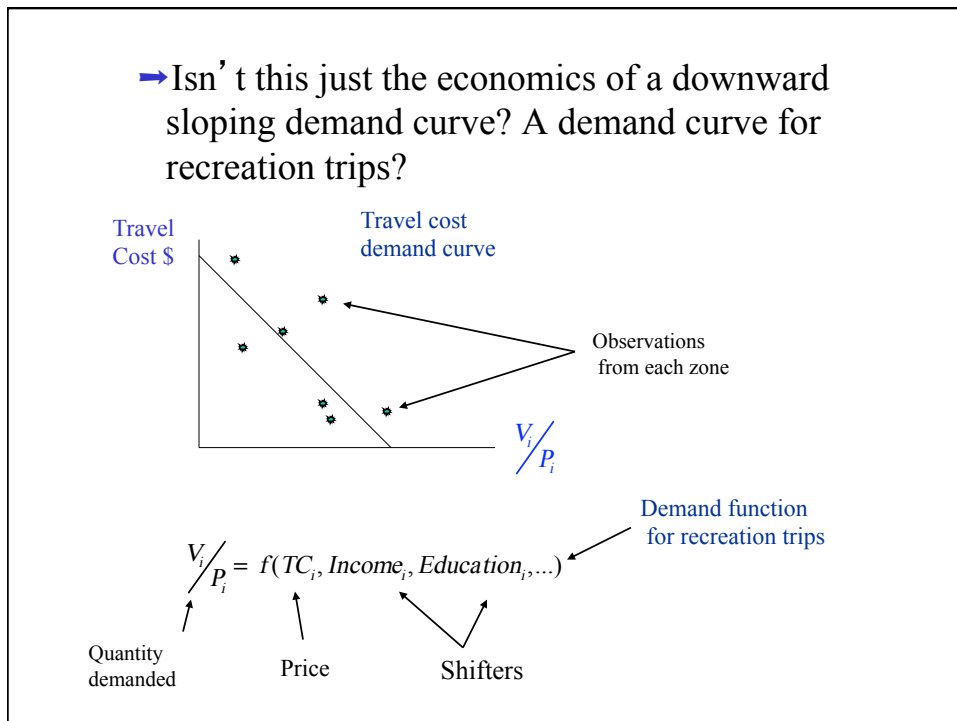
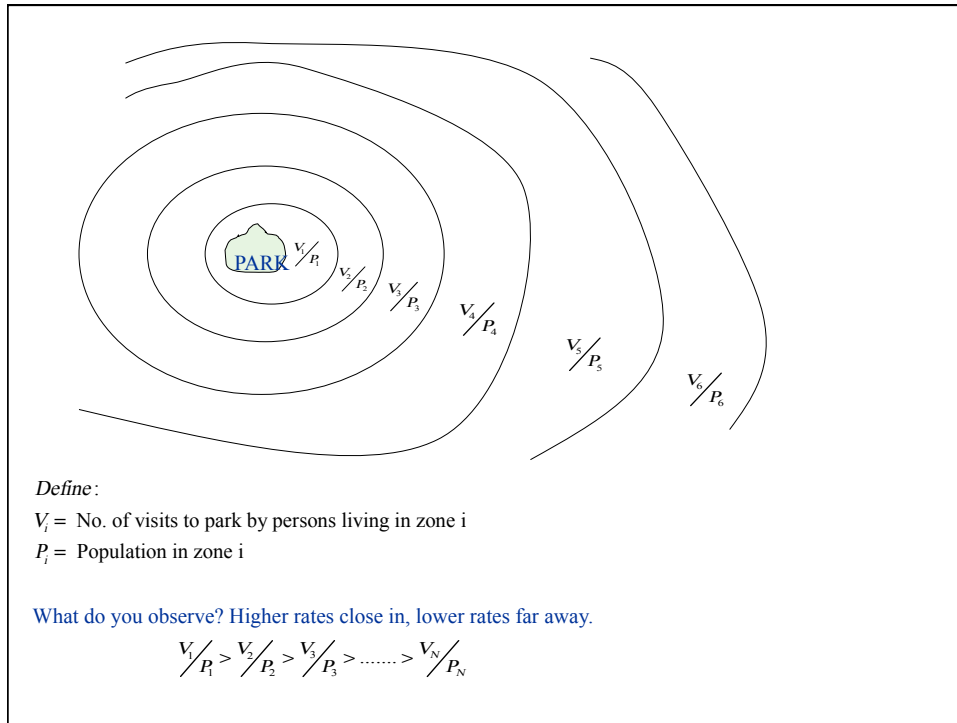
2. Intuition and Stories

→ Zonal Travel Cost Model

- Harold Hotelling Letter
- Consider a National Park



□

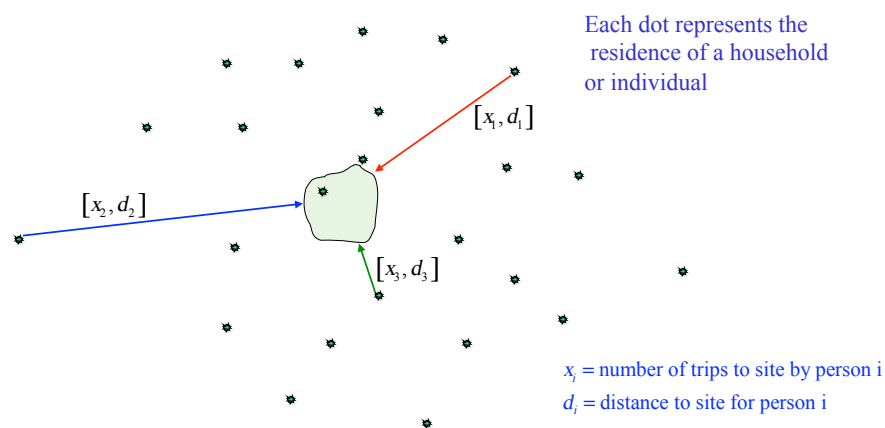


- Estimate with data on visits to park
- Use the demand curve (consumer surplus) estimate to value recreation uses of the park (more on this in the next section)
- Zonal travel cost -- old hat but the principle in modern approaches is the same

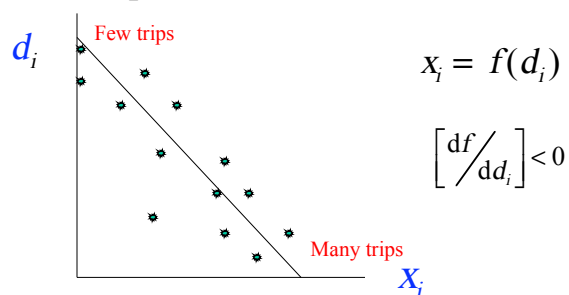
3. Modern Single Site Model

→ Basic set-up

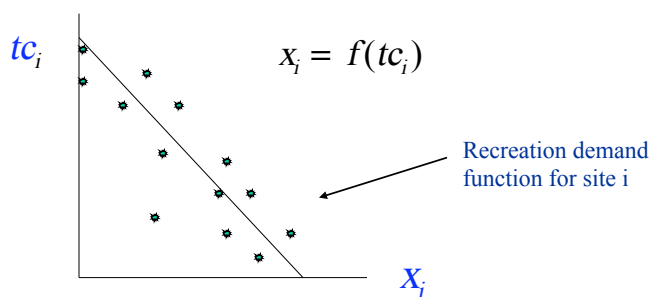
- recognizes the same behavior, but works with observations on individuals (not zonal aggregates)



- For each person you know the number of trips made during the season and distance to the recreation site. Again, postulate a travel cost demand curve for recreation.
- Like the Zonal Model we expect the following relationship

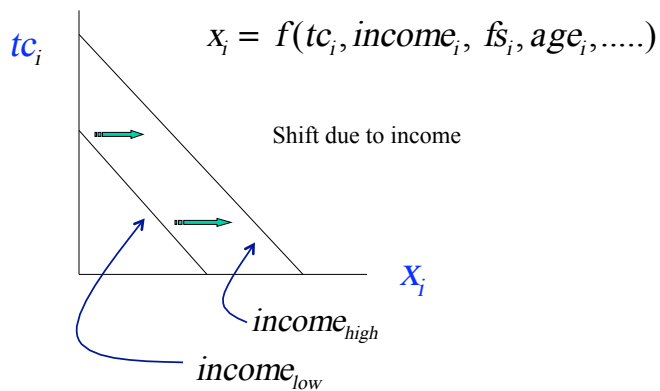


- Again we are observing the economics of a downward sloping demand function. Substitute (or calculate) travel cost for each distance



- Think of travel cost as a **surrogate for price**

→ Again, we can add shifters. Characteristics that will influence trip taking: income, age, education, experience (eg., fishing), boat ownership



→ Price in the model is rather naïve. Can think of more things that make-up the cost of a trip ...fees, time cost and so on. A more common definition of price looks like:

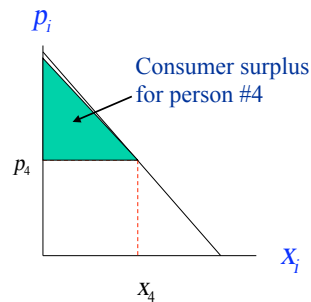
$$price = \left(\begin{array}{c} travel \\ cost \end{array} \right) + \left(\begin{array}{c} time \\ cost \end{array} \right) + (fees) + \left(\begin{array}{c} other \\ related \\ expenses \end{array} \right)$$

Examples:
Lodging, Bait

Beware of the hot dog problem!

- Gather data on trips, location of hometown, and demographics. Calculate price. Then regress trips on t_c , demographics. This gives you an estimated demand function.
- Data set

- **Site value**. Calculated in 3 steps using the estimated function
 - (1) Calculate the consumer surplus for each individual in the sample. CS for recreation use of the site. For example for person #4 the CS is



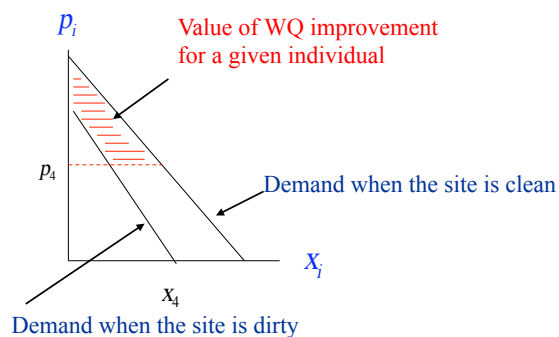
- (2) Aggregate to annual values for the population
 - ↳ Mean(CS)*Population (eg., Mean(cs)*1,000,000).
- (3) Estimate future values and discount to PV
 - ↳ Might have annual values growing w/ population
 - ↳ Might have annual values growing w/ income
 - ↳ Might have annual values growing due to asymmetric technical change

→ Comments

- Unit-day values (Mean(CS)/x)
- CS for folks near-by vs folks far away

→ Attribute Values

- Examples: water quality, # or trails, beach width



→ In theory you'd like to estimate a demand curve for the site when the water is clean and when it is dirty. Could do it with time series or cross sectional or contingent behavior data. Problem is the number of other variables you need to control for.

→ Comments and Issues

- Measuring the value of time
- The Grandma problem (multiple destinations)
- Substitute sites

$$x_i = f(p_1, p_2, p_3, \dots)$$

↖ Enter other site prices

- Nonuse values missed
- Sampling & Participation
- Measuring quality
 - ↳ Perceived vs. Actual

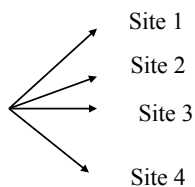
3. Modern Multiple Site Recreation Demand Models

- Systems of Demand equations
- Random Utility Model

→ The Random Utility Model

- Discrete choice model using multinomial logit techniques
- Models and individual's choice of one site from among many possible sites
- The choice of site is assumed to depend on the characteristics of the site, including price (trip cost)

- The RUM Model in deterministic form



Model choice among 4 sites.
Estimate the probability of visiting one of these sites as a function of the characteristics of the site.

Individuals pick site w/ Highest utility. So pick site 1 if ...

$$U_1 > U_2, U_3, U_4$$

Consider two scenarios: site loss and quality change at one or more sites:

Site Loss (say site 1 is lost):

If so, choice is now between sites 2, 3, and 4.

How has utility changed as a result of the closure?

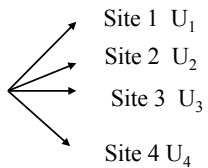
@--If person choose site 2, 3, or 4 originally: **no change.**

@--If person choose site 1, then change in utility is
 $\Delta U = \text{MAX}(U_2, U_3, U_4) - U_1$

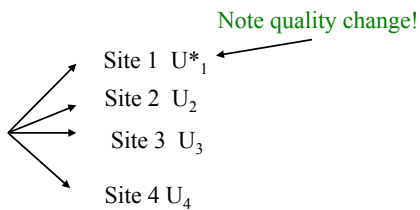
Quality Change (say wq at site 1 is improved):

How has utility changed as a result of the closure?

Before the quality change person chooses between sites 1, 2, 3, and 4 with utilities:



After the quality change person chooses between sites 1, 2, 3, and 4 with utilities:



If person choose site 1 before cleaning, then
utility goes up by

$$\Delta U = U^*_1 - U_1$$

If person chooses site 2,3,or 4 before cleaning, then
utility goes up by

$$\Delta U = U^*_1 - \text{MAX}(U_2, U_3, U_4)$$

if person chooses site 1 now

otherwise $\Delta U = 0$.

To convert to money measures for site closure or quality change
divide by coefficient on travel cost!

$$\Delta W = \Delta U / -\beta_1$$

- The RUM Model in stochastic form for estimation

To estimate we assume that each site has the form:

$$U_i = \beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i + \varepsilon_i$$

Probability that person chooses
site k

$$pr_n(k) = pr(U_k > U_i) \text{ for all } i$$

$$pr_n(k) = \frac{\exp(\beta_1 tc_k + \beta_2 wq_k + \beta_3 size_k)}{\sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i)}$$

This is a special case of
the error term having a type 1
extreme value distribution

To estimate, we assume that the error term has some distribution. That will yield a probability of choosing each site and this is loaded into a likelihood function as follows:

$$L = \prod_{n=1}^N \prod_{i=1}^4 pr_n(i)^{t_{in}}$$

$t_{in} = 1$ if individual i visited site n ; and $= 0$ otherwise.

$$pr_n(k) = \frac{\exp(\beta_1 tc_k + \beta_2 wq_k + \beta_3 size_k)}{\sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i)}$$

This is a special case of the error term having a type 1 extreme value distribution

Choose parameters to maximize the likelihood L -- max likelihood estimation.

$$EU = \ln \sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i)$$

Site Loss -- loss of site 1

$$\Delta EU / -\beta_1 = \{ \ln \sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i) - \ln \sum_{i=1}^3 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i) \} / -\beta_1$$

Quality Change -- improved water quality

$$\Delta EU / -\beta_1 = \{ \ln \sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i^* + \beta_3 size_i) - \ln \sum_{i=1}^4 \exp(\beta_1 tc_i + \beta_2 wq_i + \beta_3 size_i) \} / -\beta_1$$

site loss

$$EU^W = E\{\text{Max}(U_1, U_2, U_3, U_4)\}$$

$$EU^{W0} = E\{\text{Max}(U_2, U_3, U_4)\}$$

quality change

$$EU^W = E\{\text{Max}(U_1, U_2, U_3, U_4)\}$$

$$EU^{W0} = E\{\text{Max}(U_1^*, U_2, U_3, U_4)\}$$

This is the expected utility of a trip

