

# Activity Based Travel Demand Analysis and Modeling: Progress and Prospects

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# Presentation Outline

- ∞ Introduction
- ∞ Principles and Approaches to Travel Demand Analysis
- ∞ Progress in Activity Modeling
- ∞ Analysis of Activity Participation
- ∞ Modeling Advances
- ∞ Future Directions
- ∞ Summary and conclusions

## Modeling Principle

Develop the least complex representation of a real-world phenomenon which retains the most important elements of behavior required to enhance understanding and support decision-making.

The essence of travel behavior is its derivation from the needs/desires of individuals and households to satisfy activity participation needs.

# Basis for Enhancements in Activity Based Travel Demand Modeling

## ∞ Advances in

- Modeling
- Computational and data management capabilities
- Behavioral understanding

## ∞ Enable the development of enhanced activity based models.

# Trip-based Approaches to Travel Demand Analysis

- ∞ Focuses on independent trips and individuals
- ∞ Does not consider relationship between activities and trips
- ∞ Does not consider time-use or time of day context in which activity/travel decisions are made

# Activity-Based Approaches to Travel Demand Analysis

- ∞ Views travel as a “derived” demand
- ∞ Framework recognizes complex space-time interactions and time-use context
- ∞ Focuses on sequences of activity behavior, with day (or longer) as the unit of analysis
- ∞ Treats time as a continuous entity including individual time-use decisions

# Activity Based Study Approaches

- ∞ Time allocation to activity types
- ∞ Time and duration of activity episodes
- ∞ **Activity pattern analysis**

# Conceptual Origins of Activity Analysis

- ∞ Motivation framework - Chapin
- ∞ Space-time prism – Hagerstrand
- ∞ Incorporation of varying degrees of rigidity of constraints – Cullen and Godson
- ∞ Consideration of individual's perception of action space and “bounded” mental capabilities – Heideman



# Theoretical Bases for Activity Analysis

- ∞ Motivational theories (psychology and anthropology) - behavior is dictated by felt needs
- ∞ Sociological and Planning theories - influence of household structure, roles and relationships
- ∞ Economic theories - optimal time allocation based on market and non-market constraints
- ∞ Geographical and urban planning theory

# Develop a Comprehensive Theory of Activity Pattern Analysis

∞ Integrated theory for time, activity and resource allocation among individuals in a household

- Time Allocation to Activity Types
- Scheduling
- Tours and Stop Assignment
- Activity and Resource Allocation
- Mode(s) for each tour
- Joint Activities

# Accommodate Inter-Individual and Time Interactions in Activity Analysis

- ∞ Some models treat time as a continuous entity but exclude inter-individual interactions
  - (e.g., Bhat and Singh, 1998; Kitamura and Fujii, 1996)
- ∞ Others include inter-individual interactions but treat time as non-continuous
  - (e.g., Wen and Koppelman, 1999; Gliebe and Koppelman, 2000]
- ∞ Need to integrate inter-individual interactions within a continuous time domain

# Travel Complexity, Prevalence of Multi-Stop Tours

		Number of home-based tours		
		1	2	3+
Number of daily stops	1	43.5%		
	2	20.2%	35.7%	
	3	15.6%	21.1%	22.3%
	4+	20.7%	43.2%	77.7%
	<i>Total</i>	100.0%	100.0%	100.0%

# Work and Non-work Tours by Gender

Non-work tours	Work tours			
	<i>None</i>	<i>Female Only</i>	<i>Male Only</i>	<i>Female &amp; Male</i>
<i>None</i>	9.1%	12.4%	14.3%	44.2%
<i>Female Only</i>	9.5%	2.8%	48.4%	19.4%
<i>Male Only</i>	12.7%	45.5%	5.3%	16.5%
<i>Female &amp; Male</i>	68.8%	39.3%	32.0%	19.9%
<i>Total</i>	100.0%	100.0%	100.0%	100.0%

# Work and Non-work Tours by Gender: No Children

Non-work tours	Work tours			
	<i>None</i>	<i>Female Only</i>	<i>Male Only</i>	<i>Female &amp; Male</i>
<i>None</i>	9.8%	8.7%	14.9%	43.8%
<i>Female Only</i>	9.8%	4.3%	49.2%	17.5%
<i>Male Only</i>	14.2%	44.3%	7.0%	19.3%
<i>Female &amp; Male</i>	66.2%	42.6%	28.9%	19.3%
<i>Total</i>	100.0%	100.0%	100.0%	100.0%

# Work and Non-work Tours by Gender: Children in Household

Non-work tours	Work tours			
	<i>None</i>	<i>Female Only</i>	<i>Male Only</i>	<i>Female &amp; Male</i>
<i>None</i>	7.6%	19.0%	13.2%	44.9%
<i>Female Only</i>	8.8%	0.0%	47.1%	23.2%
<i>Male Only</i>	9.9%	47.6%	2.2%	10.9%
<i>Female &amp; Male</i>	73.7%	33.3%	37.5%	21.0%
<i>Total</i>	100.0%	100.0%	100.0%	100.0%

# Activity Pattern Travel Modeling

## ∞ Activity generation models

- Tours, stops, auto and stop allocation

## ∞ Activity scheduling models

- Computerized production systems

## ∞ Generation and Scheduling Models

- Daily activity schedule analysis



# The Activity Episode Generation and Scheduling Process

- ∞ Information acquisition
- ∞ Use of information/perception in activity participation and location decisions?
- ∞ Decision structure relationships for attributes of activity episodes
- ∞ Role of planning vs. spontaneous decision making in revealed activity patterns.
- ∞ Challenge: to understand internal mechanism leading to revealed patterns

# Joint vs. Individual Activity Participation

## ∞ Motivation

- Efficiency - task synergy
- Companionship -- activity is partly or primarily social
- Altruism -- provide ride or support

## ∞ Influencing Attributes

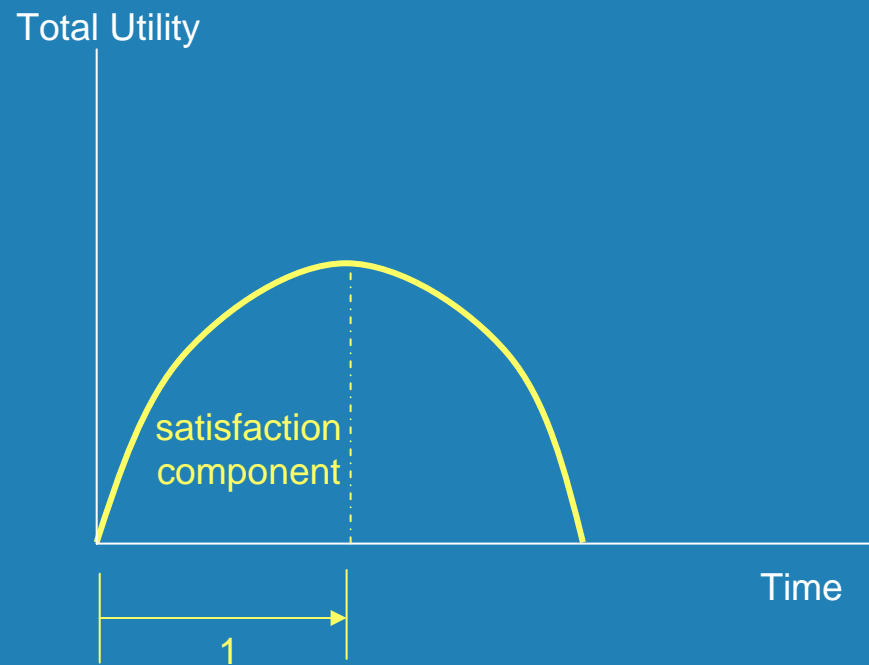
- Employment
- Children in household
- Auto ownership

# Patterns of Joint Tours

Start of Joint Sequence	End of joint sequence	
	<i>Return home together</i>	<i>Depart separately</i>
<i>Leave home together</i>	75.2%	7.5%
<i>Meet out-of-home</i>	11.2%	6.1%

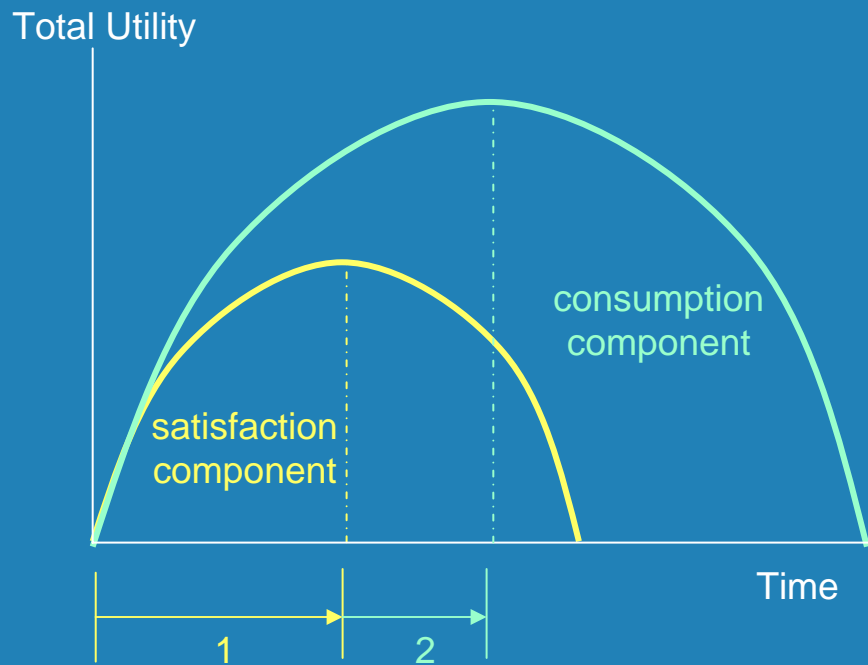
15.2% of all person tours include one or more activity stops

# Household / Individual Utility Components



1. Utility associated with value of activity participation

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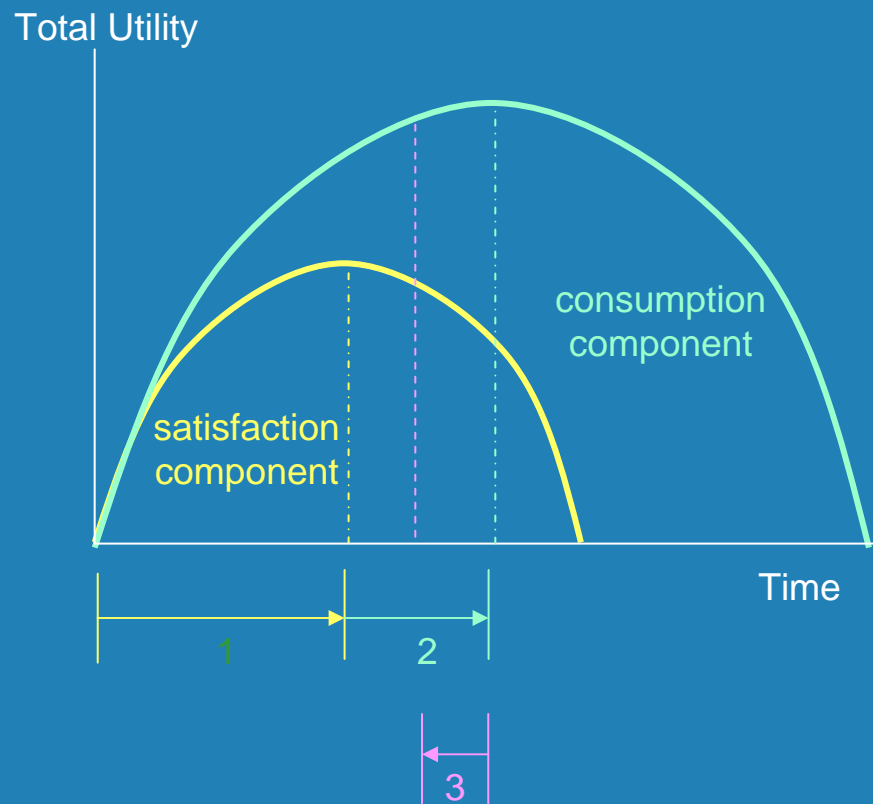


1. Utility associated with value of activity participation

2. Total utility due to activity participation and household consumption effect

# Household / Individual Utility Components

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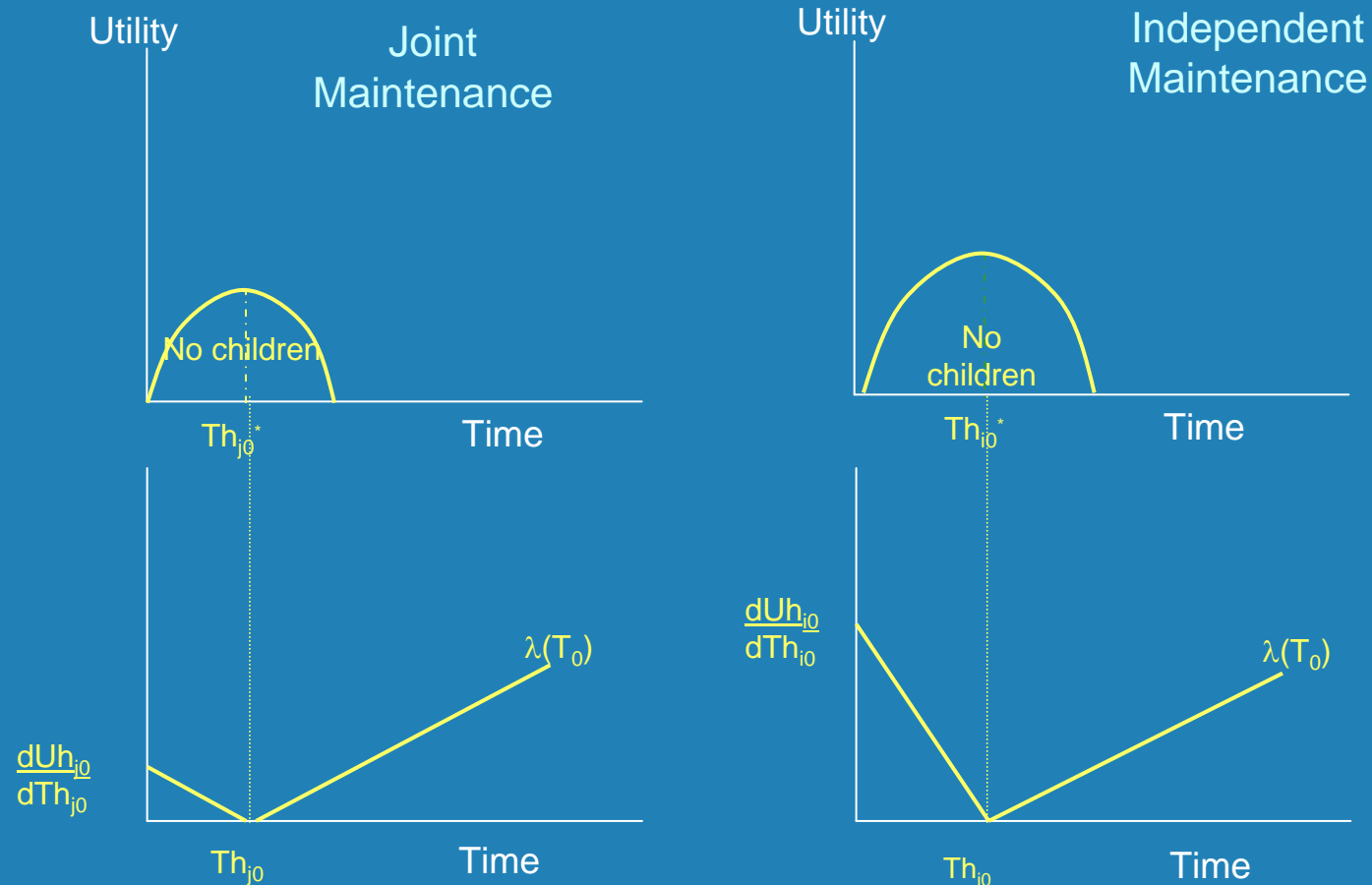


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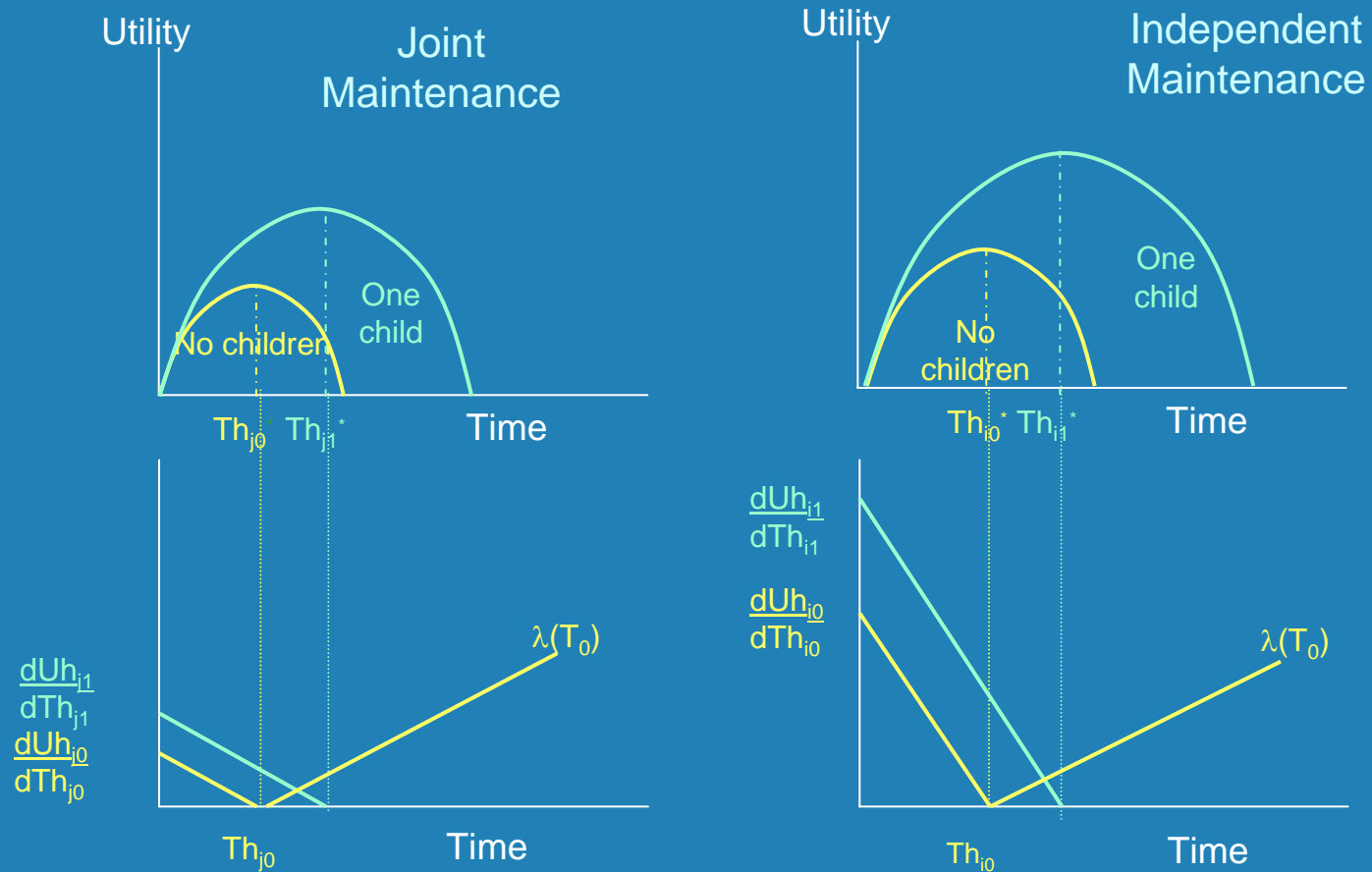
2. Total utility due to activity participation and household consumption effect

3. Effect of opportunity cost of time

# Example: Impact of Young Children

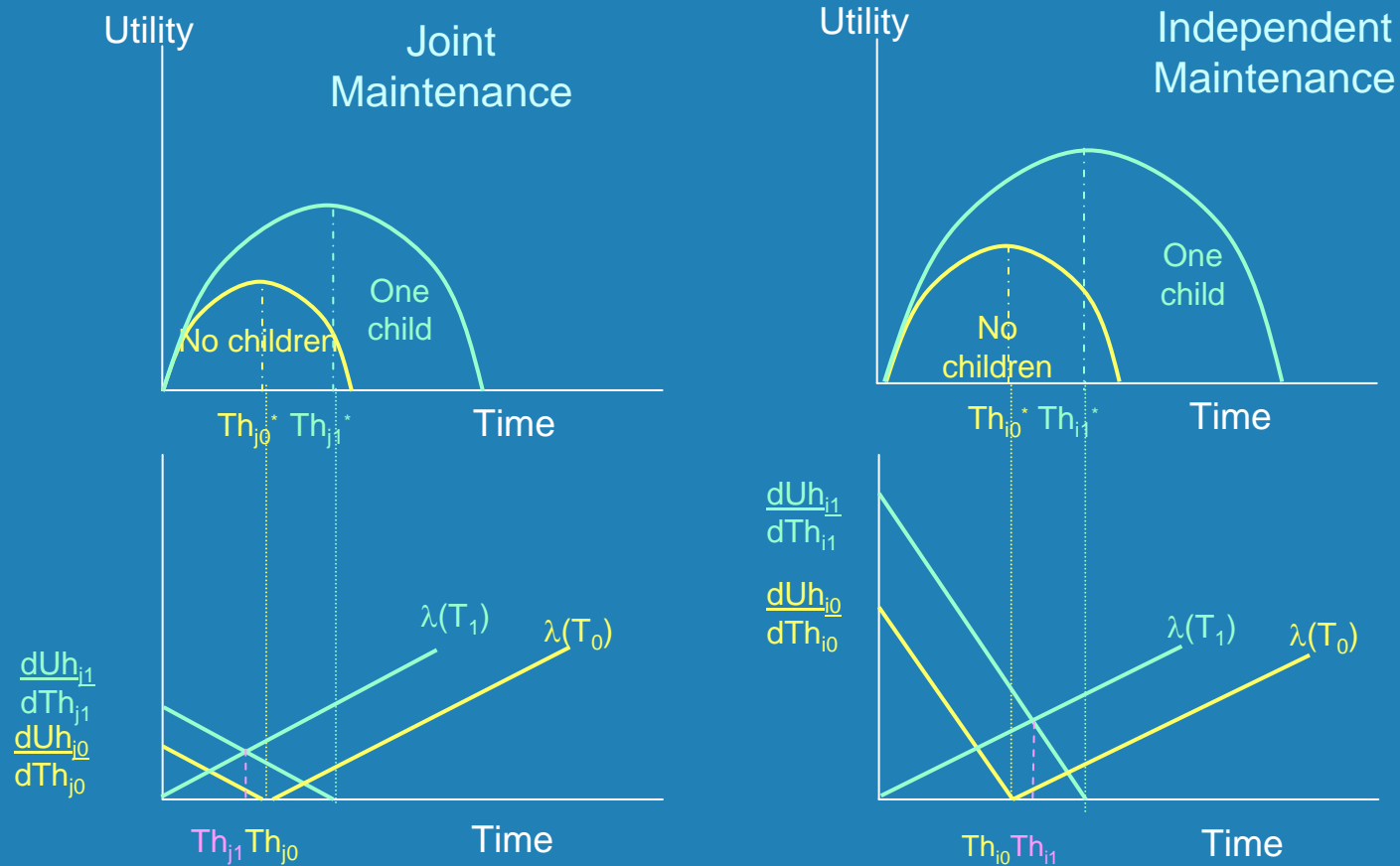


# Example: Impact of Young Child





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# Pattern Analysis Results: Better Specification of Trip-Based Models

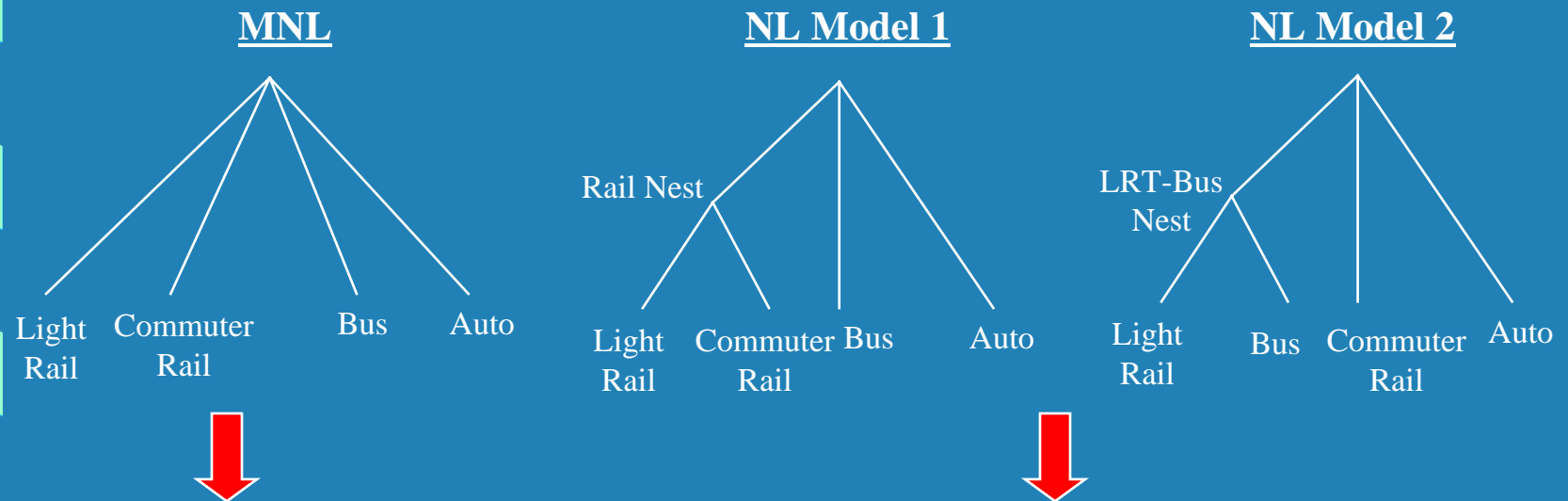
- ∞ Stop-making effect on mode choice
- ∞ Accommodating lifecycle, descriptors; temporal and spatial constraints
- ∞ Inter-relationships between home-based and non home-based trips

# Pattern Analysis Results: Emergence of Comprehensive Activity Models

- ∞ Analyze entire daily activity-travel pattern within the context of a continuous time domain
- ∞ Enable consideration of substitution in
  - Time
  - Mode
  - Person
  - Location

# Modeling Substitution

## Mode Choice Example



IIA Problem -> Equal Substitution

1. Alleviates IIA problem, but only in part
2. Nesting structure imposes restrictions on substitution relationships between pairs of alternatives

## Modeling Substitution (continued)

### Generalized Nested Logit (GNL) Model

- ∞ Allows alternatives to be assigned to multiple nests in portions to be estimated
- ∞ Provides high degree of flexibility in modeling substitution patterns
- ∞ Reduces to MNL (and other GEV models) under appropriate restrictions

# Modeling Substitution (continued)

## GNL Probability Equations

$$P_i = \sum_m \left[ \frac{\text{Probability of alternative } i}{\text{Given nest } m \text{ chosen}} \times \text{Probability of nest } m \right]$$

# Modeling Substitution (continued)

## GNL Probability Equations

$$P_i = \sum_m \left[ \frac{(\alpha_{im} e^{V_i})^{\frac{1}{\theta_m}}}{\sum_{j \in N_m} (\alpha_{jm} e^{V_j})^{\frac{1}{\theta_m}}} \times \frac{\left( \sum_{j \in N_m} (\alpha_{jm} e^{V_j})^{\frac{1}{\theta_m}} \right)^{\theta_m}}{\sum_m \left( \sum_{j \in N_m} (\alpha_{jm} e^{V_j})^{\frac{1}{\theta_m}} \right)^{\theta_m}} \right]$$

$V_i$  is the systematic component of the utility for alternative  $i$

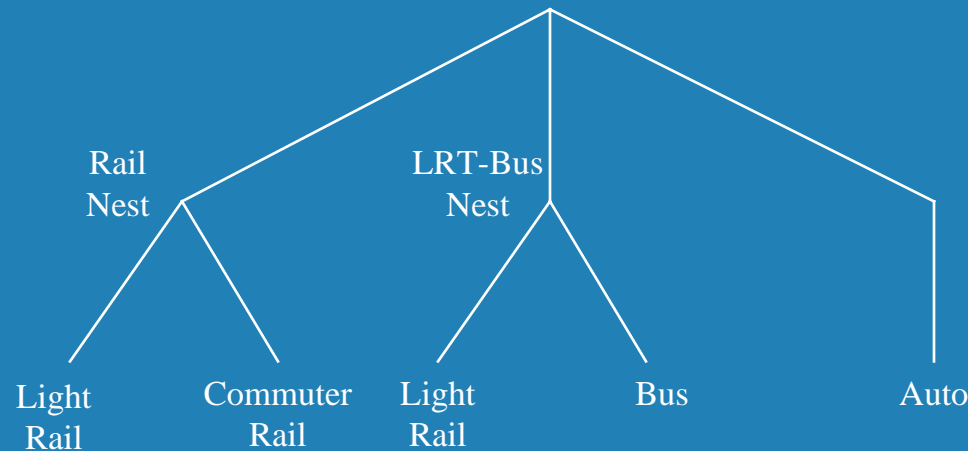
$N_m$  is the set of all alternatives included in nest  $m$

$\theta_m$  is the similarity parameter for nest  $m$

$\alpha_{im}$  is the portion of alternative  $i$  allocated to nest  $m$

# Modeling Substitution (continued)

## GNL Model 1

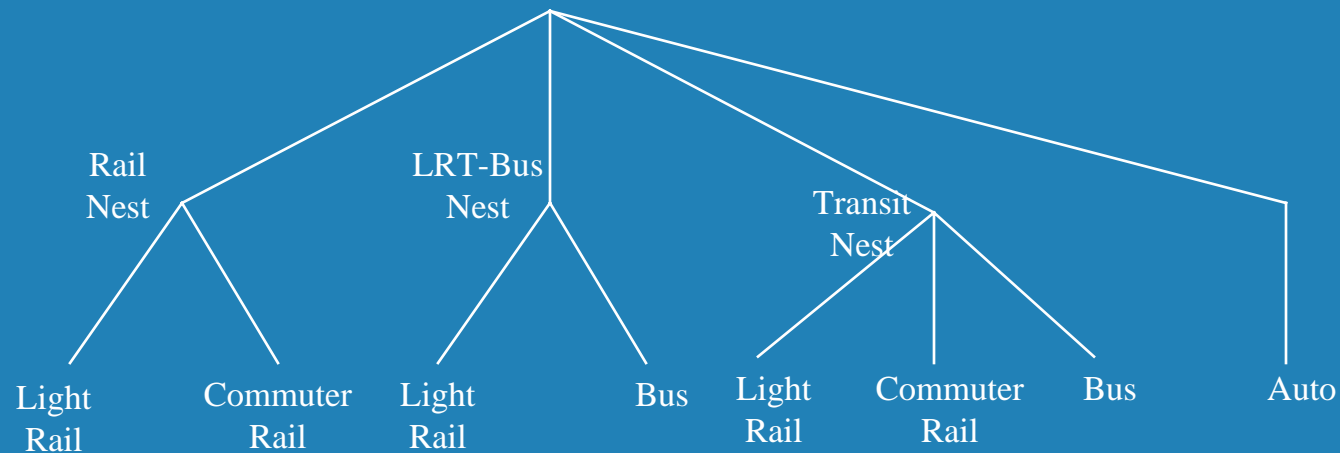


∞ Allows differential substitution between Light Rail-Commuter Rail and Light Rail-Bus



# Modeling Substitution (continued)

## GNL Model 2



∞ Provides increased flexibility over GNL1 by adding nest for all transit alternatives

# Implication for Regional and Statewide Activity Modeling

- ∞ Enhancement of policy analysis (policies which influence individual/household activity patterns)
  - Urban development and location patterns
  - Transportation service improvements
- ∞ Improved quality of life analysis
- ∞ Improved linkage between state and metropolitan area studies

# Future Directions

- ∞ Inter-individual interactions
- ∞ Time-space interactions
- ∞ In-home and out-of-home activity substitution
- ∞ Household as unit of analysis
- ∞ The decision mechanism

## Summary

- ∞ Substantial progress in empirical research in recent years
- ∞ Activity based travel paradigm is increasingly accepted as the basis for demand analysis
- ∞ Important theoretical and methodological advances still to be made
- ∞ Limited knowledge of the fundamental mechanism underlying activity pattern decisions