

# Modelling Demands for Transportation Energy: Applications and Scope in Transportation Planning

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**Location:** Groupe Deschênes  
HEC Montréal

**Date/Time:** 4:00 pm, Jan 31<sup>st</sup> 2017

Symposium annuel Trottier sur l'ingénierie,  
l'énergie et la conception durables



Annual Trottier Symposium on Sustainable  
Engineering, Energy and Design

Transport : à quoi carbure la  
transition ?

11 – 12 avril 2017  
Polytechnique Montréal

Transportation : What's Fuelling  
the Transition ?

April 11 – 12, 2017  
Polytechnique Montréal



# Outline

- Transportation Energy Demands and Influential Factors
- Practices of Energy System Modelling for Energy Policies
- Practices of Transport Energy Demand Modelling Frameworks
- Combining Energy System Model to Enhance Transportation Demand/Behaviour Representations

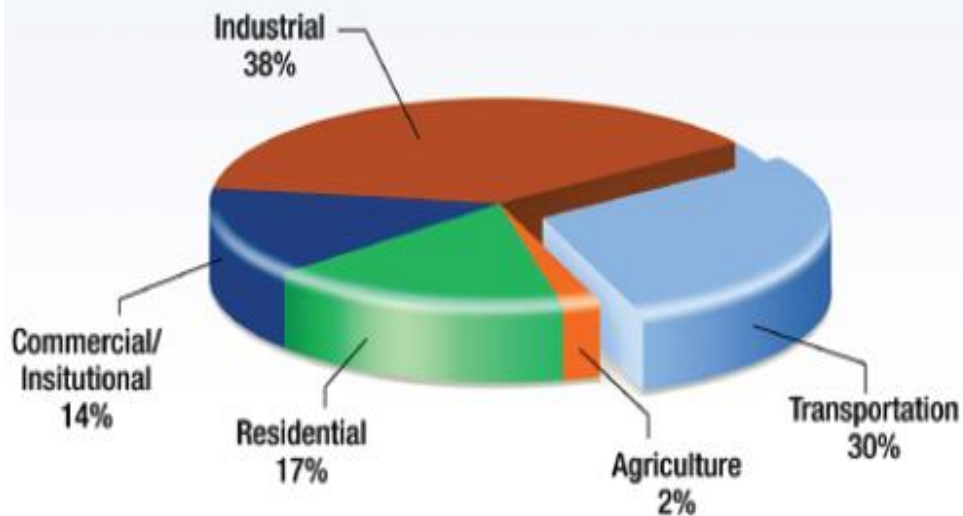


# Introduction

- Energy is the fundamental enabler of transportation system:
  - ✓ Emission is a major externality of transportation.
- Obviously, transportation planning exercise target more of urban transportation issues (congestion, emissions, fatalities, etc.) than energy policy
  - ✓ Energy policy effects are considered external factors, e.g. fuel price, availability of mode technologies, fuel efficiency.
- Combining behavioural elements of travel demand into energy system modelling is a research challenge

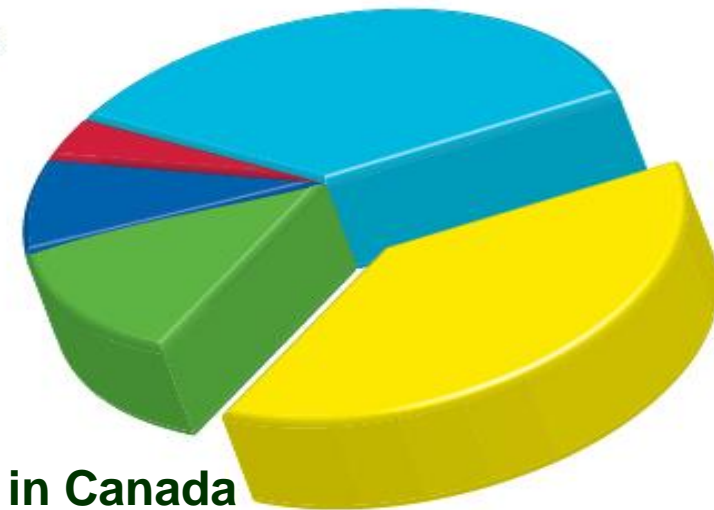
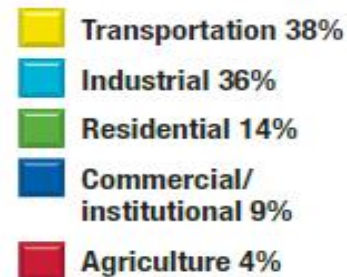


# Transportation Energy and Emissions



➤ 30% energy share, but 38% GHG contribution

## Energy Consumptions in Canada



## GHG Emissions in Canada

# Transportation Demand: Travel Modes



- Energy is a derivative of demand for transportation
- Demand for transportation is a derivative of travel modes

*Canadian Vehicle Use Survey Report 2009*

# Growth in Passenger Transport

1990



- 14.2 million vehicles
- 19.4 percent are light trucks
- 17,246 km/year on average per vehicle
- 378.3 billion Pkm covered
- 0.68 vehicles per person aged 18 years and over

*Increasing private car ownership*

&

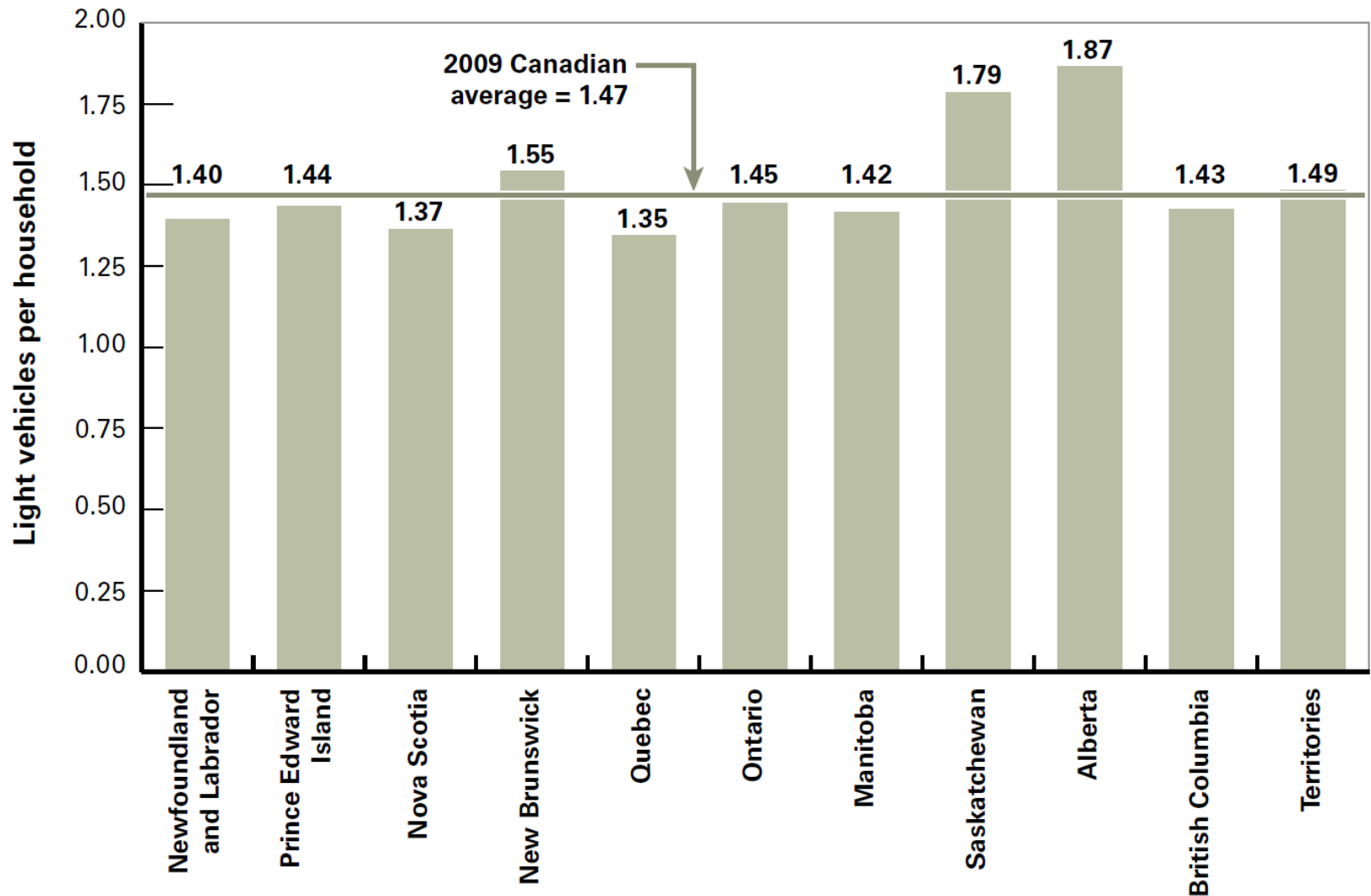
2013



- 20.5 million vehicles
- 37.2 percent are light trucks
- 15,552 km/year on average per vehicle
- 519.7 billion Pkm covered
- 0.73 vehicles per person aged 18 years and over

*Increasing SUV ownership*

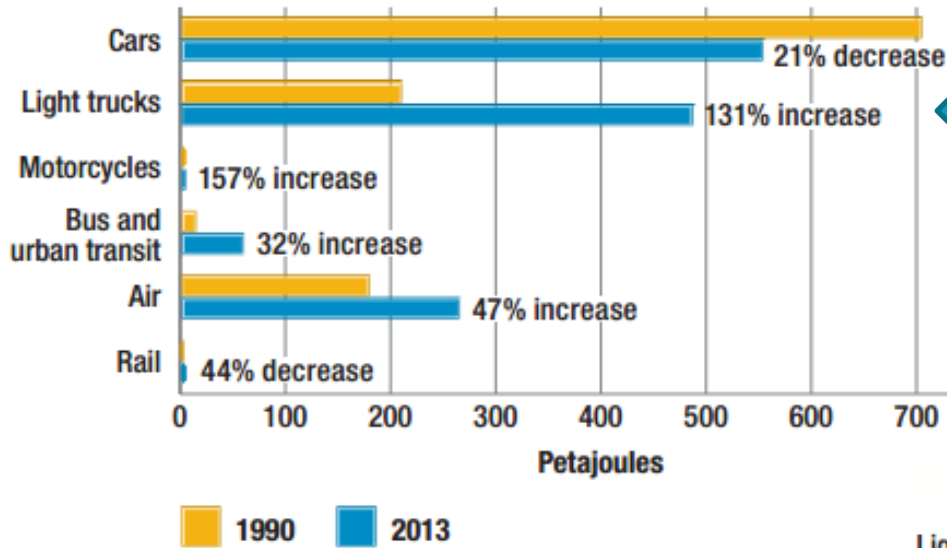
# Passenger Car Ownership



*Canadian Vehicle Use Survey Report 2009*

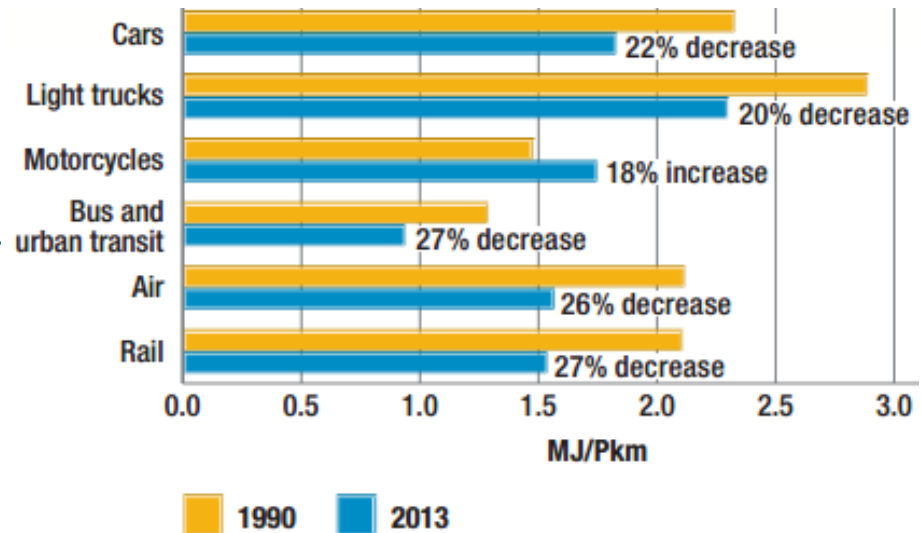


# What Drives the Growths?



*Higher rate of increasing light truck (SUV)*

*With lower rate of energy intensity gain for light trucks (SUV)*

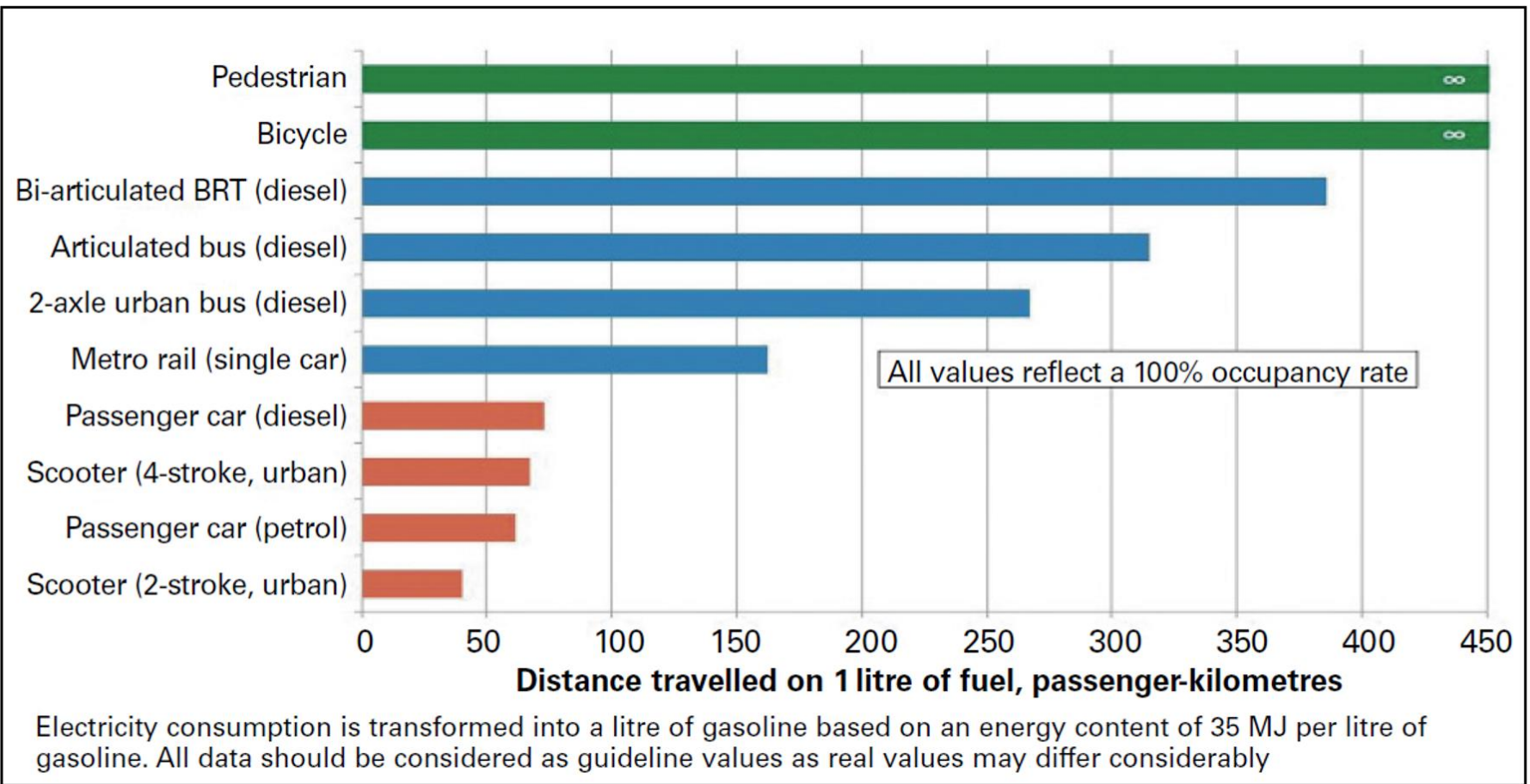


**With increasing constraints in energy availability/source, increasing only fuel efficiency of motorized vehicles may not be enough**

**-Need to promote non-motorized modes and supporting land use**



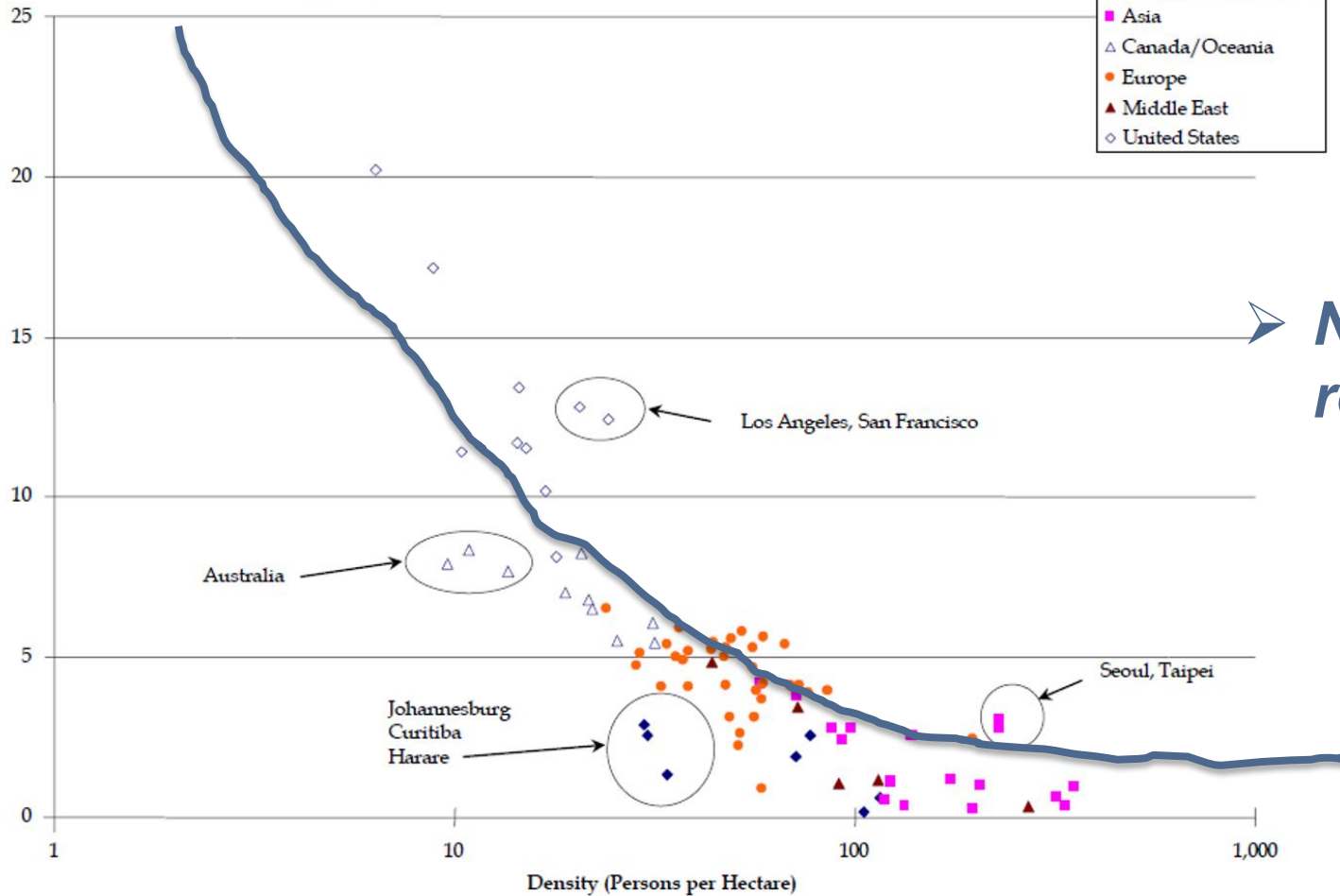
# Travel Mode & Transport Energy Demands



*Bohler-Baedeker and Hugging 2012*

# Transportation Demand – Urban Density

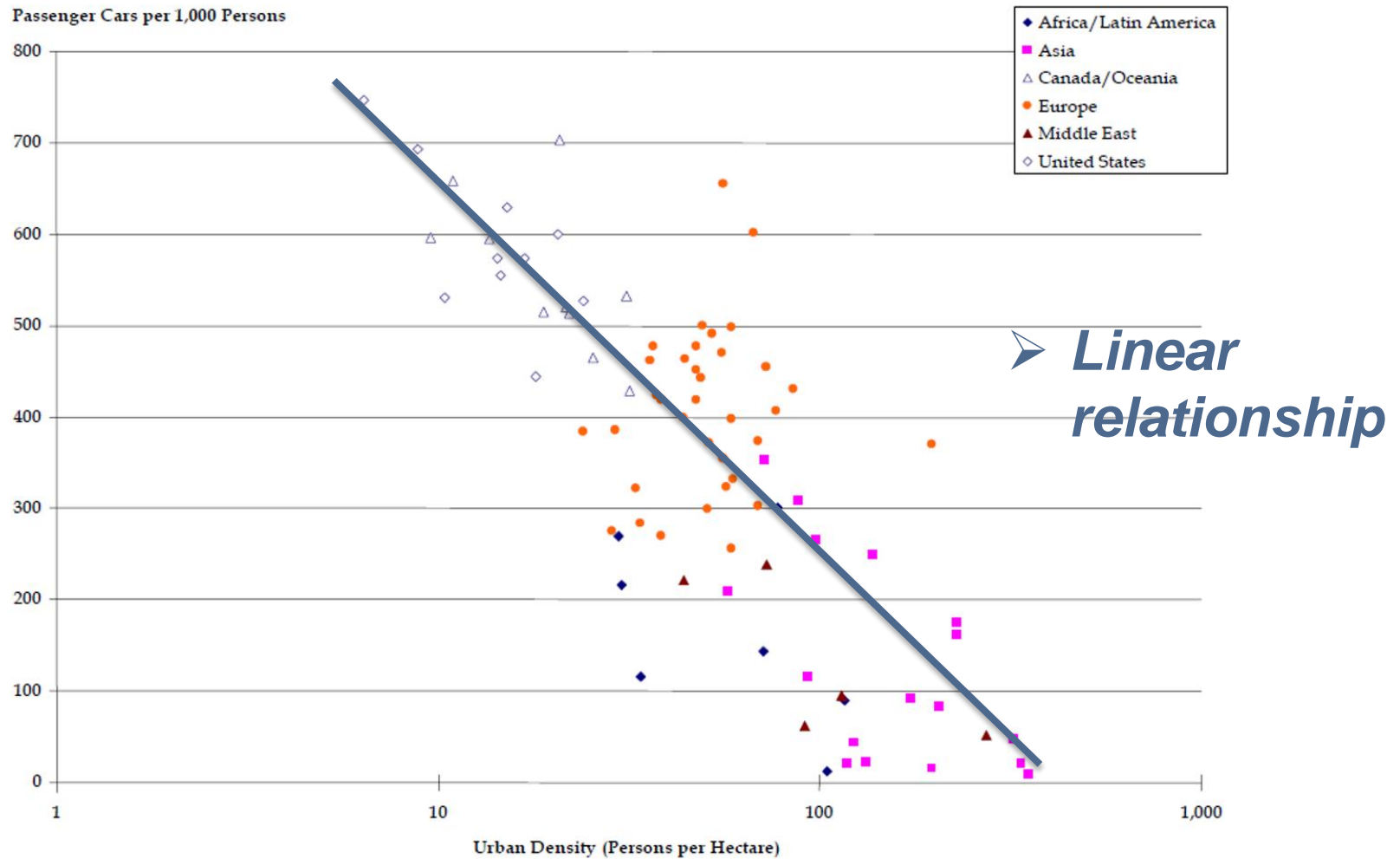
Total Private Vehicle-Kilometers per Capita (in Thousands)



➤ *Non-linear relationship*

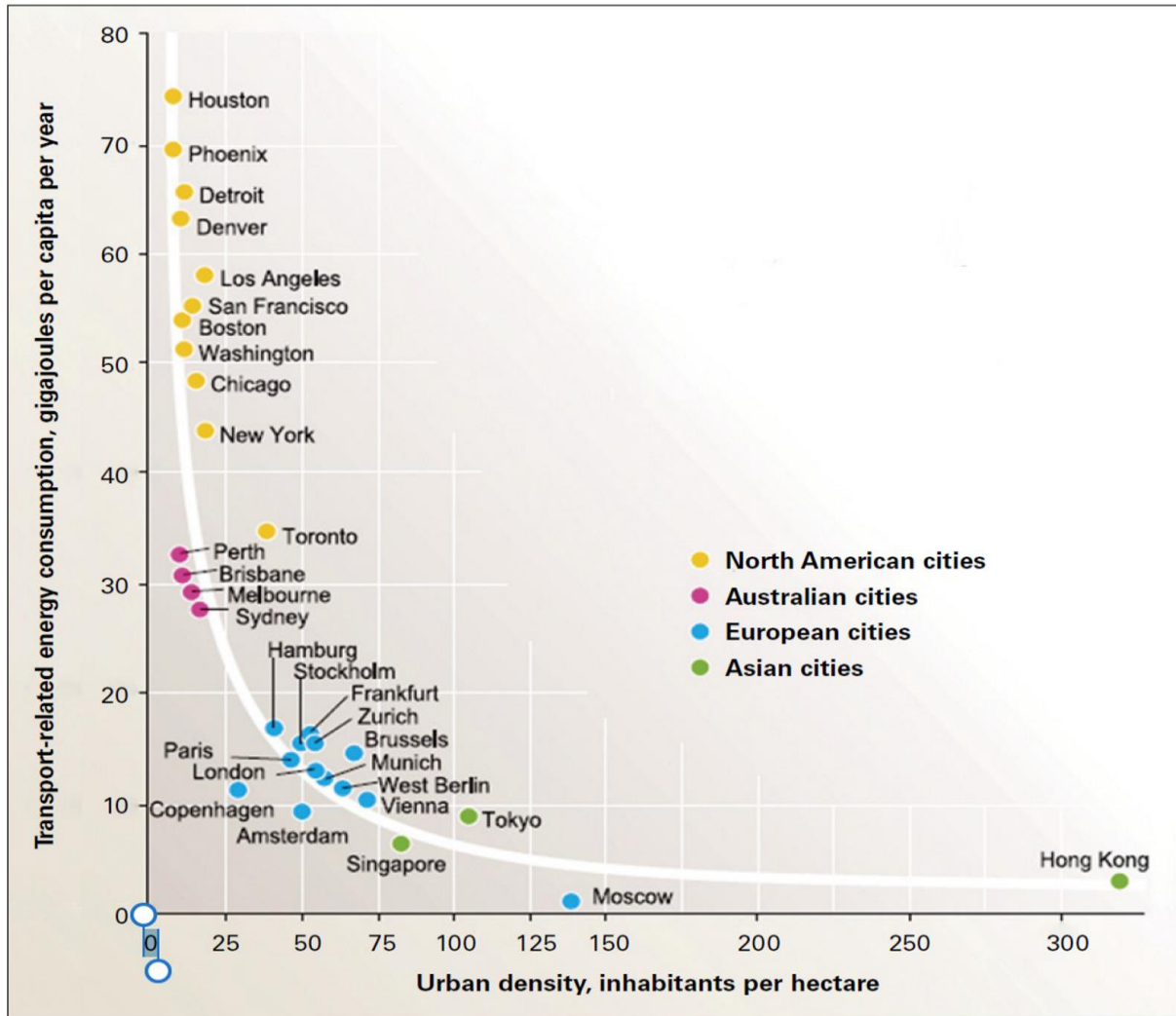
Porter et al 2013

# Passenger Car Ownership – Urban Density



Porter et al 2013

# Urban Density – Energy Consumption



- *Non-linear relationship*
- *Urban density influences car ownership and thereby transport energy demands*

*Kenworthy and Laube 1999*

# How to Manage Energy Demands?

- Managing demand for transportation (TDM: Travel Demand Management)
  - ✓ Pricing: fuel cost, road pricing, tolls, etc.
  - ✓ Land use and smart growth
  - ✓ Encourage active modes (walk, bike, etc.)
  - ✓ Promote public transport
  - ✓ Sharing modes: ride sharing, car sharing, etc.
  - ✓ Regulatory strategies
- Transportation System Management (TSM):
  - ✓ Increase system efficiency: Intelligent Transport System
  - ✓ Bottleneck relief, capacity expansion
  - ✓ Multimodal freight transport



# Example Estimates

Strategy	Percentage of On-Road Energy/GHG Reduction
Pricing	
PAYD Insurance (Mandatory)	2.5%
VMT Fee – \$0.02-\$0.05/Mile	1.0%-2.5%
Congestion Pricing	0.5%-1.1%
Transit Improvements	0.4%-1.1% (2030); 0.6%-2.0% (2050)
Nonmotorized Improvements	0.3%-0.8%
Parking Management	0.3%
Work Site Trip Reduction/Employee Commute Options	0.2%-1.1%
Telework and Alternative Work Schedules	0.9%-1.1%
Ridesharing and Vanpooling	0.1%-2.0%
Carsharing	0.1%-0.2%
Educational and Marketing Campaigns	0.3%-0.5%+
Eco-Driving and Maintenance	1.1%-5.0%
Idle Reduction	0.1%-0.4%
Speed Limit Reduction/Enforcement	1.7%-2.7%
<b>Combined Effects</b>	<b>7.0%-15.3%</b>

Source: Effects of Travel Reduction and Efficient Driving on Transportation Energy Use and Greenhouse Gas Emissions, prepared by Cambridge Systematics for National Renewable Energy Laboratory, 2012

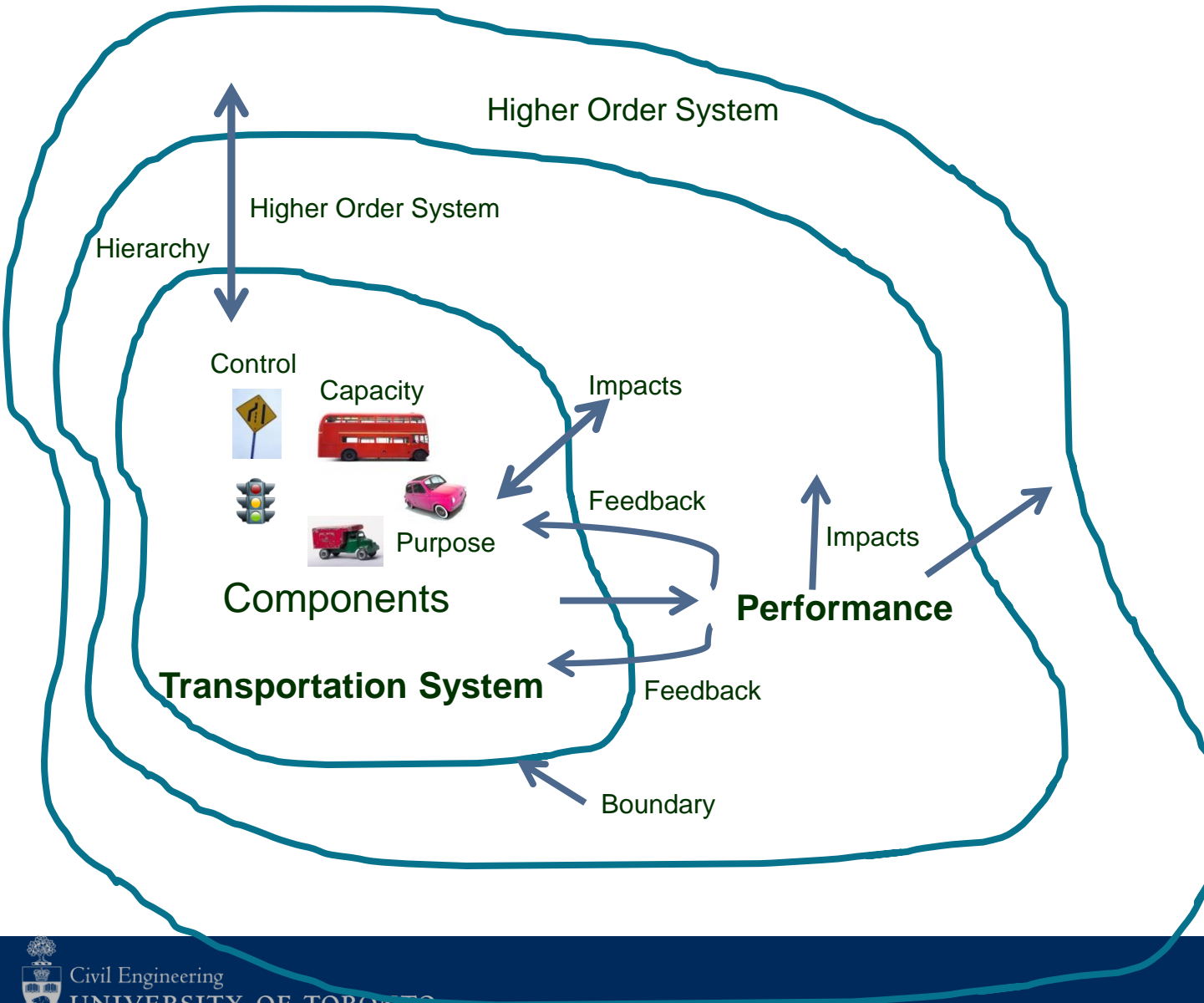




# **Understanding Transportation Energy Demands requires complete understanding of transportation system**



# System Perspective of Transportation



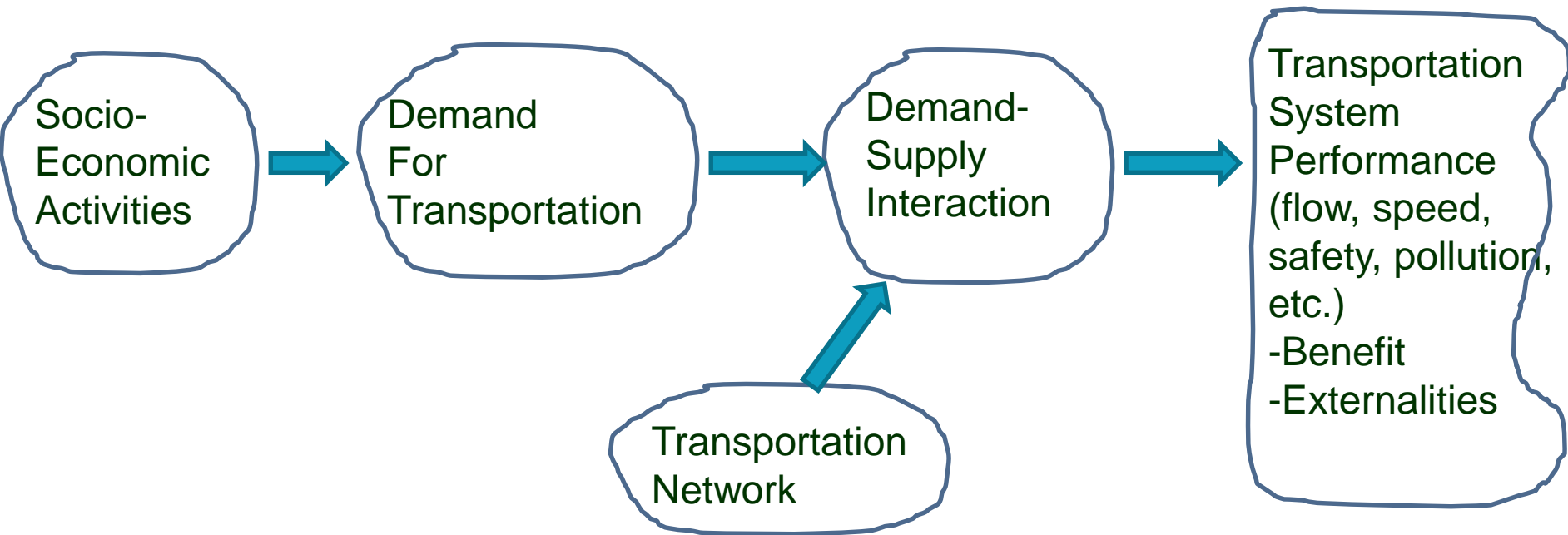
➤ a group of interrelated components.

➤ form a complicated and unified whole.

➤ intended to serve some purposes.

➤ through the performance of its interactive parts.

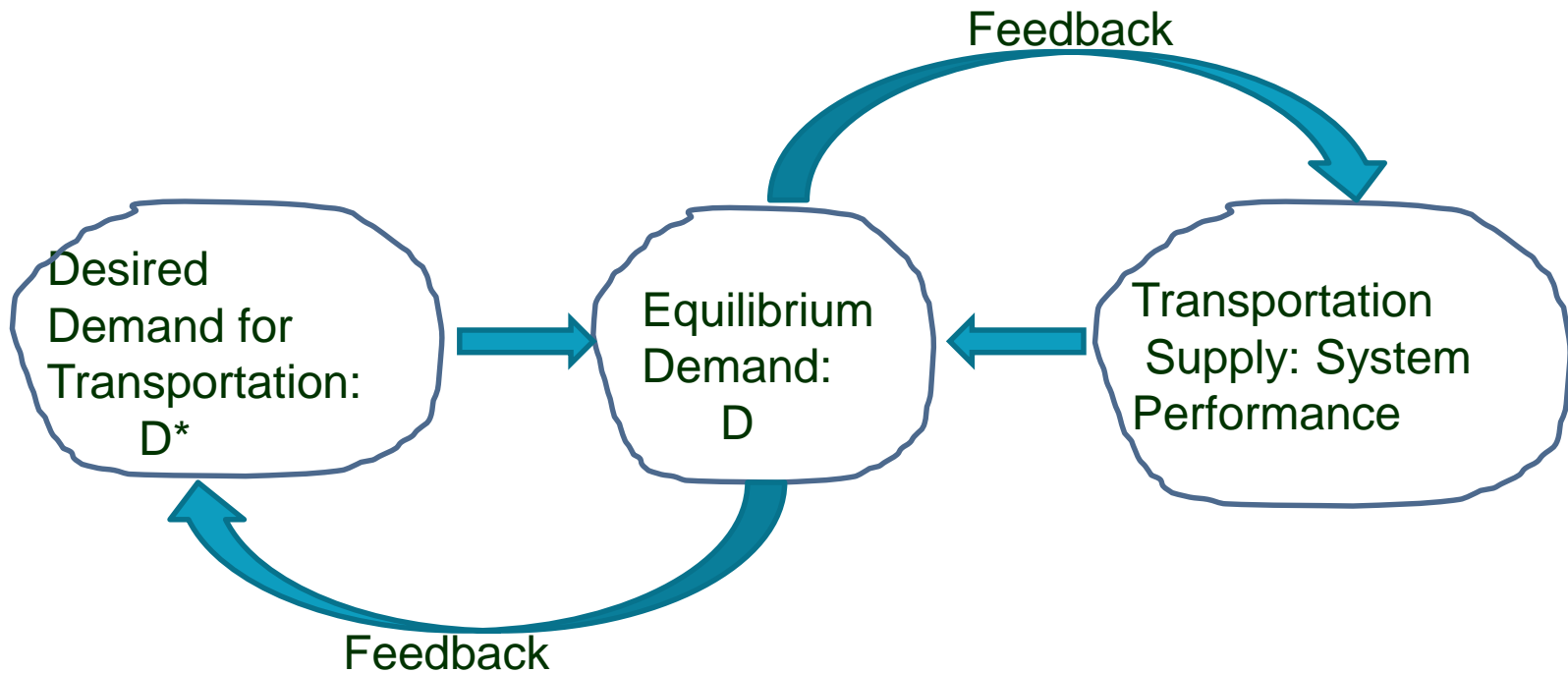
# Transportation: Demand-Supply Perspective



## System Performance:

- An important consideration guiding the definition of problems and opportunities that become focus of planning efforts.
- System performance measures are necessary for the decision-making process in transportation planning.
- System performance measures should be defined not only as outputs, but also as the outcomes on society.

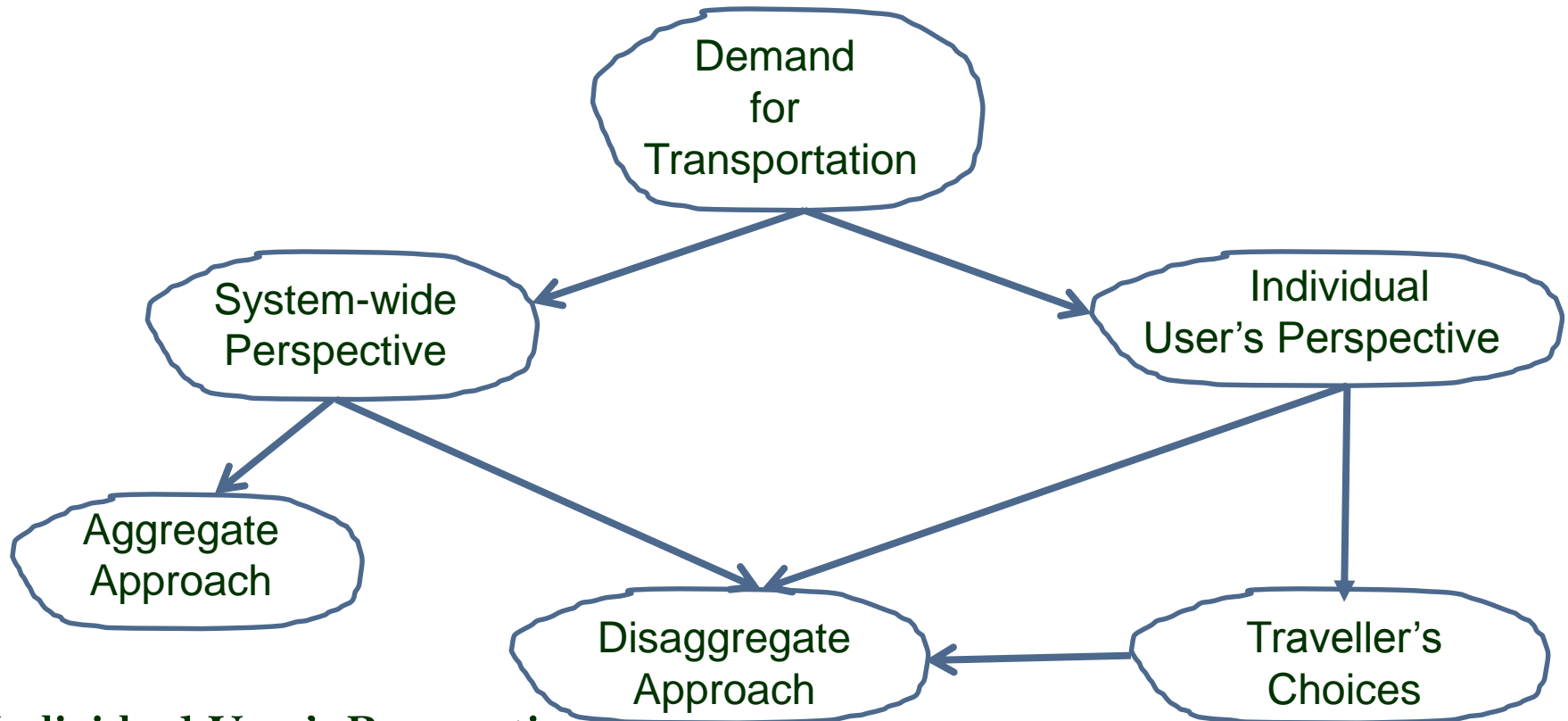
# System Performance $\leftrightarrow$ Feedback



## Dynamics of Demand-Supply Interaction:

- Observed demand is equilibrium demand.
- Desired demand is always higher than the equilibrium demand.
- Changes in system performance affects demand as well as system performance.
- Truly dynamic and two-way interaction and feedback.

# Measuring Demand: Users' Perspective



## Individual User's Perspective:

- Understanding urban spatial and socio-economic context.
- Understanding preferences or options.
- Understanding choice making behaviour.
- Evaluating elasticity of demands.



# “Demand” vs “Behavior”

## *Demand*

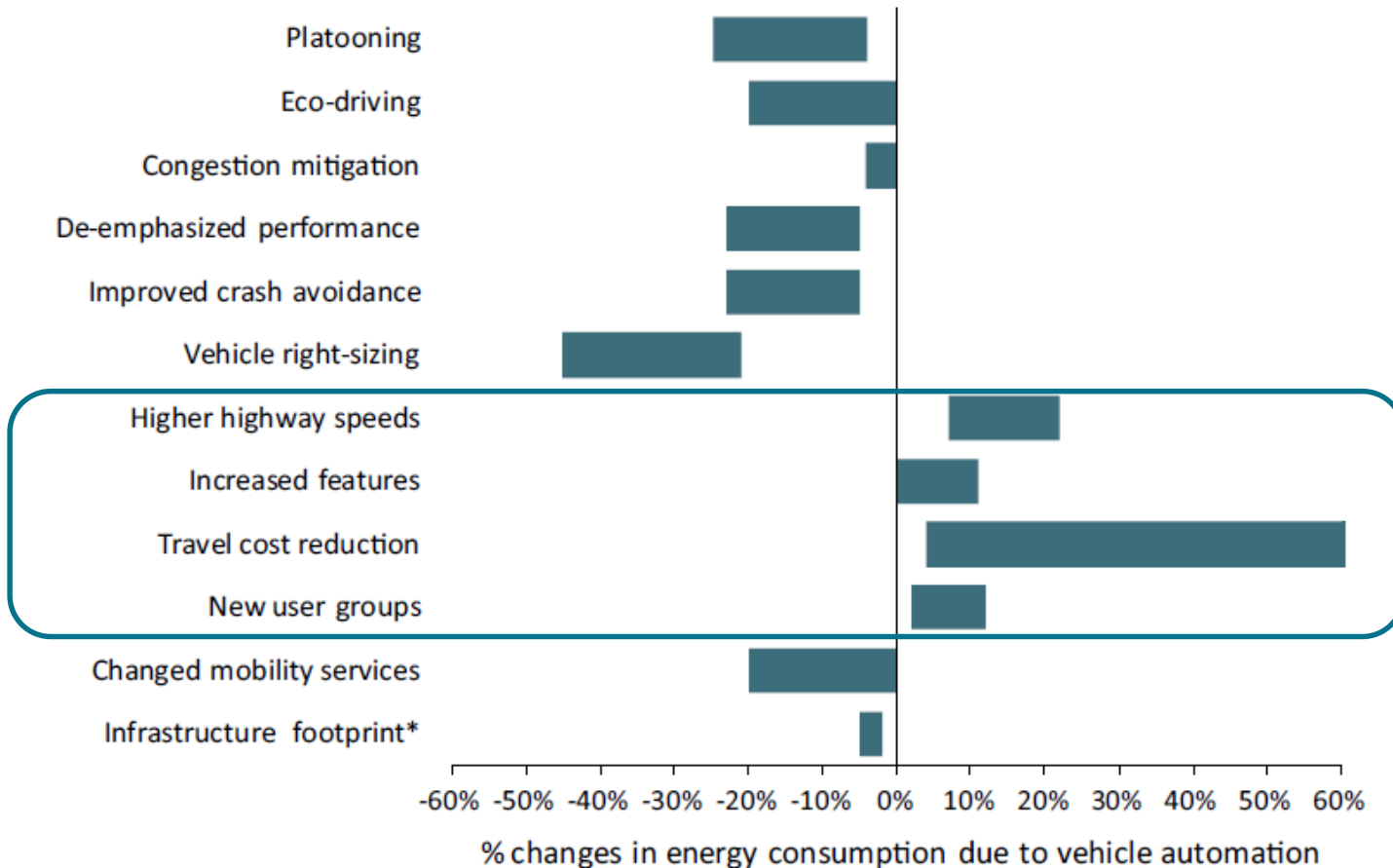
- Aggregate
- Easy to measure
- Realizations of probable outcomes



## *Behavior/Choice*

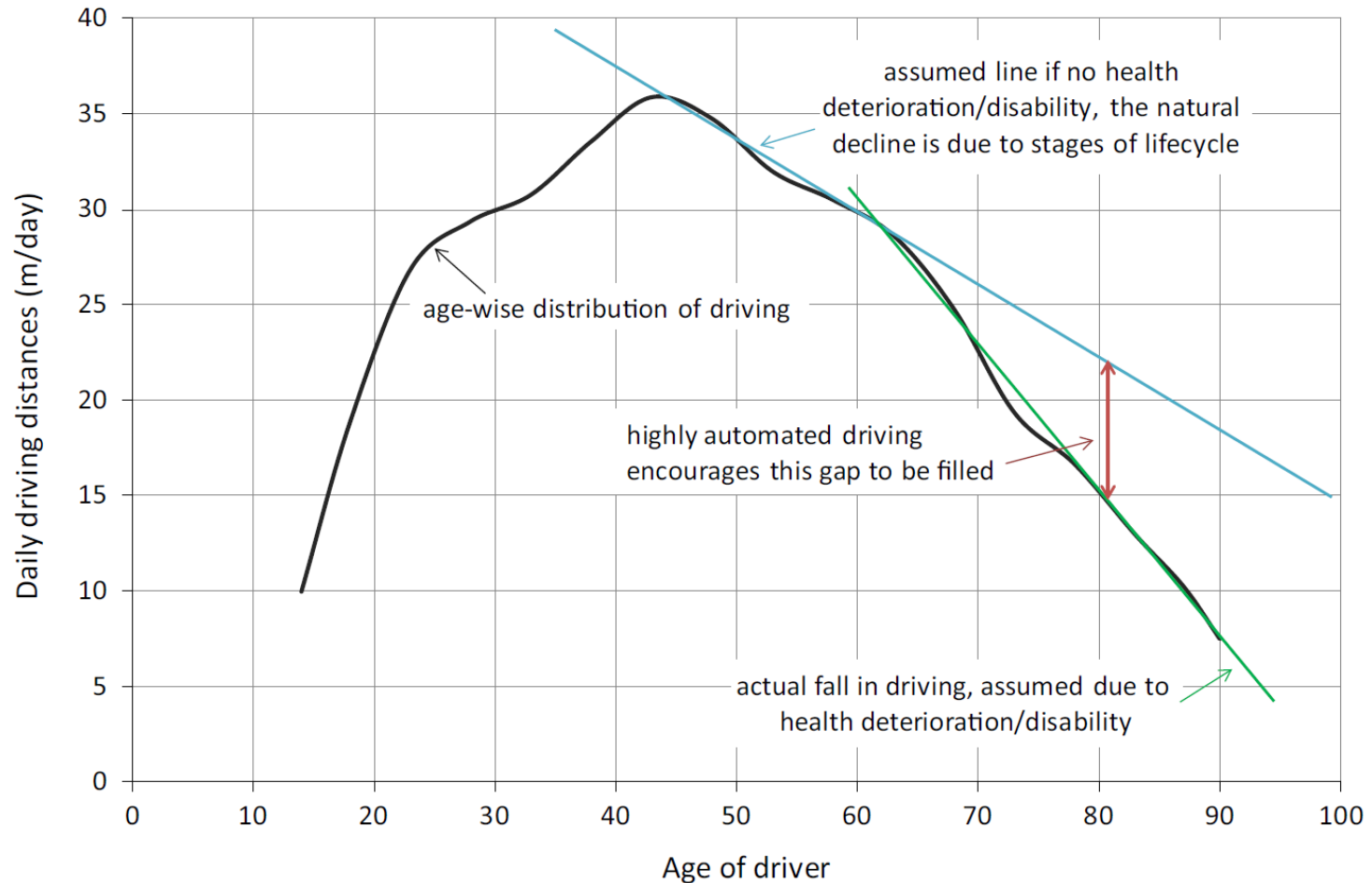
- Disaggregate
- Often abstract and difficult to measure
- Shaped by contexts

# Necessity of Behavioral Models



Wadud et al, 2016

# Necessity of Capturing Heterogeneity

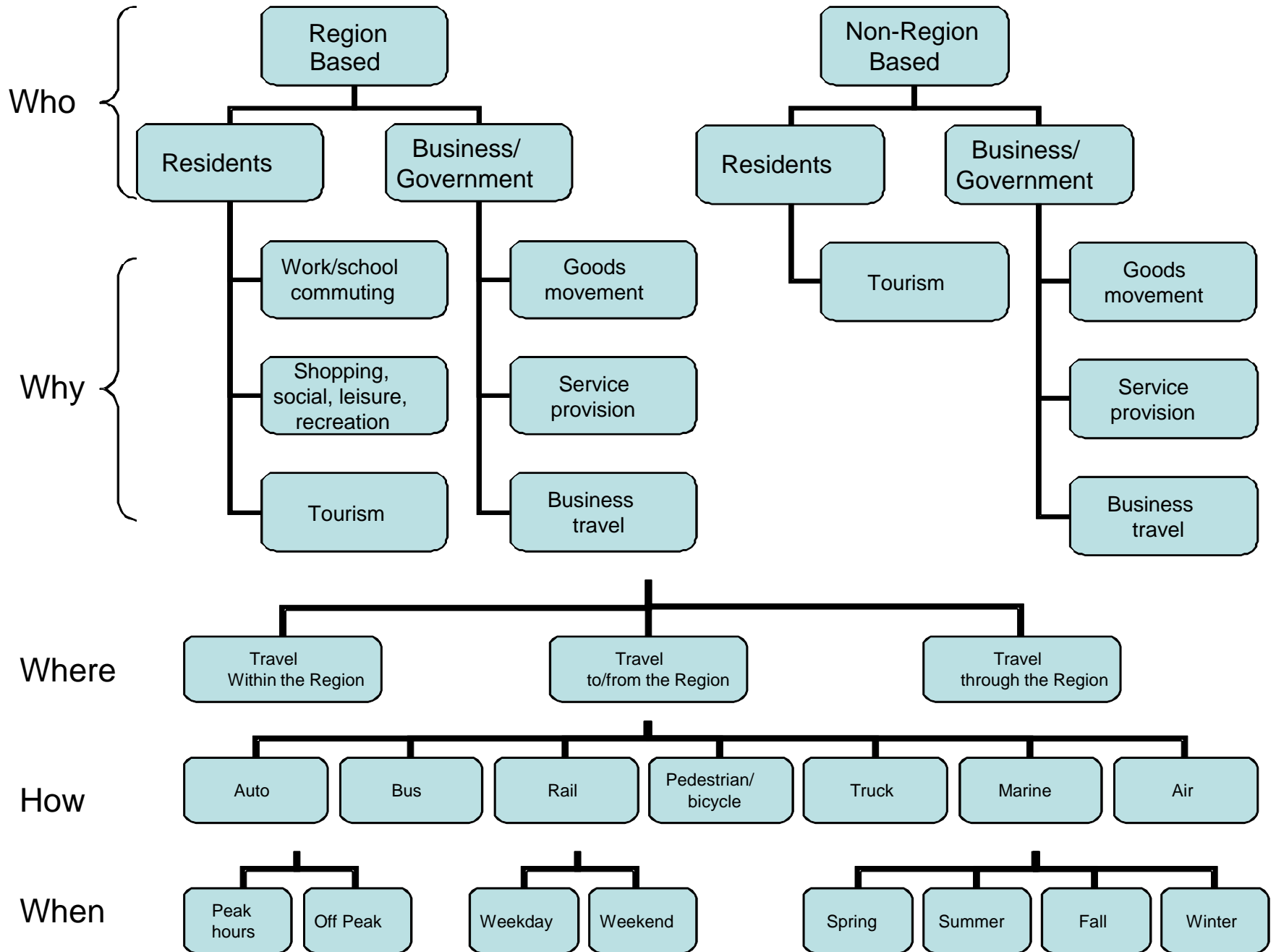


Wadud et al, 2016

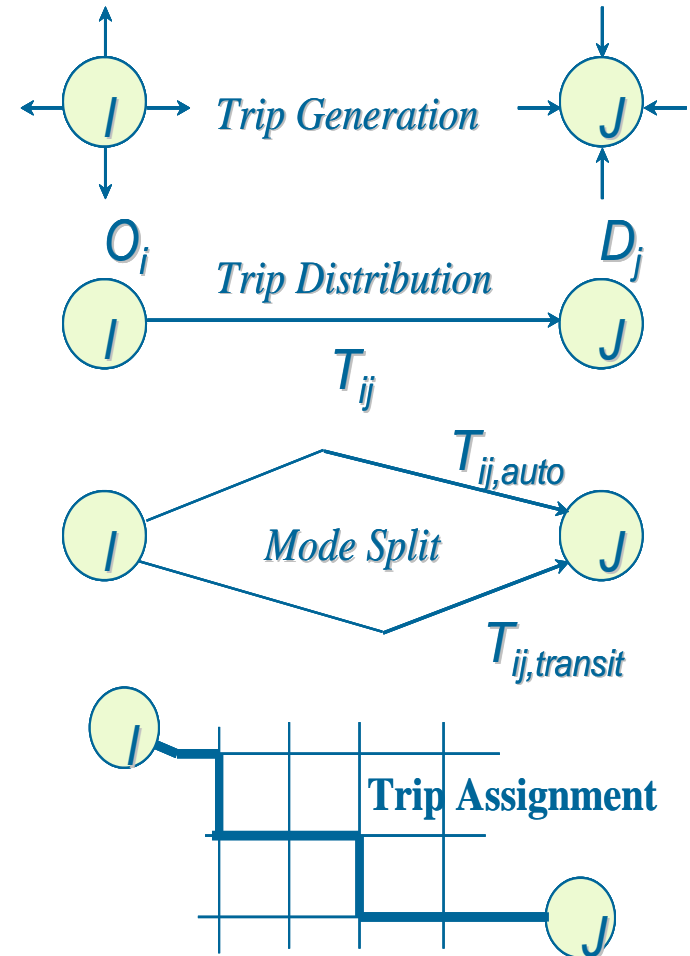
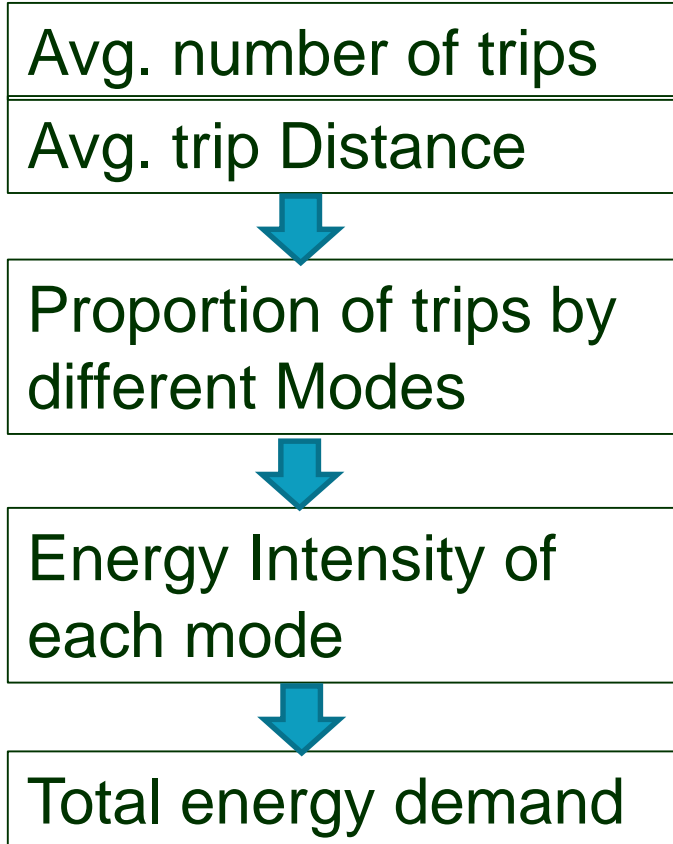


# **Measuring Transportation Behaviour requires Complete Specification of Transportation Choices/Decision**

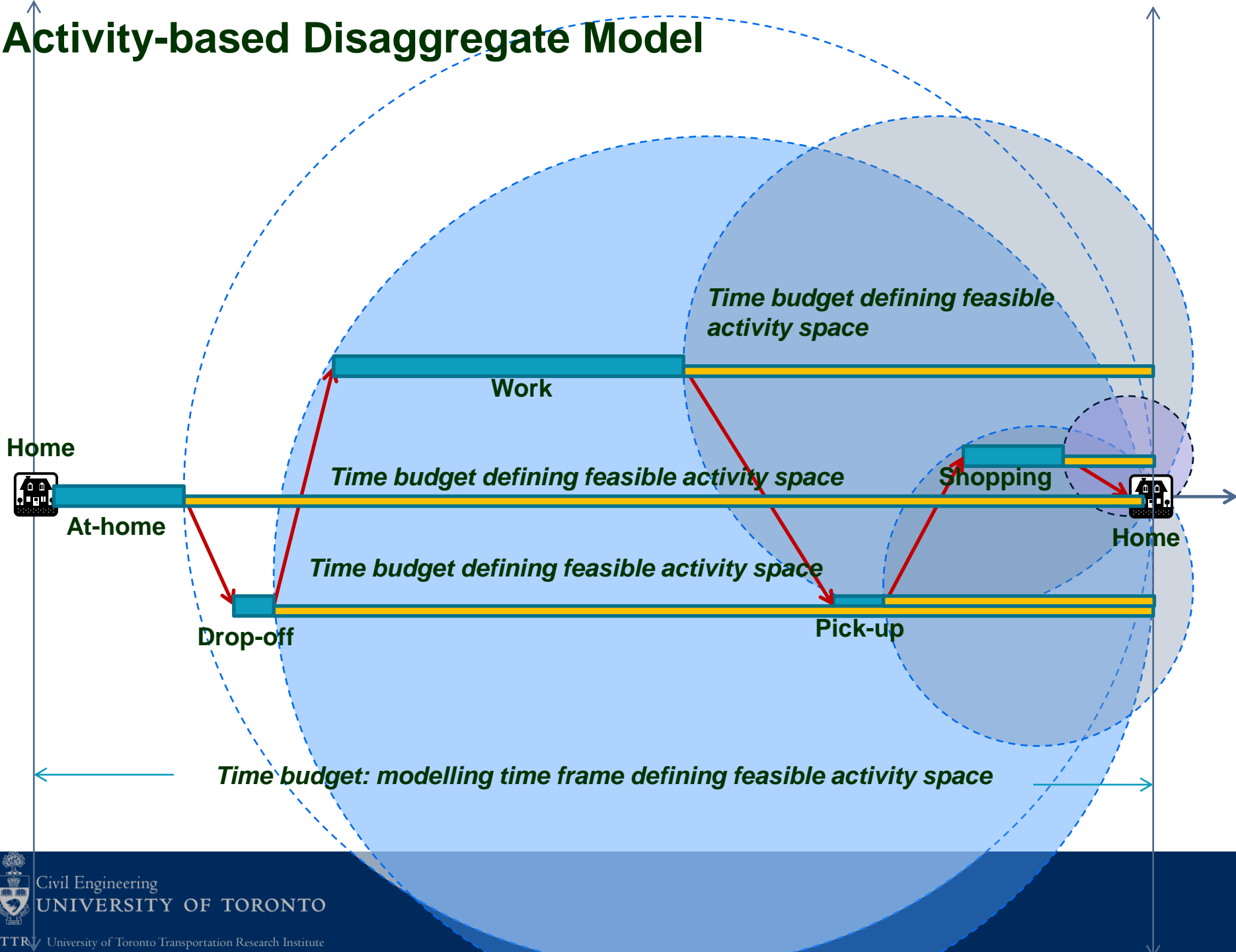




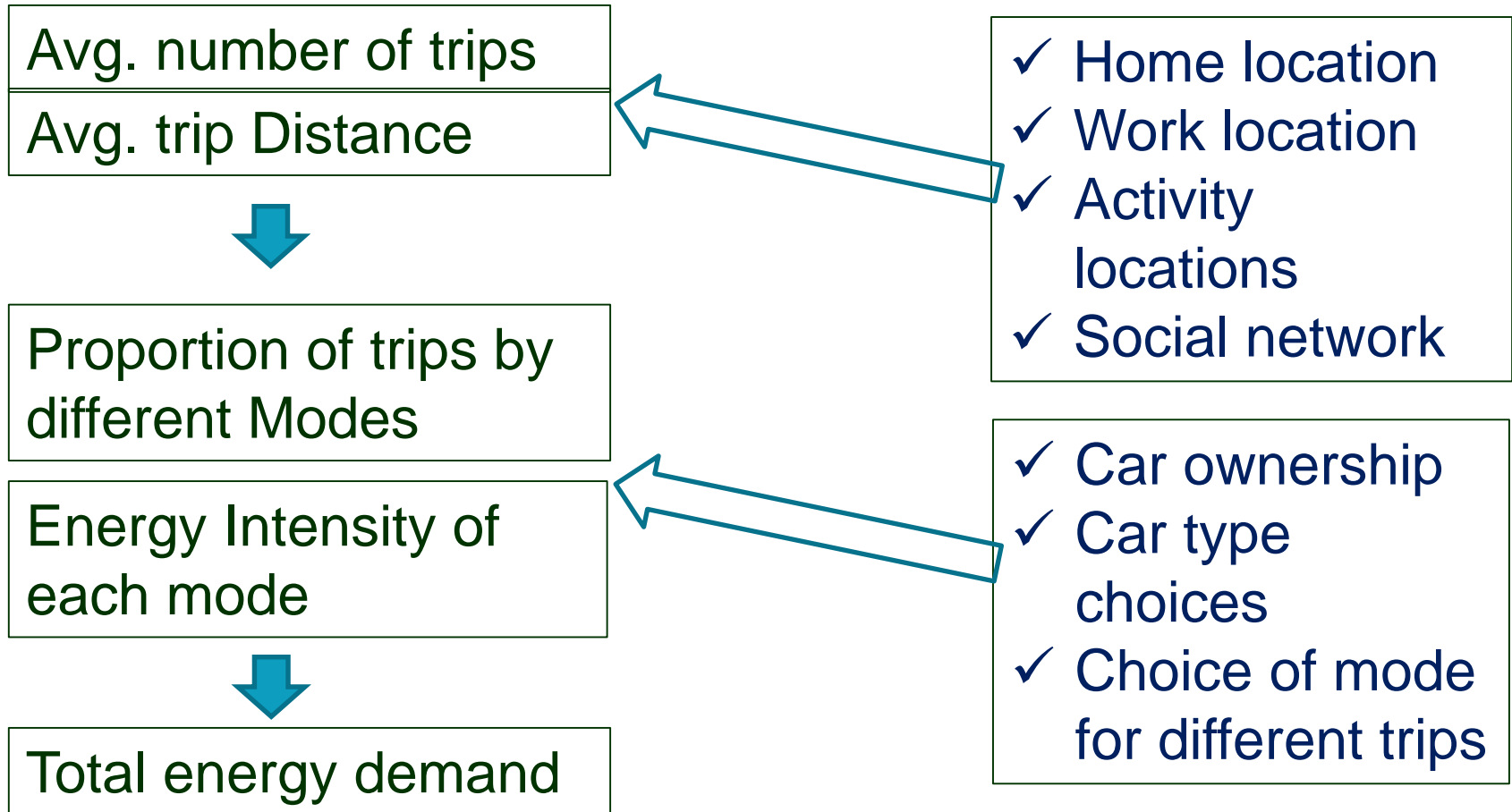
# Trip-based Aggregate Model



# Activity-based Disaggregate Model



# Transportation Energy Demand: Key Determinants



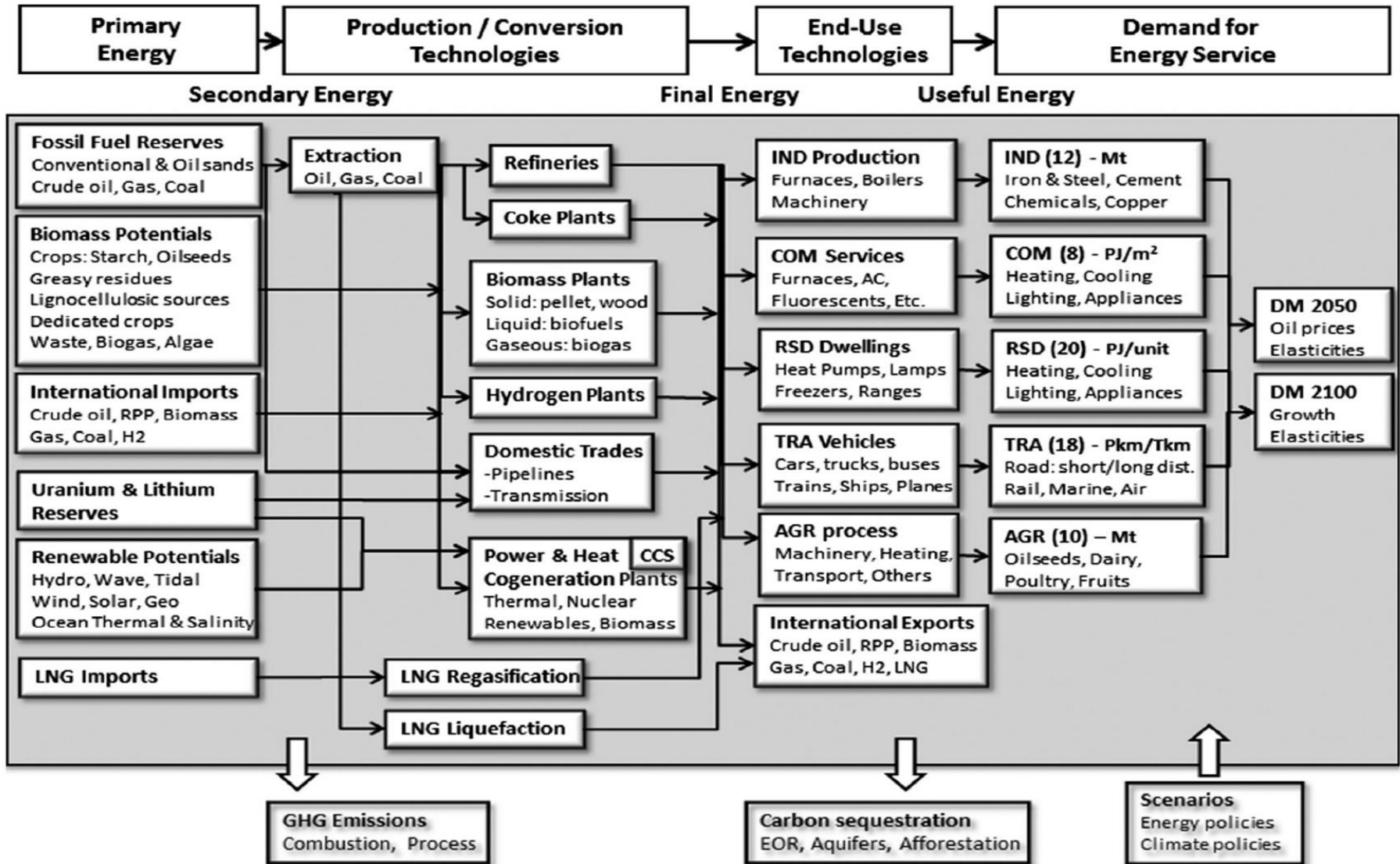
# Energy System Modelling for Energy Policy Analysis



- **Optimization Models**
  - Use linear programming (under constraints ) to identify energy systems that provide the least cost means of providing an exogenously specified demand for energy services.
  - Examples: MARKAL (TIMES), EFOM, etc.
- **Simulation Models**
  - Simulate behavior of energy consumers and producers under various exogenous signals (e.g. price, income levels, limits on rate of stock turnover).
  - Examples: ENPEP/BALANCE, Energy 20/20
- **Accounting Frameworks**
  - Rather than simulating decisions of energy consumers and producers, modeler explicitly accounts for outcomes of decisions *So instead of calculating market share based on prices and other variables, Accounting Frameworks simply examine the implications of a scenario that achieves a certain market share.*
  - Examples: LEAP, MEDEE, MESAP
- **Hybrids Models combining elements of each approach**
  - combine elements of optimization, simulation and accounting
  - LEAP operates at two levels: basic accounting relationships are built-in and users can add their own simulation models on top



# TIMES-Canada Model





# TIMES-Canada Model

End-use demand segments within five consumption sectors.

Sectors	Number of segments	Units	End-use demand segments
AGR	9	Million tons	Grains and Oilseeds, Dairy, Beef, Hog, Poultry, Eggs, Fruit, Vegetables, Others
COM	8	PJ	Space heating; Water heating; Space cooling; Lighting; Street lighting; Auxiliary equipments; Auxiliary motors; Others
IND	12	Millions tons	Iron and steel; Pulp and paper (Low quality, High quality); Cement; Non-ferrous metals (Aluminum, Copper, Others); Chemicals (Ammonia, Chlorine, Others); Other manufacturing industries; Other industries
RSD	20	PJ	Space heating (Detached houses; Attached houses; Apartments; Mobile homes); Space cooling (Detached houses; Attached houses; Apartments; Mobile homes); Water heating (Detached houses; Attached houses; Apartments; Mobile homes); Lighting; Refrigeration; Freezing; Dish washing; Cloth washing; Cloth drying; Cooking; Others
TRA	18	Millions passenger-km Millions ton-km	- Road/Passenger: Small cars (Short distance, Long distance); Large cars (Short distance, Long distance); Light trucks; Urban buses; Intercity buses; School buses; Motorcycles; Off road - Road/Freight: Light trucks; Medium trucks; Heavy trucks - Rail: Freight; Passenger - Air: Freight; Passenger - Marine



# Energy Demand Modelling for Transportation Planning



# Modelling Transportation Energy Demands = Modelling Transportation Demands

**Aggregate Modelling  
Approach: Top-down  
approach**

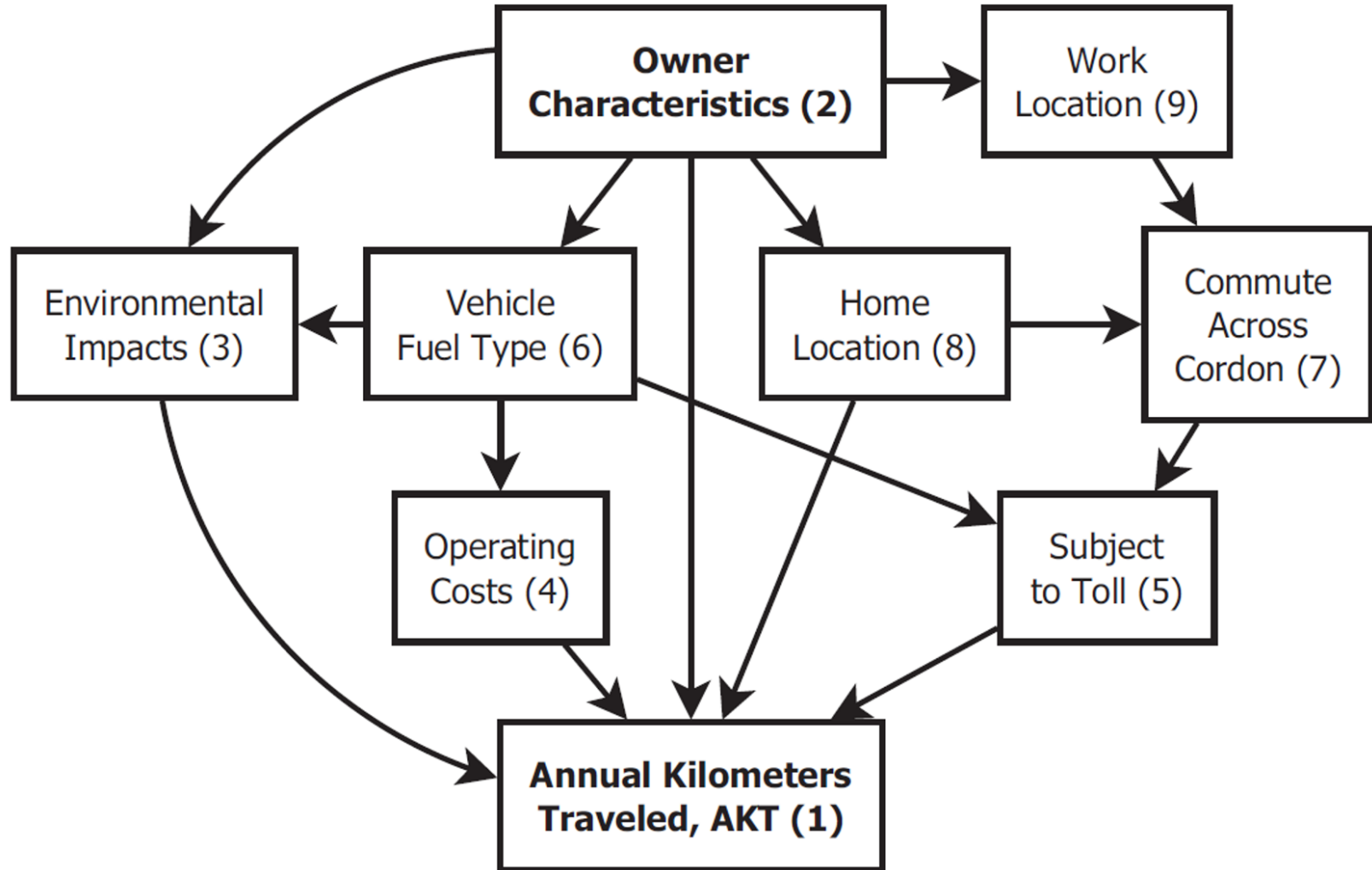
**Disaggregate  
Modelling Approach:  
Bottom-up approach**

*Historical aggregate  
data*

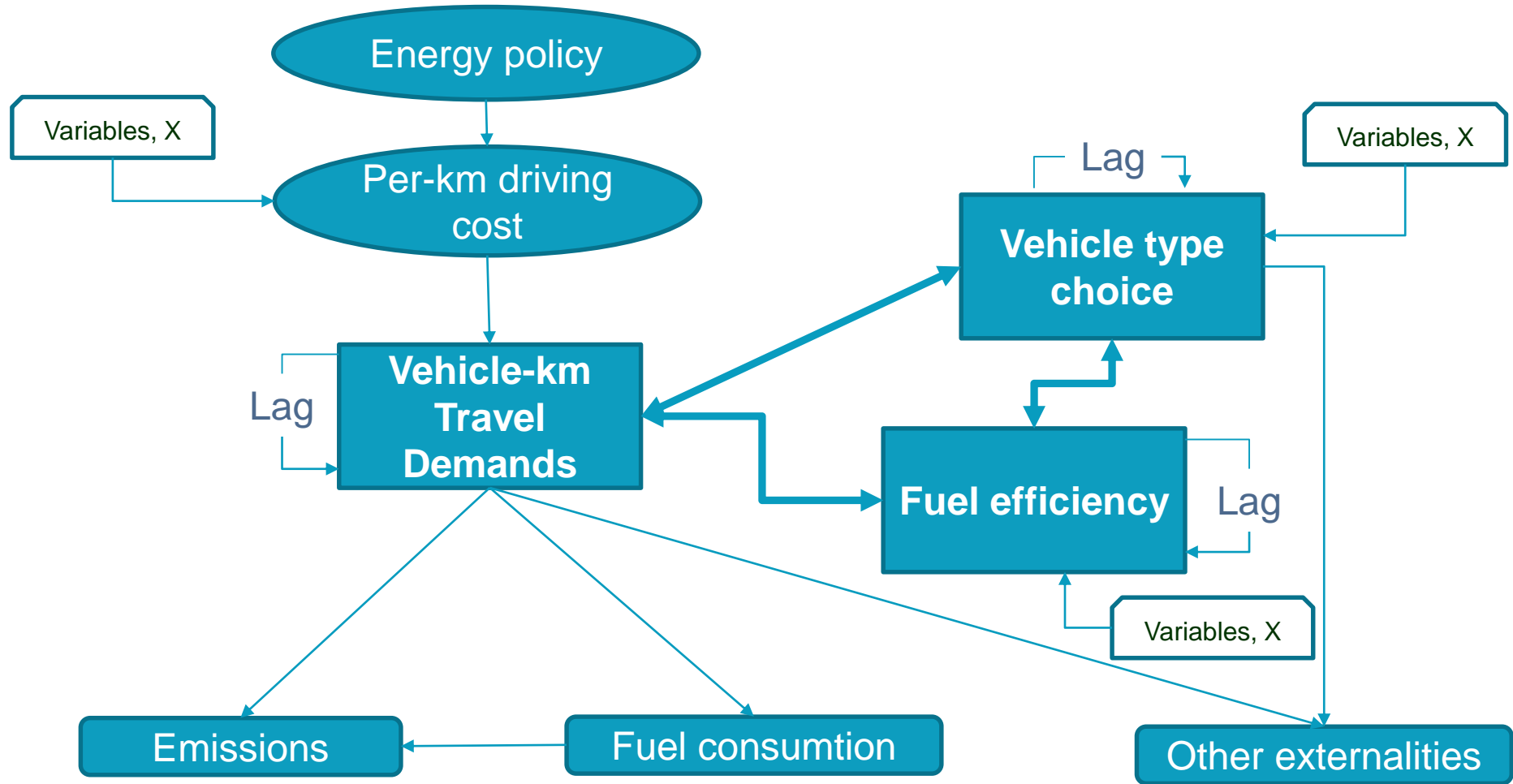
*Detailed sample data*



# Aggregate Model of Transportation Demands

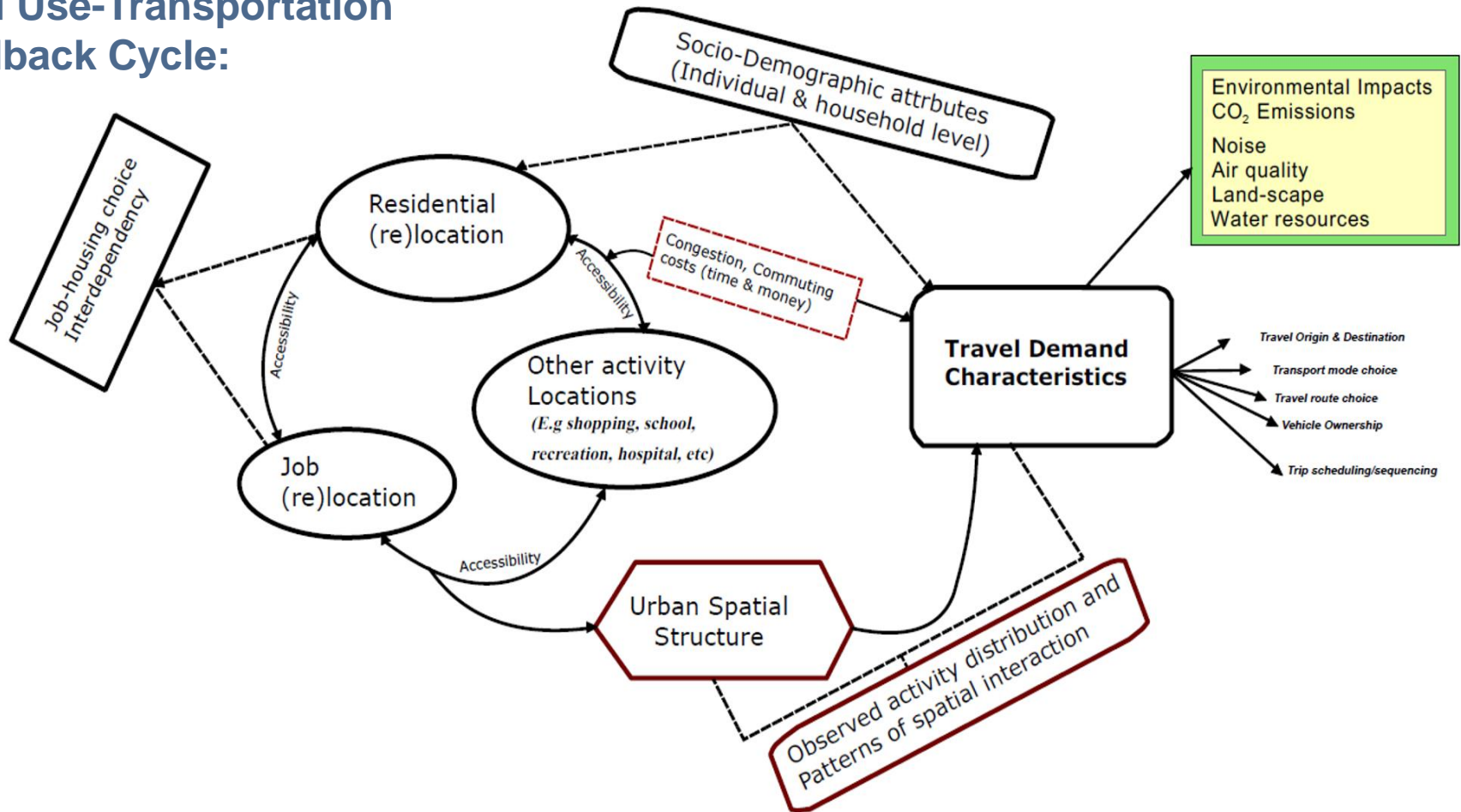


# Energy Policy & Transportation Demands: Aggregate Demand Modeling



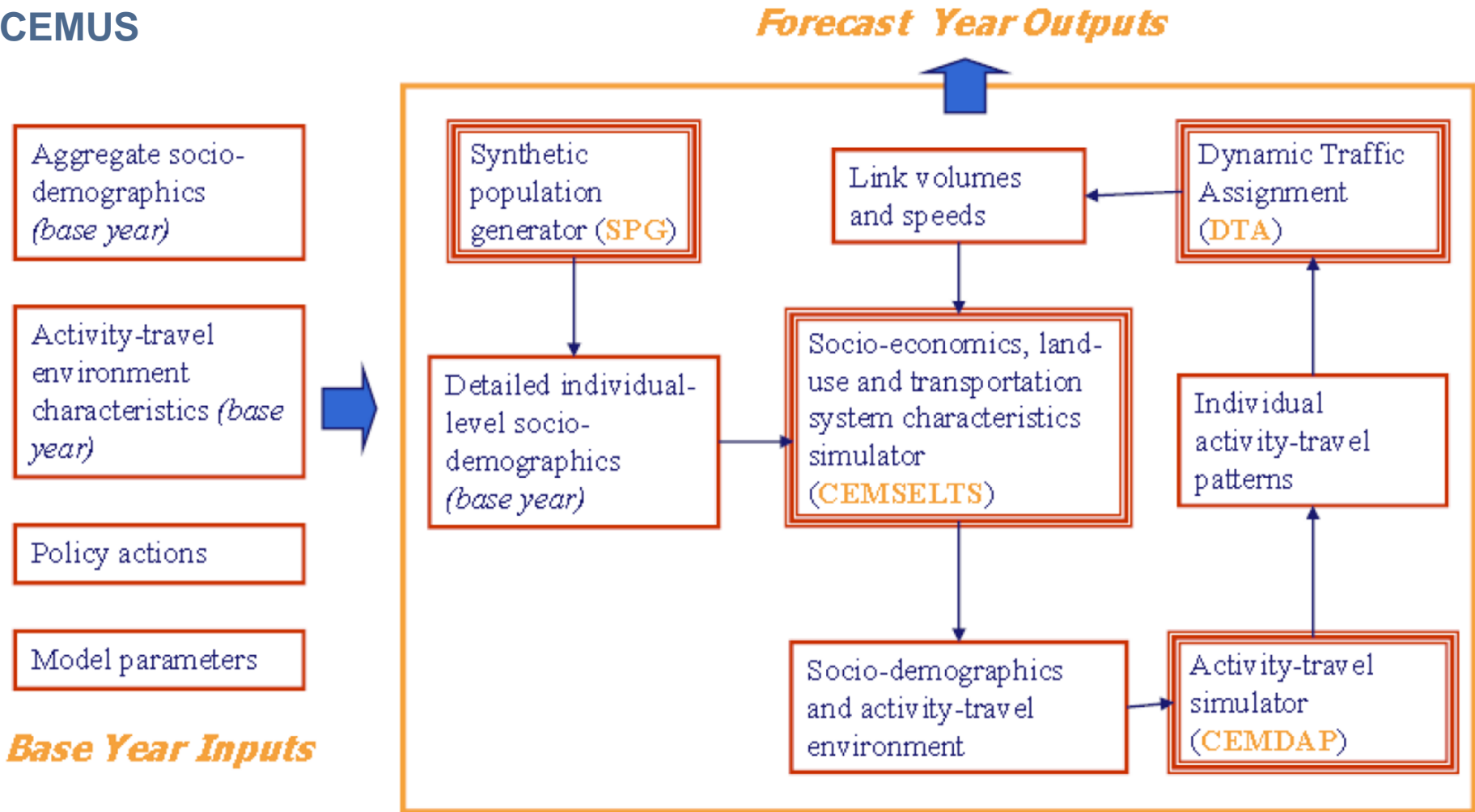
# Integrated Transportation Demands: Bottom-Up Approaches

## Land Use-Transportation Feedback Cycle:



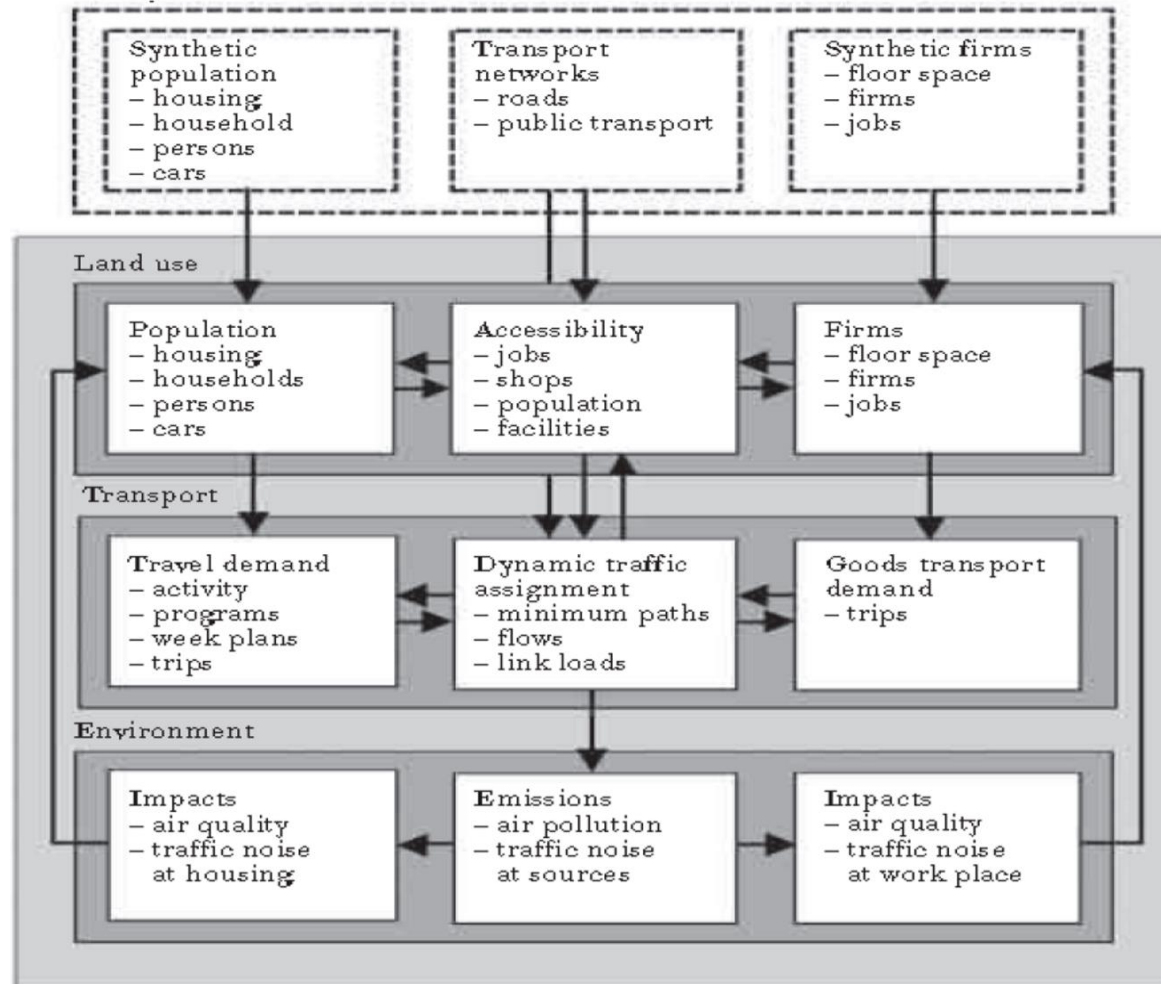
# Integrated Transportation Demands: Bottom-Up Approaches

CEMUS



# Integrated Transportation Demands: Bottom-Up Approaches

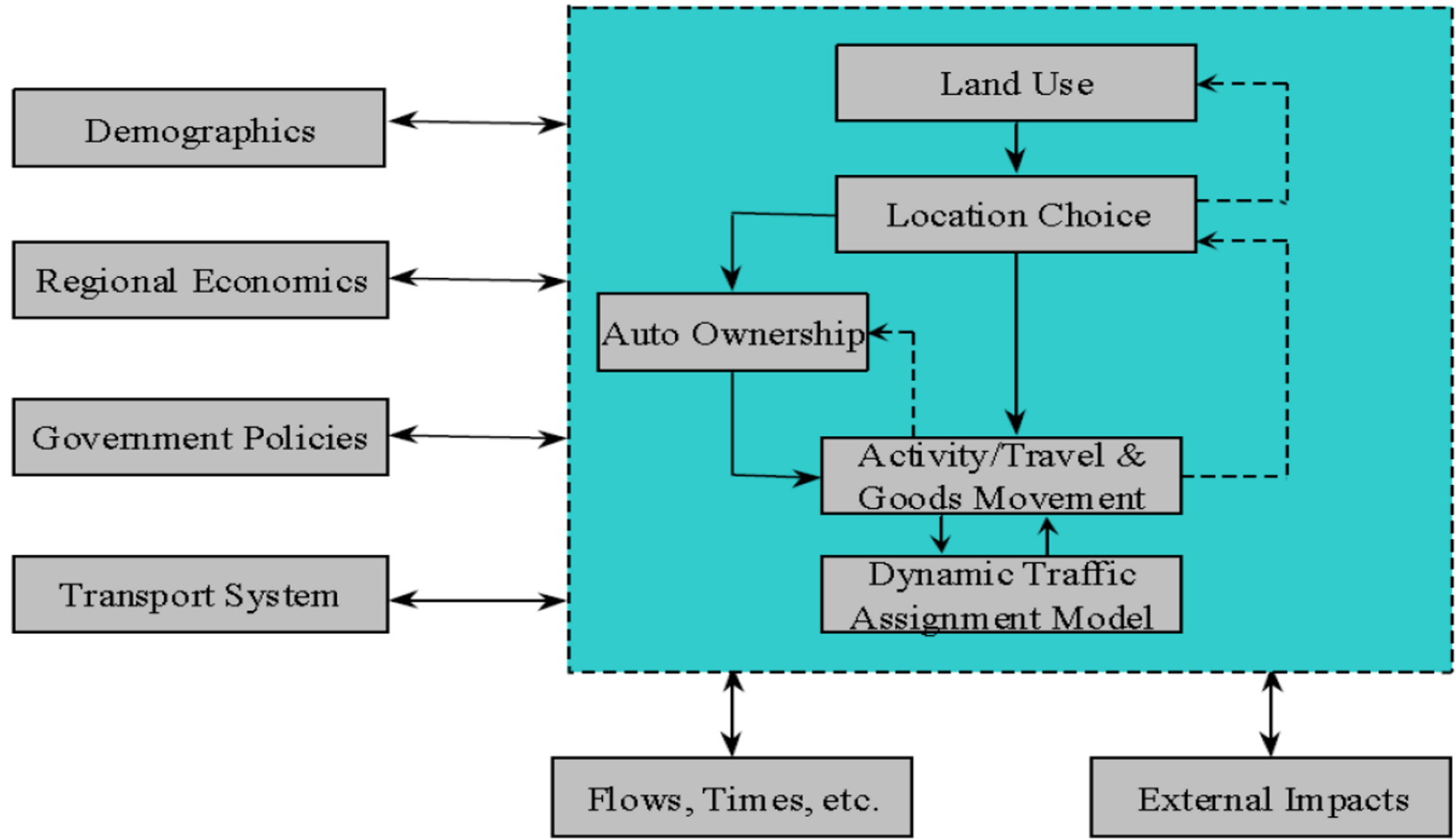
ILUMASS





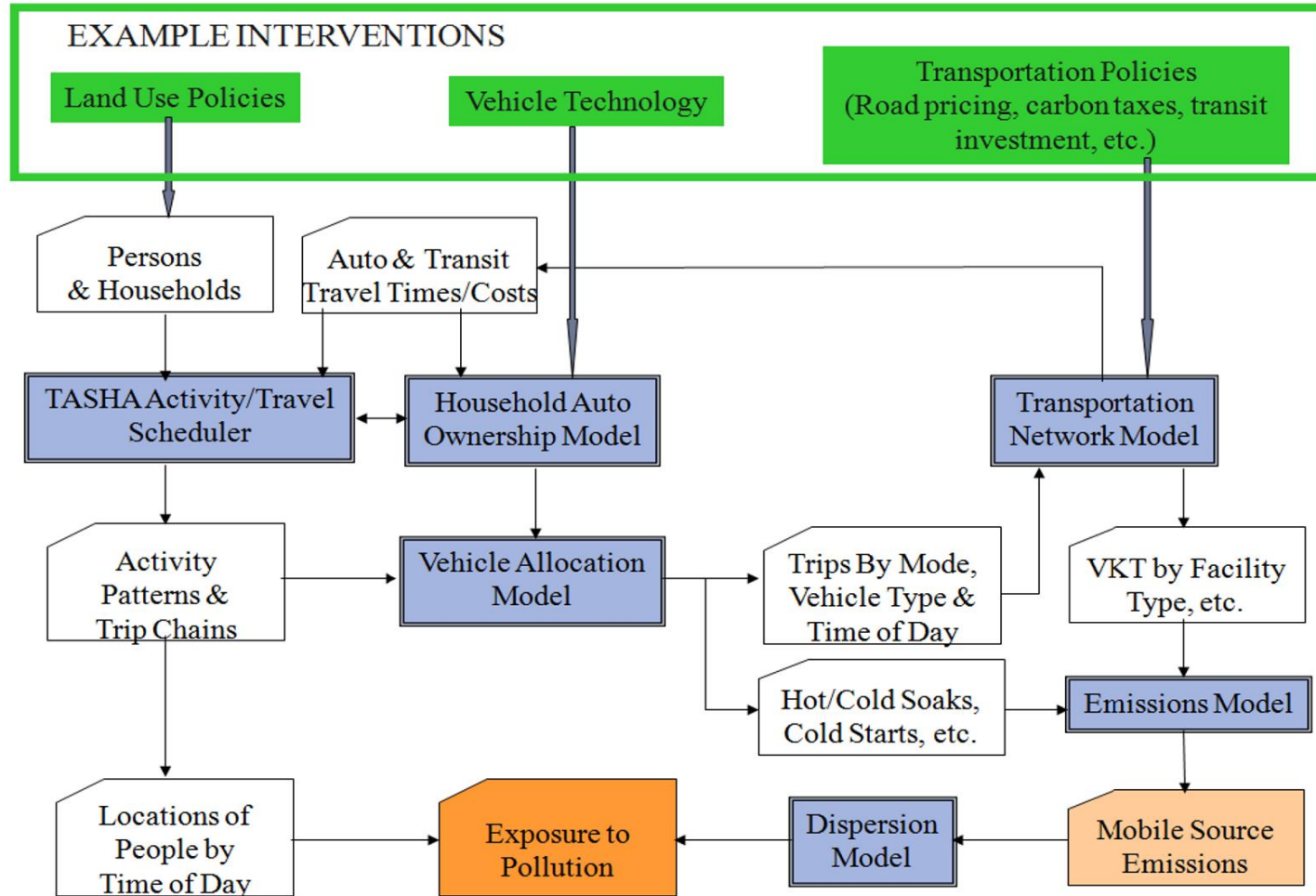
# Integrated Transportation Demands: Bottom-Up Approaches

ILUTE

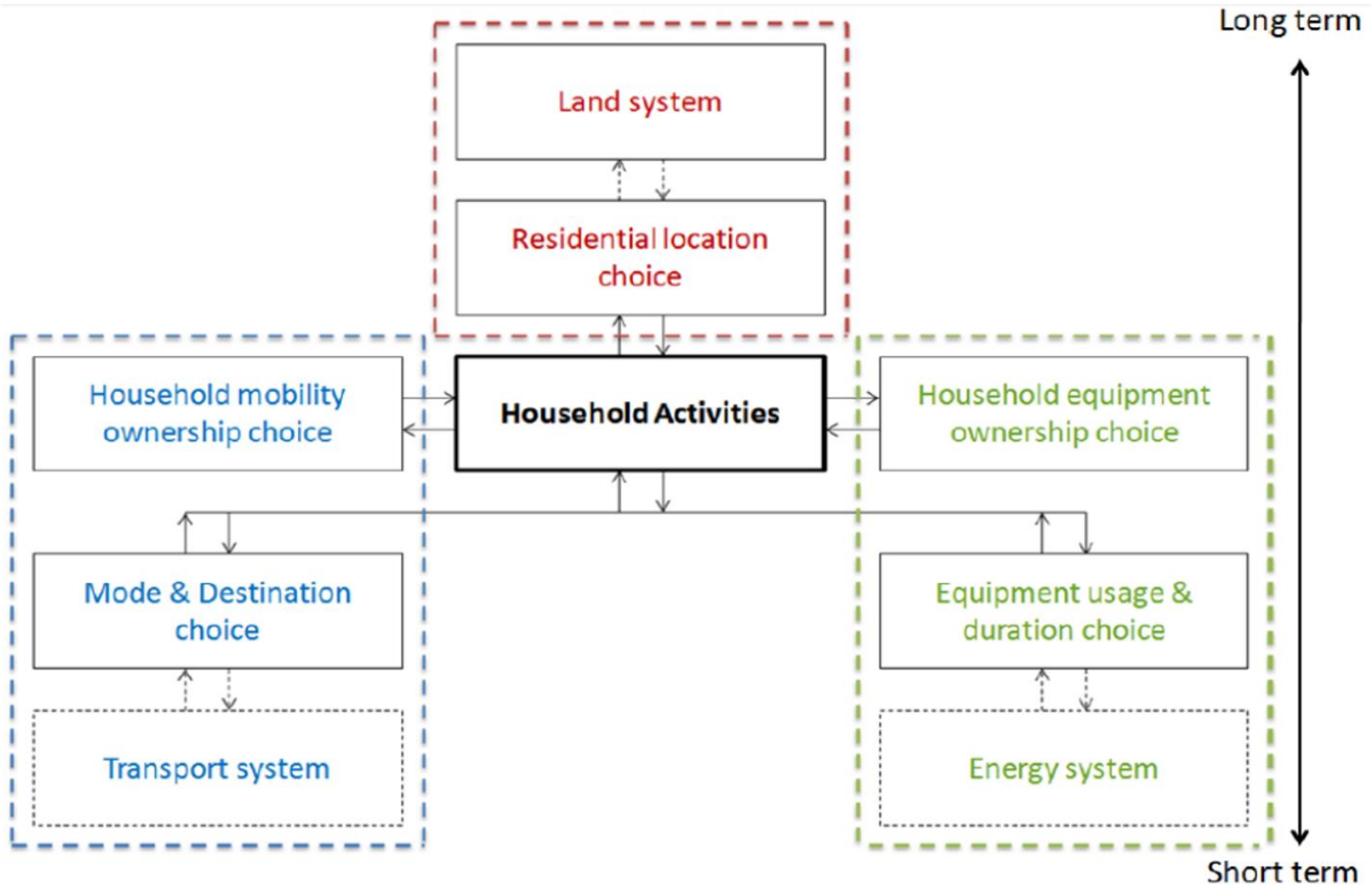


# Integrated Transportation Demands: Bottom-Up Approaches

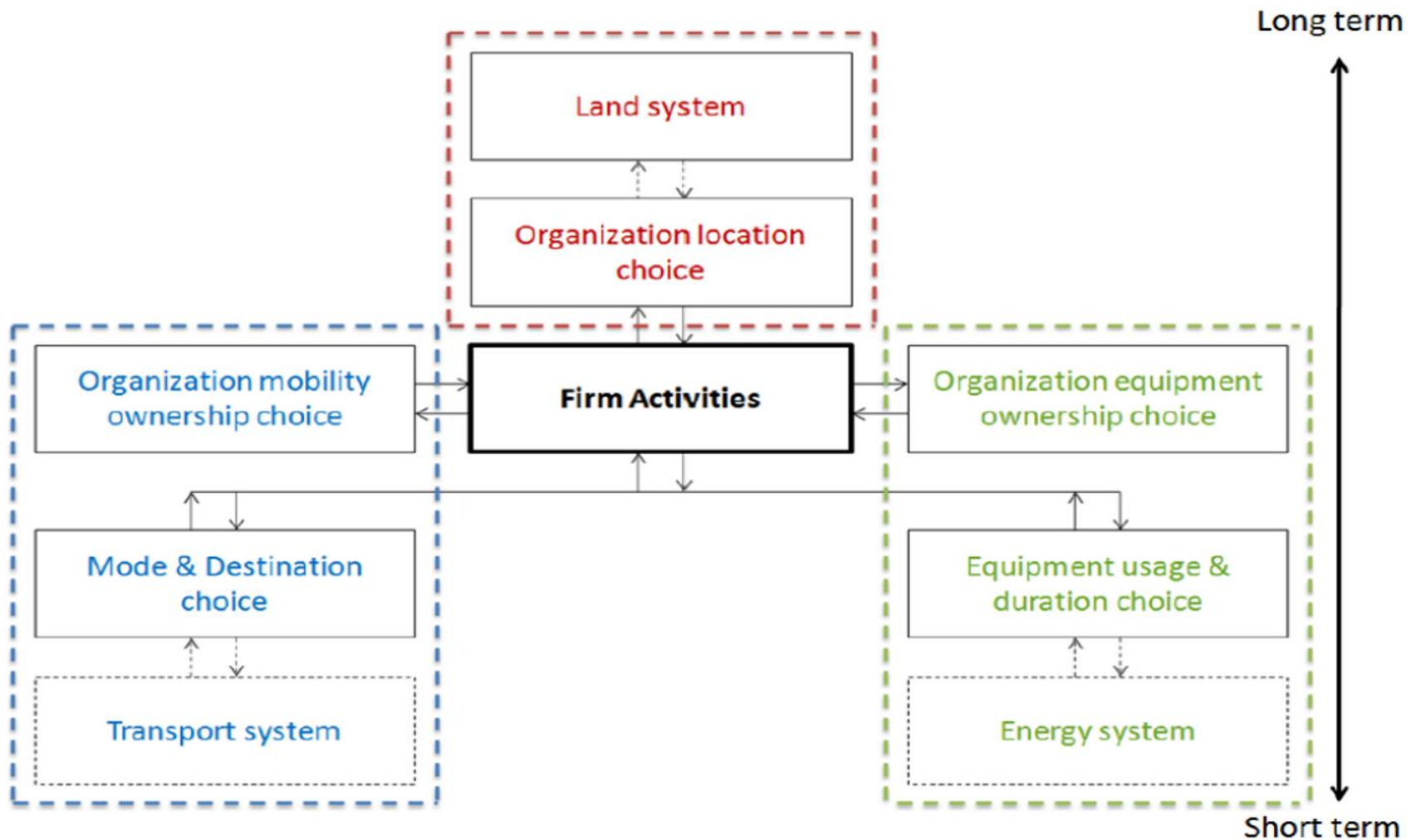
## ILUTE Application



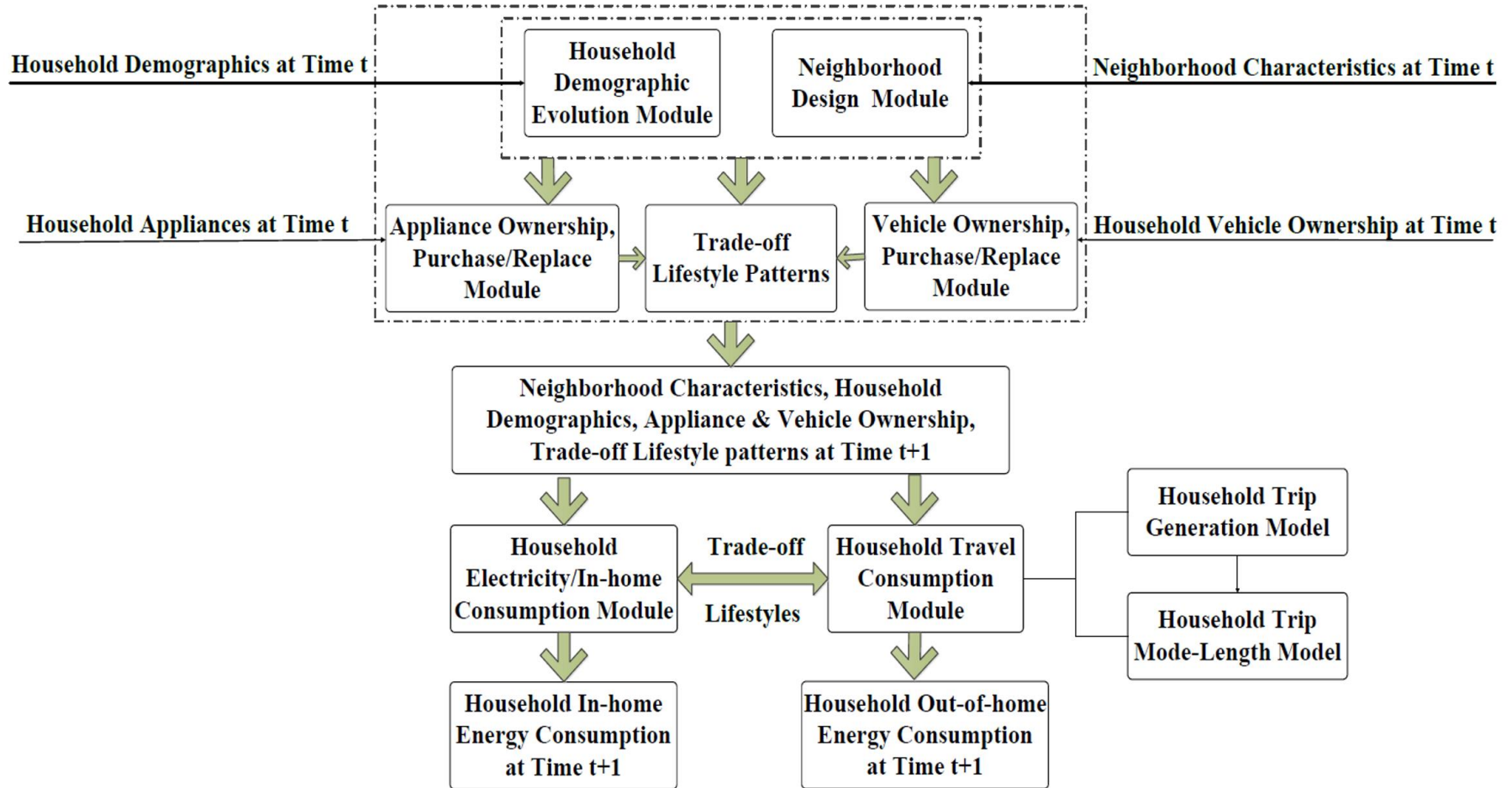
# Key Modelling Modules: Households



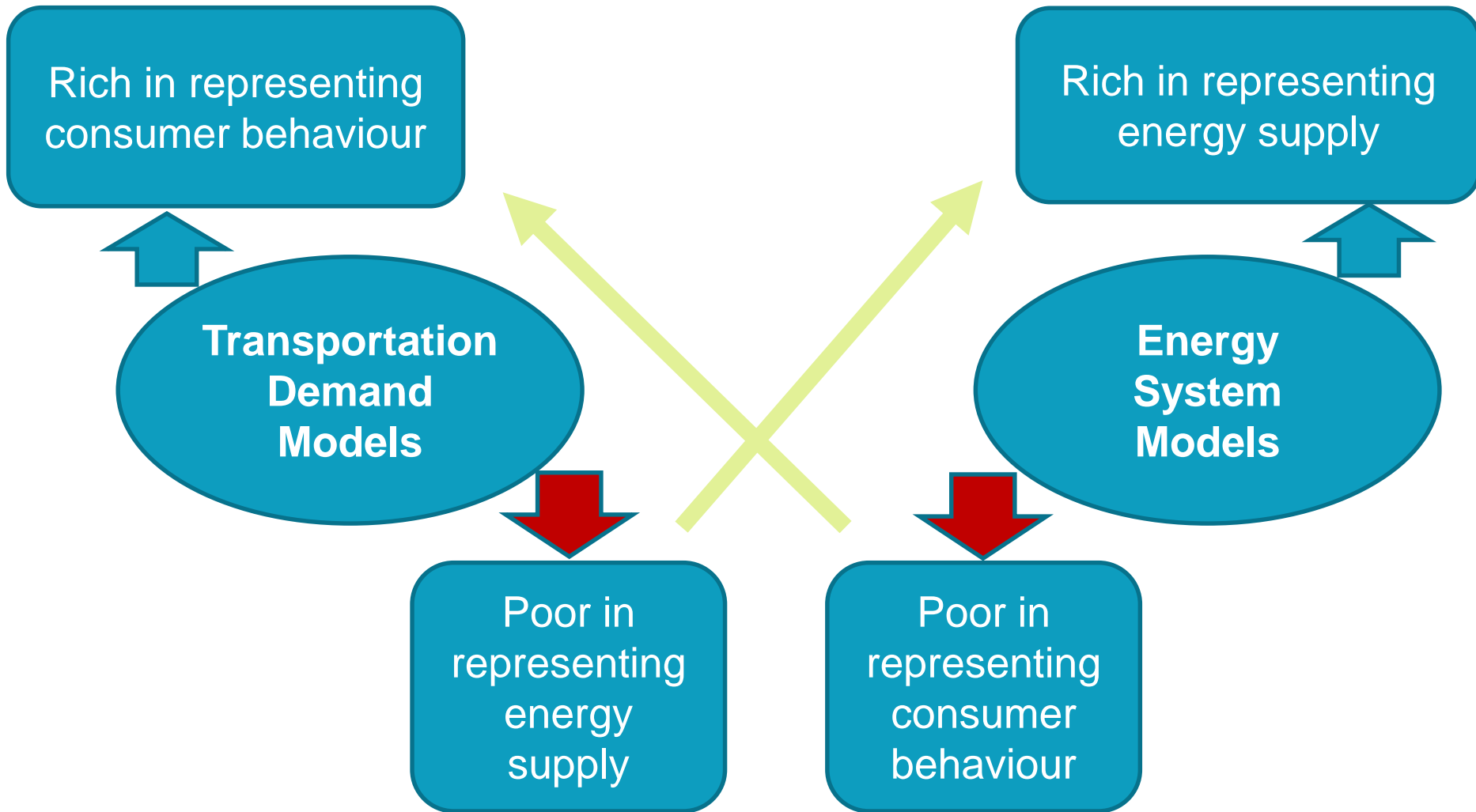
# Key Modelling Modules: Firm/Industry



# Household Energy Demand: Integrated Model for In-home and Transportation

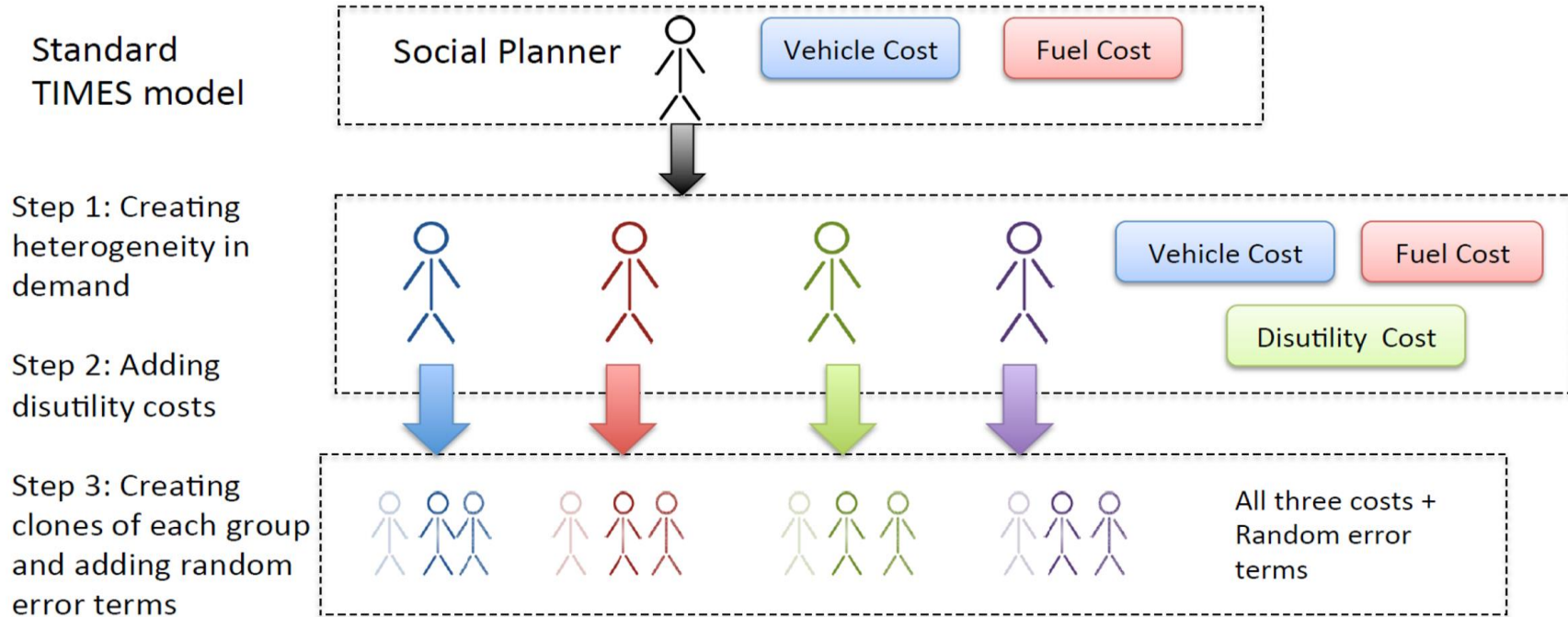


# Energy System Model -vs-Transport Energy Demand Model

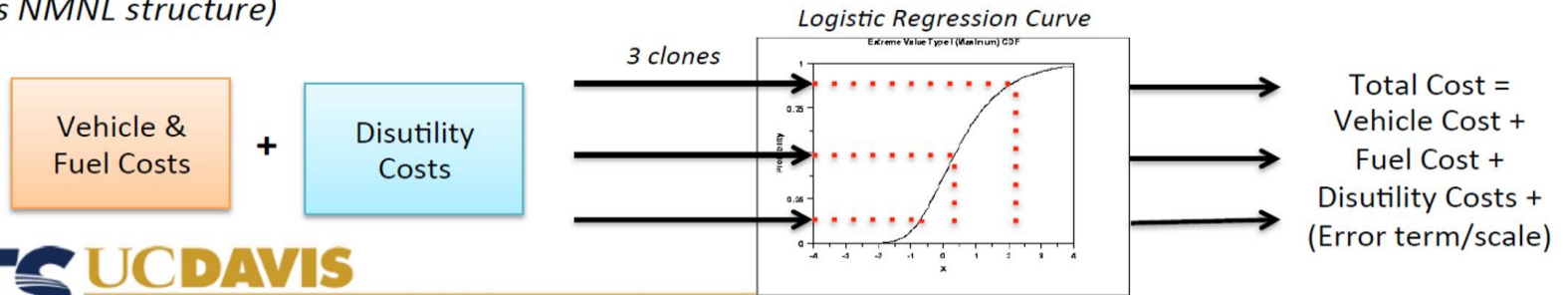




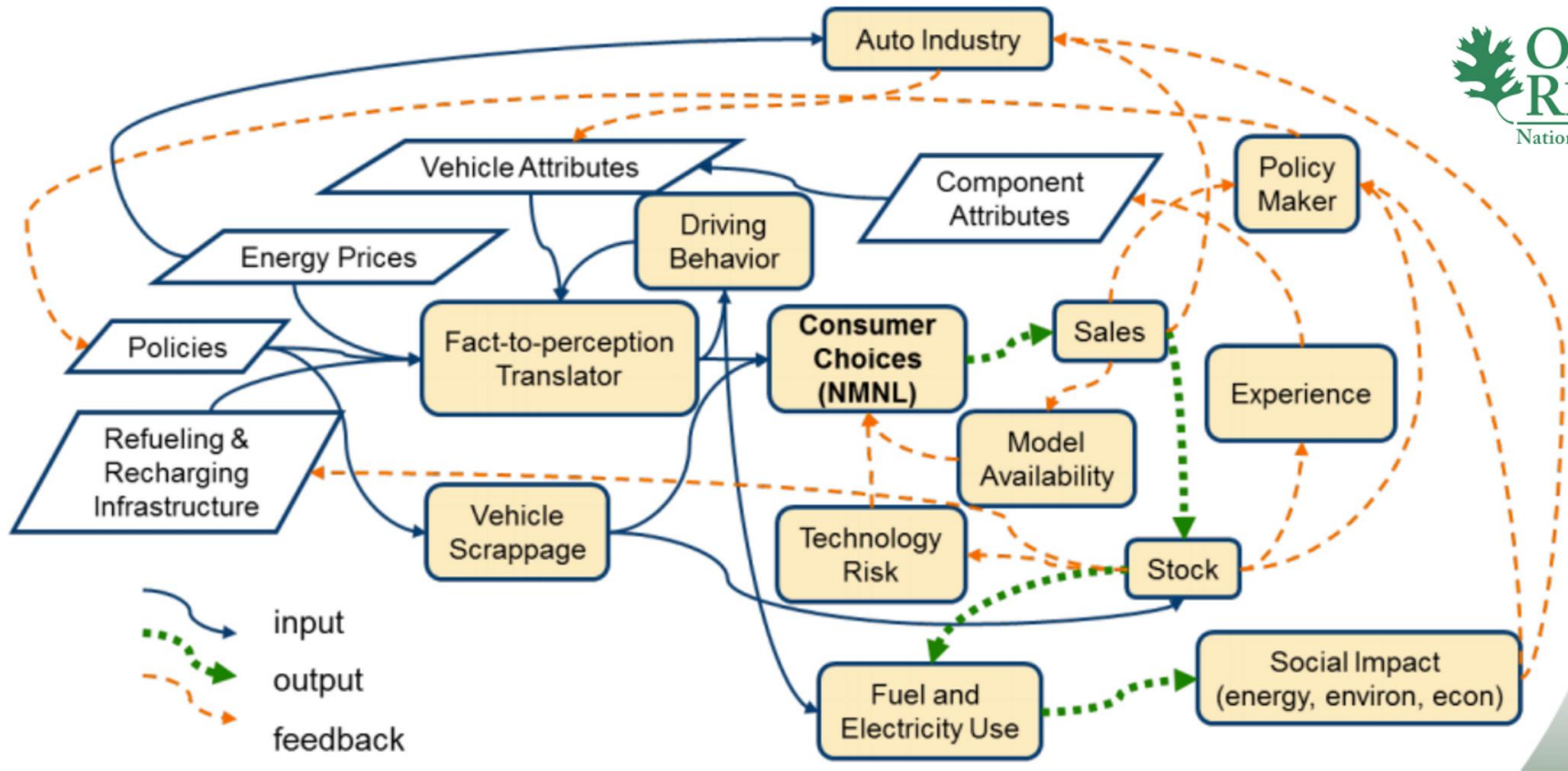
# Notable Effort: Consumer Choice IN TIMES (COCHIN-TIMES) at UC Davis



*Eg. Creating clones to include MNL structure for any consumer group (simpler than COCHIN, which has NMNL structure)*



# MA<sup>3</sup>T (Market Allocation of Advanced Automotive Tech) Consumer Choice Model in COCHIN-TIMES



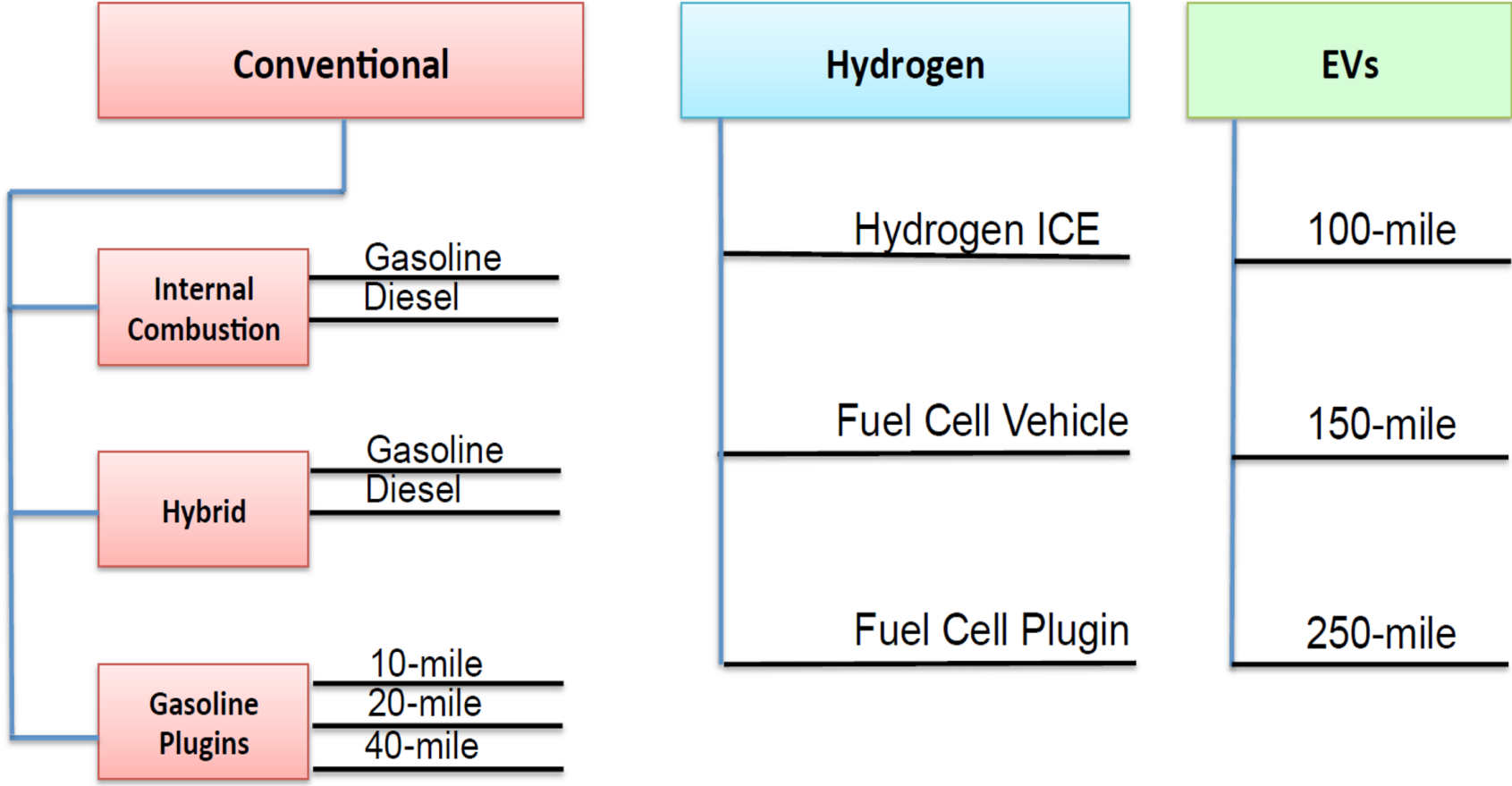


# Consumer Classifications in the MA<sup>3</sup>T (Market Allocation of Advanced Automotive Tech) Model

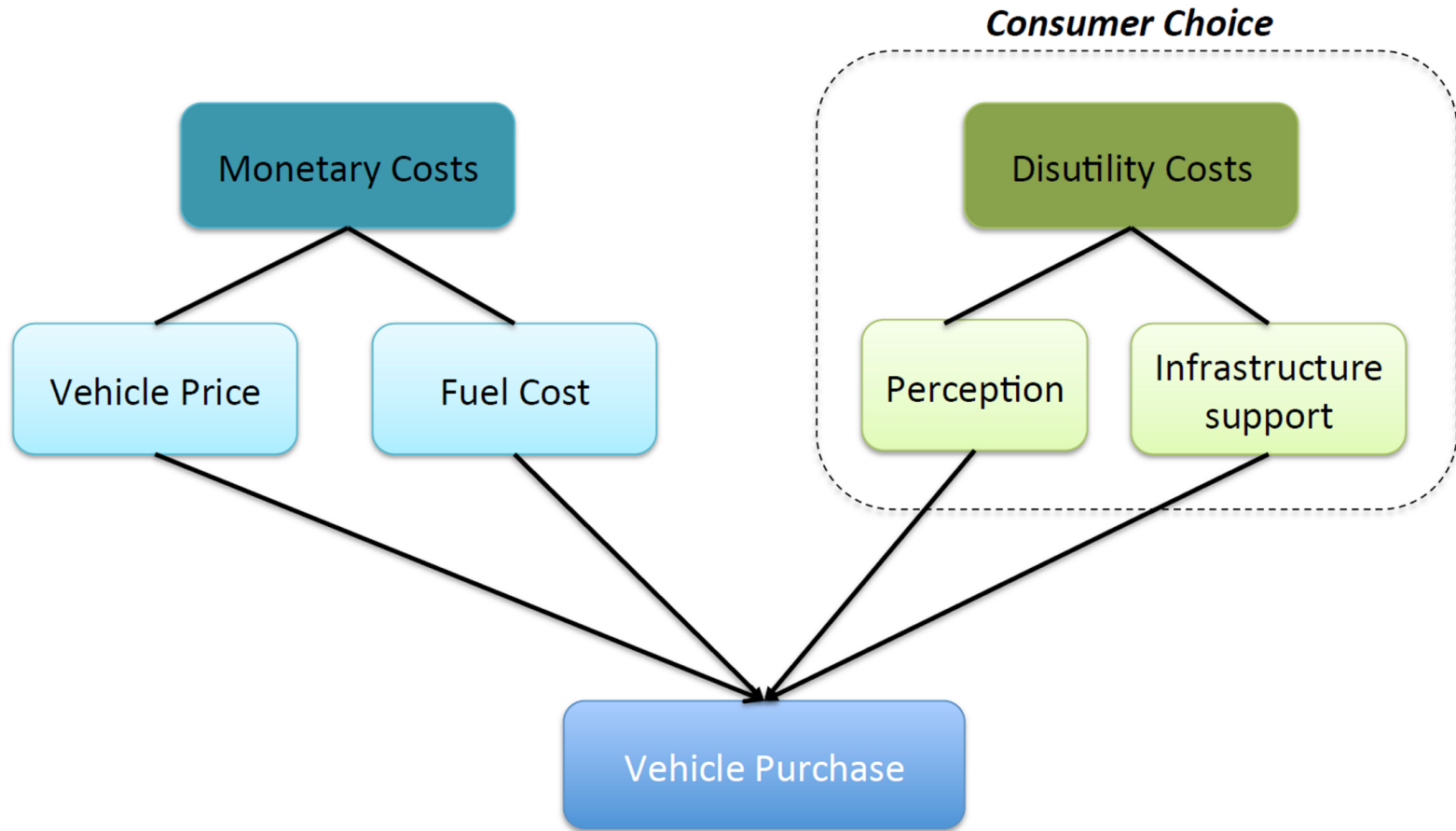
Settlement Type	Urban
	Suburban
	Rural
Risk Attitude	Early Adopter (8%)
	Early Majority (38%)
	Late Majority (54%)
Driving Behavior	Low Annual VMT (8656 miles)
	Medium Annual VMT (16068 miles)
	High Annual VMT (28288 miles)
Recharging Infrastructure	Home + Work
	Home + No Work
	No Home + Work
	No Home + No Work

*(+ public recharging infrastructure common to all)*

# Vehicle Classifications in the MA<sup>3</sup>T (Market Allocation of Advanced Automotive Tech) Model



# Vehicle Purchase Choice in the MA<sup>3</sup>T (Market Allocation of Advanced Automotive Tech) Model



# Disutility Costs in the MA<sup>3</sup>T (Market Allocation of Advanced Automotive Tech) Model

- Refueling Inconvenience Cost
  - Cost associated with the lack of access to refueling infrastructure (station availability)
  - Based on various spatial simulation and cluster analysis studies done on access time to find stations—multipliers are derived
- Range Anxiety Cost
  - Cost to capture the consumer’s perception of anxiety associated with the limited range of EVs and infrastructure availability.
  - Based on a daily VMT distribution, model checks whether it meets the range for the day. If not, a \$/day penalty is given, which differs across risk groups
- New Technology Risk Premium
  - The consumers’ willingness to pay to avoid risk (or gain novelty) approaches zero as cumulative sales of the vehicle technologies increases over time
- Model Availability Cost
  - Make and model diversity is represented in the vehicle choice model as the log of the ratio of the actual number of makes and models available, to the “full diversity” number (conventional vehicles)

# MA<sup>3</sup>T Simulates 1458 US consumer segments

## Choosing from 40 Light Duty Vehicle Types

- U.S. LDV market divided into 1458 seg., 2005-50
- Buy or no buy decision is now endogenous
- 20 powertrain technologies, cars and light trucks, to be expanded into small cars, midsize cars, large cars, SUVs and pickup
- Vehicle attributes: retail price, fuel economies, acceleration, refueling hassle, range limitation cost, etc
- Infrastructure: hydrogen, natural gas, electricity, diesel; home, work, public charging
- Policies: fuel/carbon tax, feebate, parking or HOV incentives, tax credit or rebate

10 Managed by UT-Battelle  
for the Department of Energy

The MA<sup>3</sup>T model:  
Market Acceptance of Advanced Automotive Technologies  
Dr. David Greene, Dr. Zhenhong Lin



# Looking Forward

- TIME type models are for regional policy analysis
  - ✓ COCHIN-TIME approach tries to induce consumer behaviour within such regional model
  - ✓ However, such model may not reflect on end-users' daily demand dynamics
- Targeted econometric models can allow further investigation of impact of any energy policies on end-users:
  - ✓ Car ownership choice model: Discrete choice model of car type and number of car choices
  - ✓ Choice model of consumer's reaction to energy policies



# Questions ?

