# Activity-Based Model (ABM) Development

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## The ABM naming contest

Join at slido.com #1051764















# Our journey in ABM Development

- Needs Assessment
- Alternative Evaluations
- Model Development
  - Phase 0 Development: Test version with real data
  - Phase 1 Development: Lite model estimation and calibration
  - Phase 2 Development: Fully calibrated and re estimated













### Needs Assessment

- New or complex behaviors
  - Work arrangement (telecommuting & work from home)
  - Gig workers (ride hailing, ecommerce delivery, etc)
  - Emerging modes (CAVs, e-bikes, e-scooters)
  - Intra-household behaviors (HOVs, school escorting, joint trips)
- Equity and affordability impacts on ESGs
  - Gender-based analysis plus (GBA+)
  - Distribution of effects on sub population groups
  - Off-peak travel behaviors on a diverse set of trip purposes
- Complex pricing policies
  - Temporal effects due to peak spreading
  - Caps, rebates, exemptions and discounts (CRED)













### **Alternative Evaluations**

- Trip based models
- Hybrid models
  - HBD1 Synthetic population with disaggregate long-term decisions and aggregate short-term decisions
  - HBD2 HBD1 + disaggregate postprocessing
- Activity-based models













### **Alternative Evaluations**

- Trip-based model performs poorly with increasing segmentations
- Trip-based model is becoming hard to maintain and enhance
- ABM can produce conventional metrics and answer complex questions
- ABM is less abstract and more interpretable
- Development cost for hybrid model is less predictable (less industry experiences)
- ABM is becoming industry standard
- ActivitySim was most suitable ABM platform for our development

Objectives	Sub-objectives	Trip Base	HBD1	HBD2	ABM
Capability to answer important questions	Objective Summary	-	✓	√√	<b>V</b>
	Conventional metrics	-	✓	✓	√√
	Equity and Affordability	-	-	<b>√</b> √	<b>///</b>
	Temporal responsiveness	-	✓	✓	<b>√</b> √
	Tour and resource constraints	-	✓	<b>√</b> √	<b>///</b>
	New Mobility	-	✓	<b>√</b> √	<b>///</b>
	New Behaviors (e.g. telecommuting)	-	<b>√</b> √	√√	<b>///</b>
Resource requirements	Objective Summary <sup>2</sup>	-	æ	**(*)	xx
	Data needs	-	-	-	*
	Development and maintenance cost	-	×	**(*)	××
	Development time	-	*	**(*)	××
	Model run times	-	-	-	*(*)
Risks	Objective Summary	-	-	*	3c 3c
	Global experience with these models	-	×	xxx	*
	Communication with stakeholders	-	-	*	*
	Availability of local resources	-	×	××	xxx
	Conformity with funding requirements	-	-	<b>//</b>	<b>///</b>





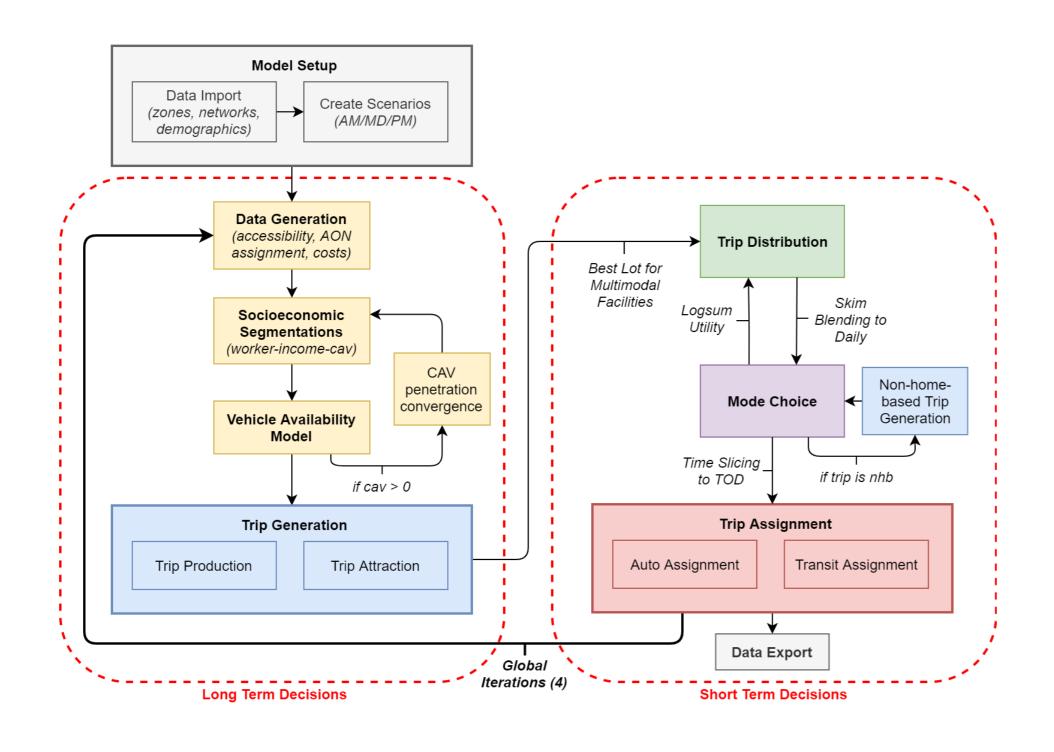


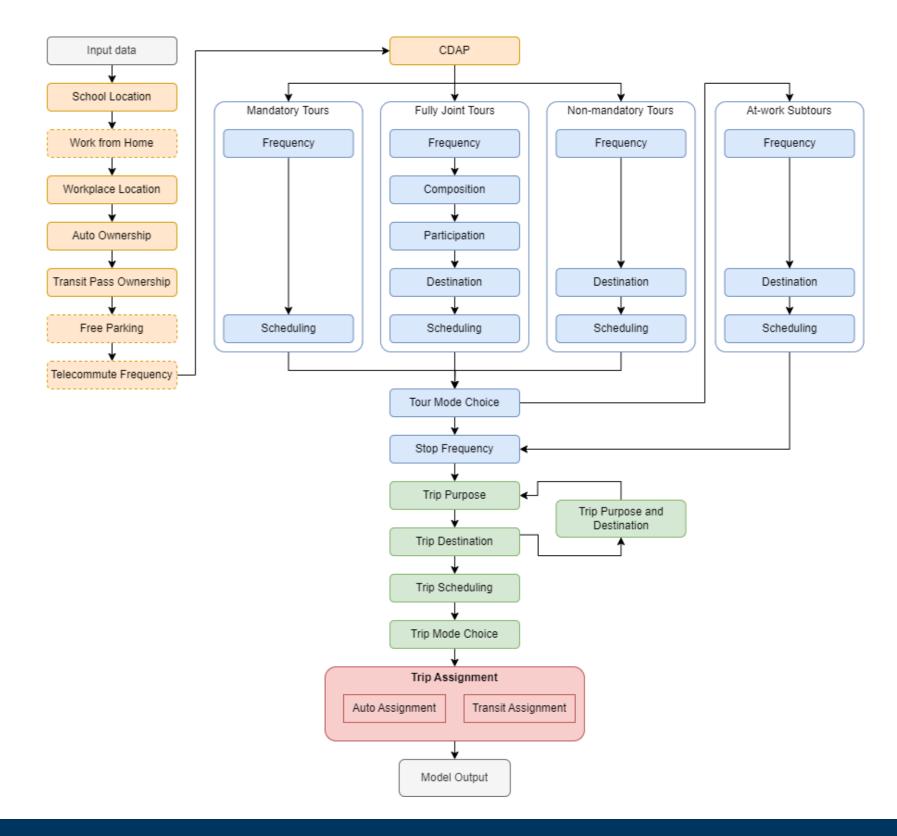






### The RTM vs The ABM













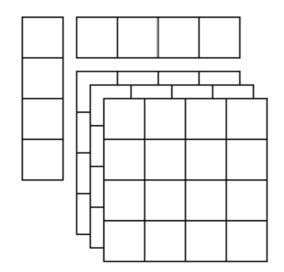




# Different data structure for modeling

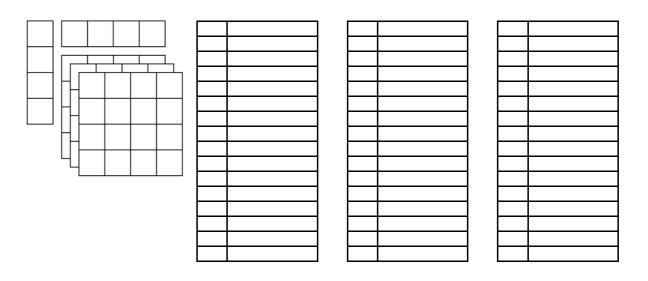
#### **RTM**

- All trip demand data are zones based
  - Origin (mo)
  - Destination (md)
  - Origin to Destination (mf)
- Aggregate choices for trips only



#### **ABM**

- All demand are row based
  - Household (household id, income, vehicles, etc)
  - Person (person id, age, gender, etc...)
  - Tours (tour id, start, end, tour mode, etc)
  - Trips (trip id, depart, mode, etc...)
- Disaggregate choices at different levels















### Phase 0: Test version with real data

- Input data preparations
  - Synthetic households
  - Network skims
  - Land use
- Basic model set up
  - Sequencing of sub models
  - Recoding mode choice models
  - Code testing procedures
  - Basic integration with assignment













### Phase 1: Lite model estimation and calibration

#### Model estimation

- Data processing of the 2017 Trip Diary into training data - tour formation, non-modeled behaviors, variable recoding.
- Building model configurations
- Debugging model issues due to inconsistency between observed and modeled behaviors

#### Model calibration & validation

- Preparations of targets for sub models calibration and for model validation
- Creating scripts to systematically calibrate sub models individually.

#### Sensitivity testing

- Designing scenarios to test model responsiveness
- Review and revise model parameters
- Understand lessons learned and address data gaps for future development plans

	Estimation	Calibration
School Location	<b>✓</b>	<b>✓</b>
Workplace Location	<b>✓</b>	<b>✓</b>
WFH & TF	$\bigcirc$	<b>✓</b>
Auto Ownership	✓	<b>✓</b>
Transit Pass Ownership	✓	<b>✓</b>
CDAP	✓	<b>✓</b>
Tour Frequency	$\bigcirc$	
Tour Destination	$\Diamond$	
Tour Scheduling	<b>✓</b>	<b>✓</b>
Tour Mode Choice	<b>✓</b>	
Stop Frequency	$\Diamond$	
Trip Purpose	$\bigcirc$	
Trip Destination	$\Diamond$	
Trip Scheduling	$\bigcirc$	
Trip Mode Choice		

#### Legend

Completed In Progress **Not Started** Deferred

















### Looking forward to Phase 2

 Estimation of models with post pandemic behaviors using the 2023 Trip Diary data

Calibration of all sub models

Scenario testing with example studies & past events

More testing, testing, testing...









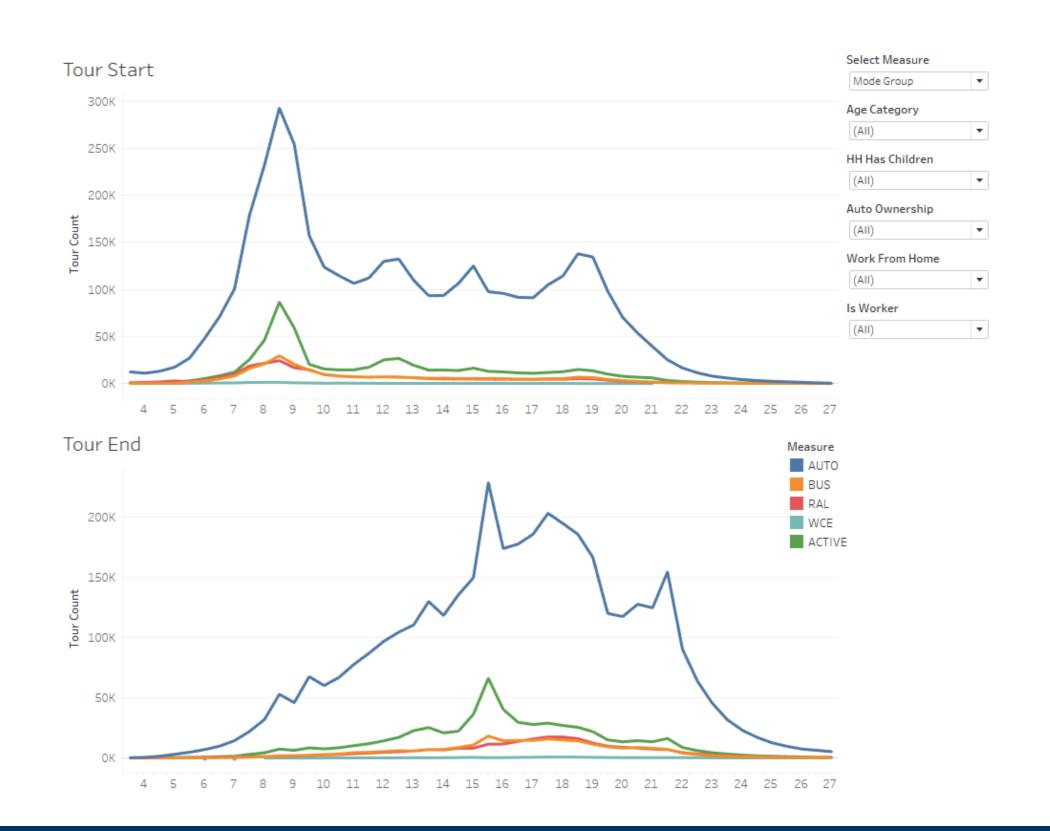




#### Potential use cases

# Peak spreading

- Time of day dynamics for tours and trips
- Congestion impacts during different time periods
- Different behavioral responses by different demographics (income, age etc...)











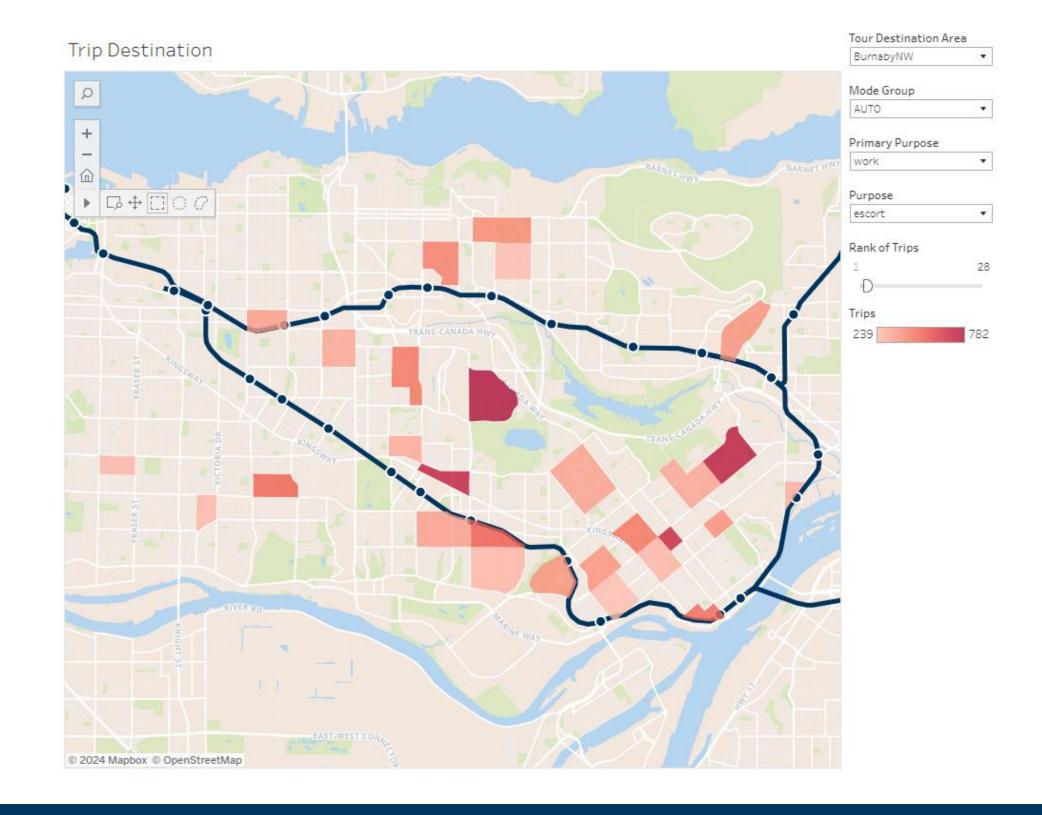




#### Potential use cases

# Intra-household escorting & carpooling

- Explicit representation of escorting and carpooling behavior
- Specific destination choices for drop off points or intermediate stops
- VKT and emissions reductions tied to changes in personal travel behaviors









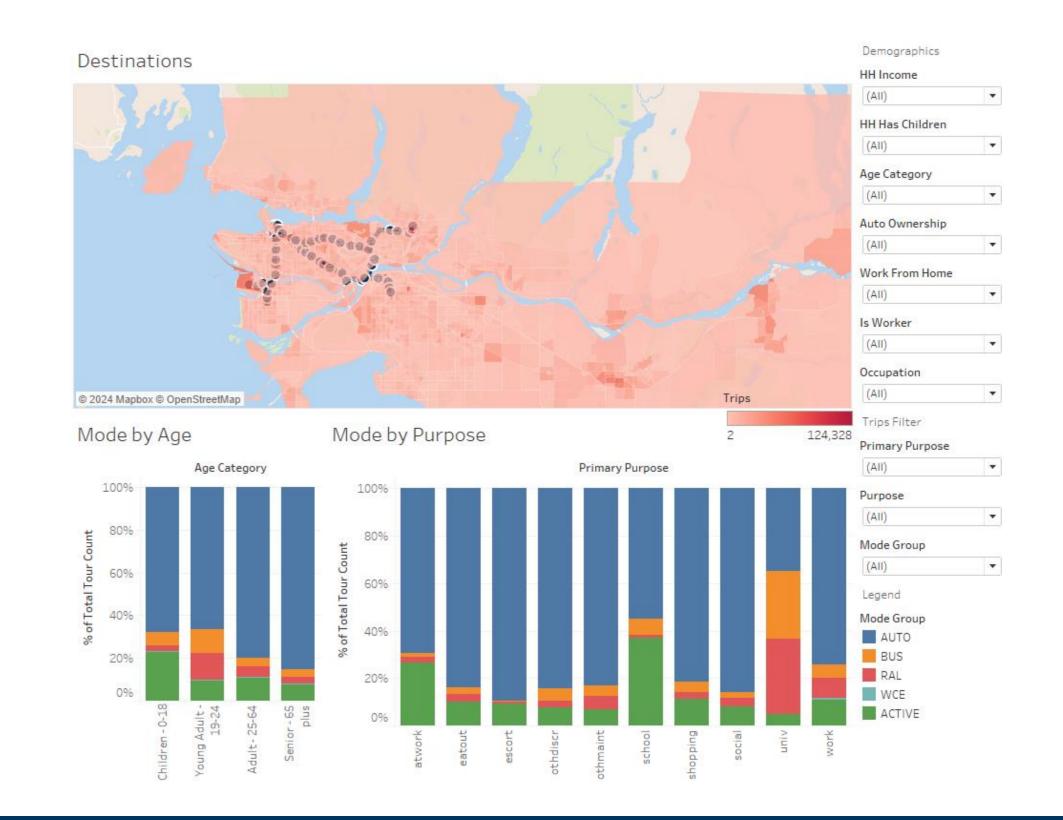




#### Potential use cases

## Individual / Household Analysis

- Impact of complex TDM policies on affordability and accessibility of transportation options
- Equity analysis with intersectionality of different demographic attributes
  - Low Income, Senior, Child,
     worker status, gender, etc...













## Learning resources

- TF Resources on Activity-based Models (TRB AEP50)
  - https://tfresource.org/topics/Activity\_based\_models.html
- Activity-Based Travel Demand Models: A Primer (SHRP2)
  - https://nap.nationalacademies.org/catalog/22357/activity-based-travel-demand-models-a-primer
- ActivitySim Documentation
  - https://activitysim.github.io/activitysim/v1.2.0/











