# SCAG ABM <br> Activity Generation and Allocation 

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SCAG Modeling Task Force

Modeling and Forecasting
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## Outline

$>$ Update on Long-term Choice and Mobility Models
>Framework of Activity Generation Module >Mandatory Activity Generation

## Background

o The activity-based approach views travel as a derived demand to pursue activities.
o Simulates the entire weekday travel pattern of each person in the SCAG region (18+ million):

- derives travel from activity participation decisions
- explicitly accounts for within household interactions
- incorporates spatial and temporal constraints and influences when predicting activity participation and travel
- operates on a detailed representation of the region's population, land use and transportation networks


## I nputs \& Output

| INPUTS |  | Models |  |
| :--- | :--- | :--- | :--- |



SCAG Activity Based Model

## Market segmentation

| Person <br> type | Name |
| :---: | :--- |
| 1 | Worker |
| 2 | Working college student |
| 3 | Non-working college student |
| 4 | Working HS student |
| 5 | Non-working high school student |
| 6 | Adult non-worker |
| 7 | Children 6-15 years old |
| 8 | Children 0-5 |
| 9 | Non-school kids 6-15 |

## Segmentation

- Activity types:
- Work
- School/ College

- Escort
- Shopping
- Maintenance
- Social
- Entertainment

- Visiting family and friend
- Active recreation
- Eating out
- Work related
- Other



## Temporal resolution

- Five time periods used for skimming and assignment
$\checkmark$ AM Peak (6:00 AM to 9:00 AM)
Midday (9:00 AM to 3:00 PM)
$\checkmark$ PM Peak (3:00 PM to 7:00 PM)
Evening (7:00 PM to 10:00 PM)
Night (10:00 PM to 6:00 AM)
- 15-minute and 30-minute resolution for scheduling primary activity of a tour, extended to continuous
- Continuous for scheduling all other activities



# SCAG - ABM User I nterface 

> Built in new TransCAD 7.0

## Long Term Choice Models



## Location Choice



## Workers

- 16 years old or older.
- SCAG region has about 7 million workers in 2012; 39\% of total population of SCAG region.


## Students

About 5 million, 28\% of total population
Are categorized by 1)
Preschool, 2) Grade K-8, 3)
Grade 9-12, and 4)
College/University

## M2.0 Preschool arrangement

Step: M2 Location Choices - M2.0 PreSchool Arrangement in Scenario: Scenarios

- Long Term Choices
- Location Choices - PreSchool Arrangement
-     - Add/Remove Parameters

Input Sections
Individual Input Parameters
Output Sections
Individual Output Parameters

- Display Properties

Box Layout
Colors and Fonts
. Parameter Display
. Help Document

| Model Type | Binary Logit |  |  |
| :---: | :---: | :---: | :---: |
| Apply To | Person+HH |  |  |
| Decision Variable | GotoPreSCH |  |  |
| Segment | PersonType $=8$ and Age $>2$ |  |  |
| Additional Sources | SED Table |  |  |
| Utility $\quad \pm$ + $\downarrow$ |  |  |  |
| Source | Variable | Beta | Market Segment |
| Expression | [Person+HH].Age $=4$ | 1.006 |  |
| Expression | [Person+HH].Age $=5$ | 2.398 |  |
| Person+HH | Hnwork | -0.302 |  |
| Expression | [Person+HH].HHINC between | 0.335 |  |
| Expression | [Person+HH].HHINC between | 0.968 |  |
| Expression | [Person+HH].HHINC $>=15001$ | 1.282 |  |
|  | Constant | -0.426 |  |

Binary Logit
Person+HH

PersonType $=8$ and Age $>2$
SED Table

## M 2.0 Preschool arrangement



## M2.1 Usual School Location

2.1a Preschool Location Model - MNL
2.1b Usual School Location k-8 Rule based
2.1c Usual School Location 9-12 Rule based
2.1d University Location- MNL

## M2.1 Usual School Location: K-12

© Step: M2 Location Choices - M2.1 School and Univ Location in Scenario: Scenarios

- Runtime
- Long Term Choices
- Location Choices
- PreSchool Location

K to 8 School Location
High School Location

- University Location


## K to $\mathbf{8}$ School Location

| Model Type | Nearest TAZ |
| :--- | :--- |
| Decision Variable | STier2TAZID |
| Segment | PersonType $=7$ |
| Kto8 School SED Set | KT08 $>0$ |

Step: M2 Location Choices - M2.1 School and Univ Location in Scenario: Scenarios
... Runtime
-- Input

- Long Term Choices
- Location Choices
- PreSchool Location K to 8 School Location High School Location University Location

High School Location

## Model Type

Decision Variable
Segment
High School SED Set

| Nearest TAZ |
| :--- |
| STier2TAZID |
| PersonType $=4$ or PersonType $=5$ |
| $[8 T 012]>0$ |

## M2.2 Work Arrangement

| workplace type | weekly work hours | number of days |
| :---: | :---: | :---: |
| 1- Work at home? $2-\mathrm{OH}$ | $\begin{aligned} & 1-<=20 \\ & 2-21-34 \\ & 3->=35 \end{aligned}$ | 3 market <br> FTW - 4,5 days PTW1 -1,2,3,4,5 <br> PTW2 -3,4,5 |

## M2.2.1 Work @ Home

|  |  |  |
| :---: | :---: | :---: |
| Age | ACS 2011 | Model |
| $16-24$ |  |  |
| $25-44$ | $1.86 \%$ | $3.67 \%$ |
| $45-60$ | $5.97 \%$ | $4.07 \%$ |
| $60+$ | $9.39 \%$ | $8.87 \%$ |
| Total | $4.76 \%$ | $4.97 \%$ |

## M2.2.1 Work @ Home



## M2.2.2.1 Work Duration

| Work Duration | Survey Analysis |  | Model Results |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Duration | Survey Freq | Survey Share | Initial ASC | Initial Share | Final ASC | Final Share | Final Count |
| 1-20 hrs | 658,413 | 10.14\% | -1.920 | 13.26\% | -2.274 | 10.36\% | 667,106 |
| 21-34 hrs | 449,275 | 6.92\% | -2.391 | 9.86\% | -2.829 | 7.07\% | 454,806 |
| 35+ hrs | 5,383,803 | 82.94\% |  | 76.88\% |  | 82.57\% | 5,315,259 |
|  | 6,491,491 |  |  |  |  |  | 6,437,171 |

MNL with 3 alternatives: 0-20hrs, 21-34hrs, 35+ hrs

## M2.2.2.2 Work Days

| Wdays | HTS | Model | Segment 1: <br> Full time workers <br> (35 hrs/wk and more) |
| :---: | :---: | :---: | :---: |
| 4 | 6.64 | 6.6 |  |
| 5 | 93.36 | 93.4 |  |
| Wdays | HTS | Model | Segment 2: <br> Part time workers ( 1-20 hrs/wk ) |
| 1 | 9.98 | 9.7 |  |
| 2 | 17.28 | 16.8 |  |
| 3 | 24.19 | 23.6 |  |
| 4 | 14.37 | 14 |  |
| 5 | 34.18 | 36 |  |
| Wdays | HTS | Model | Segment 3: <br> Part time workers ( $21-34 \mathrm{hrs} / \mathrm{wk}$ ) |
| 3 | 18.01 | 17.8 |  |
| 4 | 34.05 | 33.5 |  |
| 5 | 47.94 | 48.7 |  |

MNL on 3 Market Segments based on Work Duration

## M.2.3 Work location

| Utility |  |  |  |
| :---: | :---: | :---: | :---: |
| Utility |  |  |  |
| Source | Variable | Beta | Market Segment |
| Transform Logsum Work Matri | TLS | -0.04435 |  |
| Expression | Log(1.0+[Transform Logsum 4 | -1.22677 |  |
| Expression | pow([Transform Logsum Work | 6e-005 |  |
| Transform Logsum Work Matri | TLS | -0.02341 | [Person+HH].Gender $=2$ |
| Expression | powi[Transform Logsum Work | 0.0001 | [Person+HH].Gender $=2$ |
| Expression | Log(1.0+[Transform Logsum 4 . | -0.30275 | [Person+HH].HHINC <= 3500 |
| Transform Logsum Work Matri | TLS | 0.0113 | [Person+HH].HHINC > 10000 |
| Expression | powi[Transtorm Logsum Work | 7e-005 | [Person+HH].HHINC > 10000 |
| Transform Logsum Work Matri | TLS | 0.01389 | [Person+HH] WorkDuration = |
| Expression | Log(1.0+[Transform Logsum 4 . | -0.77254 | [Person+HH] WorkDuration = |
| Transform Logsum Work Matri | TLS | -0.00742 | [Person+HH].GENDER=2 anc |
| Expression | Log(1.0+[Transform Logsum 4 | 0.34006 | [Person+HH].GENDER=2 anc |
| Expression | [AM SOV Skim].[NON-TOLL [ | -999 |  |

- Updating input files ( skim and attraction rate)
- Re-estimate work location


## M.2.4 Work Schedule Flexibility

|  |  |  |
| :---: | :---: | :---: |
| WSCHED | HTS | Model |
| 1 | 43.69 | 41.8 |
| 2 | 44.57 | 46 |
| 3 | 11.75 | 12.1 |

MNL with 3 alternatives: None, Moderate and High

## Mobility Choice Models



## M.3.1 Drive License

| Age | Yes | No | Percentage |
| :---: | :--- | :---: | :---: |
| $16-18$ | 708,401 | $170,602.00$ | $80.6 \%$ |
| $19-24$ | $1,347,450$ | $211,434.00$ | $86.4 \%$ |
| $25-29$ | $1,116,940$ | $159,182.00$ | $87.5 \%$ |
| $30-44$ | $3,282,869$ | $456,032.00$ | $87.8 \%$ |
| $45-60$ | $3,371,269$ | $438,643.00$ | $88.5 \%$ |
| $60-70$ | 355,602 | $452,071.00$ | $44.0 \%$ |
| $70-80$ | 192,438 | $289,123.00$ | $40.0 \%$ |
| $80+$ | $11,338,285$ | $2,601,793.00$ | $81.3 \%$ |

## Driver License <br> For Age >= 16,

Survey Share was 83.46\%

- Model Share was 81.0\%


## M.3.2 Auto Ownership

- Predicts number of household vehicles
- Nested Logit
- Households (HHs) with no licensed drivers should automatically be assigned 0 cars.



## M.3.2 Auto Ownership

|  | 0Cars | 1Car | 2Cars | 3Cars | 4+Cars | Total |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| ACS | $7.65 \%$ | $32.28 \%$ | $37.22 \%$ | $15.03 \%$ | $7.81 \%$ | $100.00 \%$ |
| HTS | $7.56 \%$ | $31.86 \%$ | $38.88 \%$ | $14.81 \%$ | $6.89 \%$ | $100.00 \%$ |
| (HTS) - Households have at least 1 <br> license driver | $3.53 \%$ | $32.90 \%$ | $40.79 \%$ | $15.55 \%$ | $\mathbf{7 . 2 3 \%}$ | $100.00 \%$ |
| Model* |  |  |  |  |  |  |

2. Long-term Choices

| 2.0 Preschool <br> Arrangement | 2.1 Usual <br> School Location | 2.2 Work <br> Arrangement | 2.3 <br> Usual Work <br> Location | 2.4Work Scheduling <br> Flexibility |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |



SCAG Activity Based Model

Activity Generation Module

## Activity Generation Module


$\square$ First step in the prediction of daily activity and travel
Travel being viewed as a derivative of out-of-home activity participation and scheduling decisions
Mandatory and non-mandatory activities
The predictions from these models are used later in the model chain to form mandatory and non-mandatory tours, as well as to predict the frequency and purpose of intermediate travel stops on tours

|  | Model Number | Model Component | Model Structure |
| :---: | :---: | :---: | :---: |
| Children | 4.1.1 | Child Mandatory Activity Frequency | Monte Carlo |
|  | 4.1.2 | Child Mandatory Activity Start/ End Time |  |
|  |  | a. Start Time | HD |
|  |  | b. End Time | HD |
|  | 4.1.3 | Child School Mode |  |
| Workers | 4.2.1 | Adult Mandatory Activity Frequency |  |
|  |  | a. Work Activity | BL |
|  |  | b. School \& University Activity | BL |
|  | 4.2.2 | Adult Mandatory Activity Start/ End Time |  |
|  |  | a. Work Activity | MNL |
|  |  | b. College Activity | MNL |
|  | 4.2.3 | Allocation of Escort Responsibilities | Rule based |
| All | 4.3.1 | Out-of-Home Activity Participation | BL |
|  | 4.3.2 | NM activity time | Regression |
|  | 4.3.3 | Out-of-Home Activity Generation |  |
|  |  | a. Household size $=<5$ | MDCEV |
|  |  | b. Household size > 5 | MDCEV |
|  | 4.3.4 | Serve Passenger Activity Generation | BL |
|  | 4.3.5 | Tour formation |  |

- Market segmentation

Model components
Model Structure

## Mandatory Activities



Crucial in shaping overall daily activity-travel pattern

Serves a peg around other activities are scheduled

Key constrain on nonmandatory activity generation

Predicted before predicting non-mandatory activities

## M4.1 Children Activities



## M4.1.1 Child Mandatory Activity Frequency

Decision to attend school on a day
Monte Carlo simulation based on attendance rate of 0.85
All children 3 years and older

## M4.1.2 School Start and End Time

\& Predict children school start and end time

* Hazard Duration Models
- Start time
- End time
* Duration - calculated
* Choice alternative: Continues time
* Apply to: all children with non-zero activity frequency
* Age, grade level, household income and number of employed adults


## M4.1.3 School Mode

Predict mode to/from school

MNL
Two sub-models

## MNL with 4 alternatives



MNL with 5 alternatives


## M4.2 Adult Mandatory Activity

A. Worker

Go to work?

B. Student

Go to school?
school start/ end
time?

## Decision tree

## M4.2.1a Go to work

- Monte Carlo based on days of work from M2.2 for each market segment
- Apply to: Person.Pertype=1 who work outside of home


## M4.2.1a Go to school

-Monte Carlo based on initial attendance rate $=0.7$
-Apply to: 'Individuals with Person. Pertype==2 and 3

## M4.2.2a Work Start and End time

- Predict activity start time and end time at primary work place
- For all workers in a household who go to work on the given day
- Model structure: MNL

Choice Alternatives: 48 bin (start from 3.00 am )
Apply to: (Person.Pertype==1) who work outside of home Estimation data: SCAG HTS 2012

## M4.2.2b College start and end time

Model structure: MNL
Choice Alternatives: 7 alternatives:

- before 7.30
- 7.30-8.29
- 8.30-9.29
- 9.30-10.29
- 10.30-11.59
- 12.00-3.59pm
- 4pm-
$\square$ Apply to: All university students (Person.Pertype==2 and 3) who go to schoc on the day
Reference time: 7.30-8.29


## M.4.2.3 Escort responsibility

- Allocates children drop-off and pick up episodes to parents
- Rule based allocation

If child is Car pool passenger in M4.1.3?



## Thank You

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