

# Development of a MultiModal Travel Demand Module for the Regional Strategic Planning Model tool

Experience of contributing to the VisionEval project

Liming Wang, Huajie Yang, Brian Gregor, and Tara Weidner

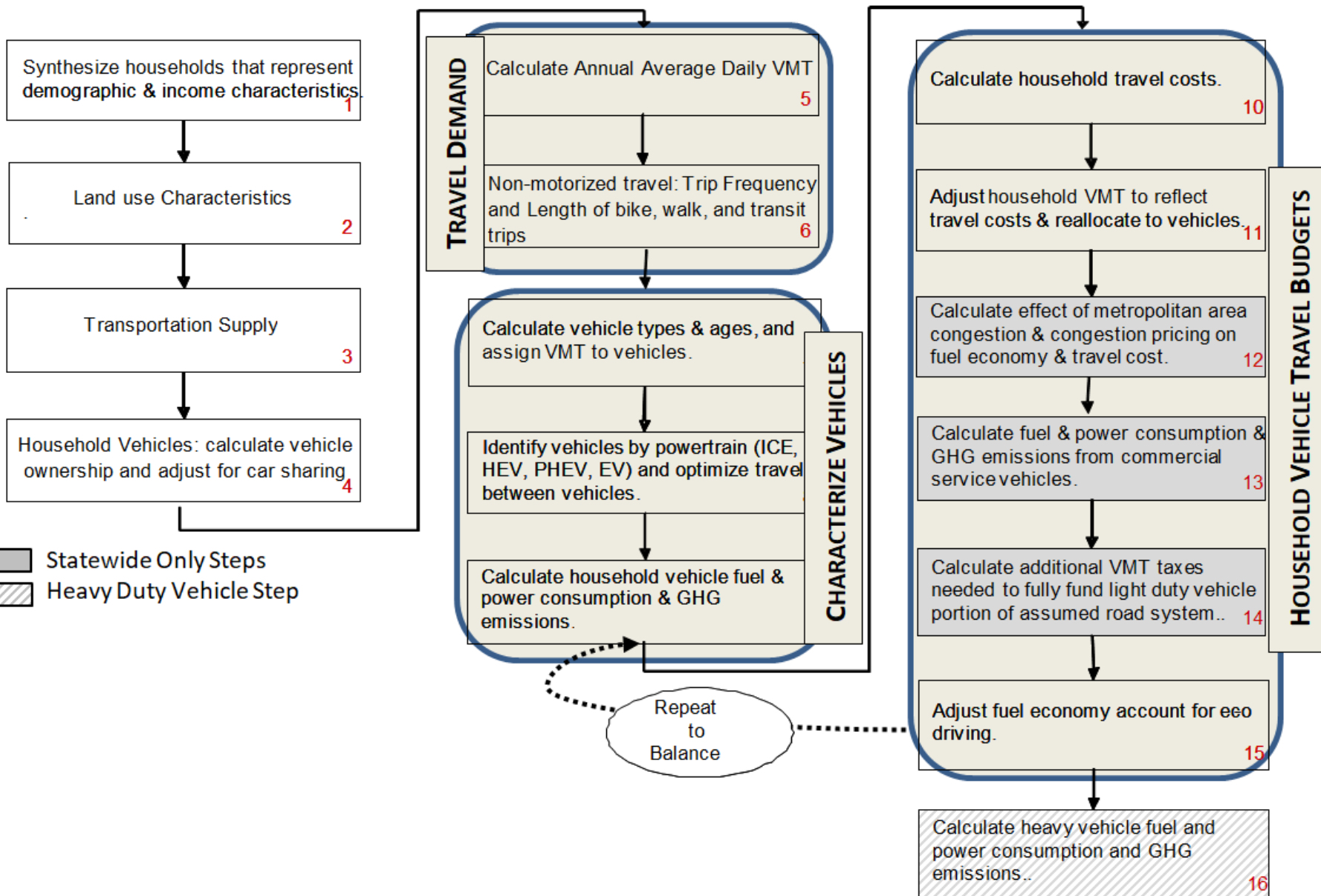
6/25/2018

# Outline

- The VETravelDemandMM module
- Innovations
- The process of contributing to VisionEval
- Reflections

# The VETravelDemandMM module

- Started in 2015 as an Oregon DOT SPR project to better capture mode shifting for the Regional Strategic Planning Model (RSPM) tool to
  - Incorporate non-auto modes into a mode choice module for the RSPM tool;
  - Explore and utilize the best data sources available for model estimation;
  - Leverage this effort for additional research and expand the scope to include emerging modes (bike sharing, car sharing, shared automated vehicles).



# Progress

- Originally planned to be implemented for the original RSPM/GreenSTEP (ver 3.5)
- Modes/models included:
  - Annual Average Daily Vehicle Models Travelled (VMT) model
  - Transit trips (frequency and length) and Person Miles Travelled (PMT)
  - Biking trips and PMT
  - Walking trips and PMT
- Products (so far):
  - Project working papers and report deliverables
  - A poster presentation at the 2018 TRB annual meeting
  - A manuscript under review for publication at the Journal of Transport and Land Use

**SPR Funded  
Research Project Work Plan  
for**

**Incorporate Travel Mode Choices in the Regional Strategic Planning  
Model (RSPM) Tool  
SPR 788**

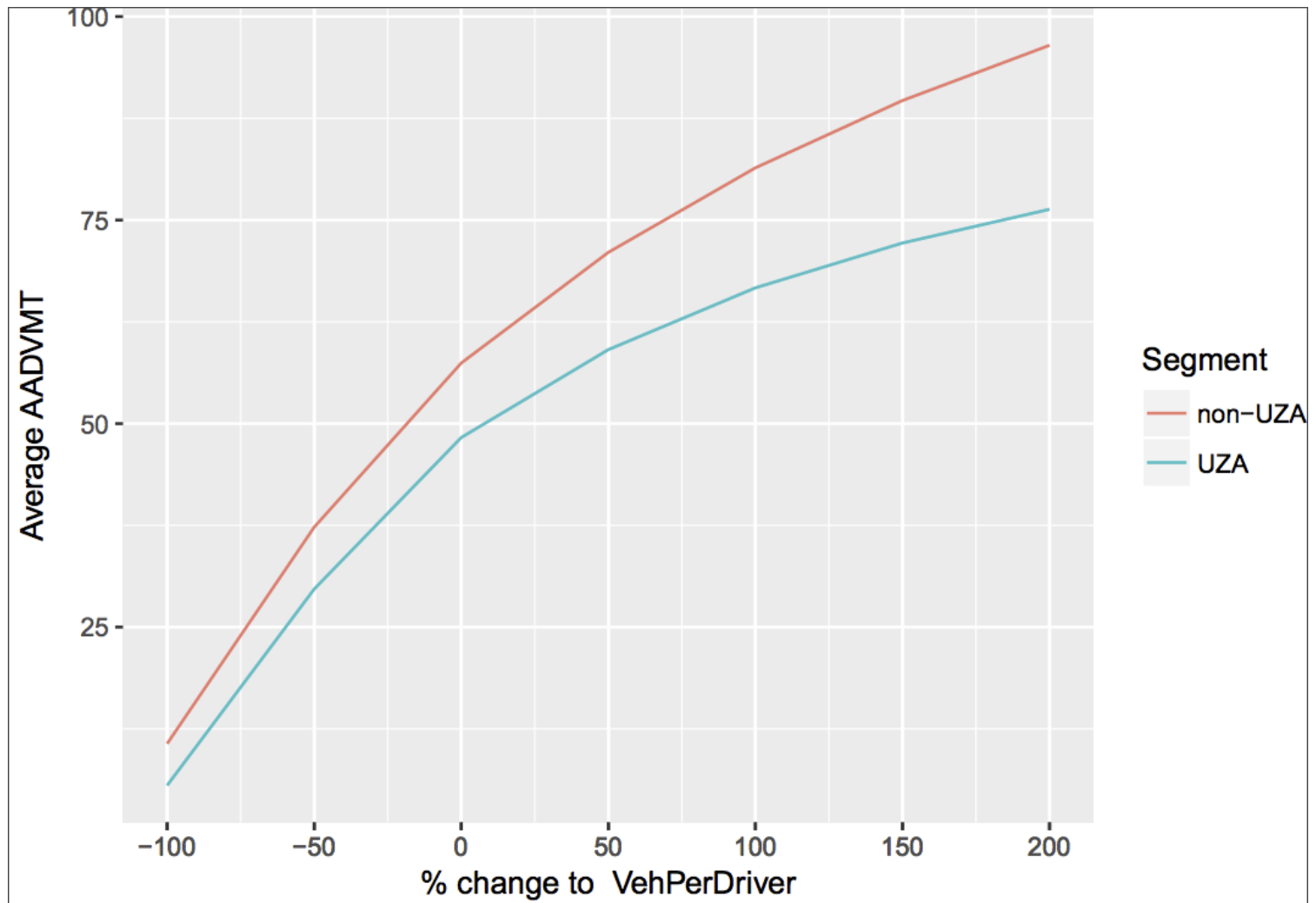
| <b>Project Tasks</b>   | <b>FY16</b>            |                       |                       |                       | <b>FY17</b>            |                       |                       |                       | <b>FY18</b>            |                       |
|--|------------------------|-----------------------|-----------------------|-----------------------|------------------------|-----------------------|-----------------------|-----------------------|------------------------|-----------------------|
|  | Qtr 1<br>July -<br>Sep | Qtr 2<br>Oct -<br>Dec | Qtr 3<br>Jan -<br>Mar | Qtr 4<br>Apr -<br>Jun | Qtr 1<br>July -<br>Sep | Qtr 2<br>Oct -<br>Dec | Qtr 3<br>Jan -<br>Mar | Qtr 4<br>Apr -<br>Jun | Qtr 1<br>July -<br>Sep | Qtr 2<br>Oct -<br>Dec |
| <b>Task 1:</b> Literature review and data exploration                        |                        | *                     | T                     |                       | *                      |                       |                       |                       |                        |                       |
| <b>Task 2:</b> Model design and estimation                                   |                        |                       |                       |                       |                        | *                     |                       |                       |                        |                       |
| <b>Task 3:</b> Model Implementation  |                        |                       |                       |                       |                        | T                     | *                     |                       |                        |                       |
| <b>Task 4:</b> Mode testing  |                        |                       |                       |                       |                        |                       | *                     | T                     |                        |                       |
| <b>Task 5:</b> Brian Gregor training, consultation and support for Tasks 2-4 |                        |                       |                       |                       |                        |                       |                       |                       |                        |                       |
| <b>Task 6:</b> Final Report  |                        |                       |                       |                       |                        |                       |                       | *                     | T                      |                       |
| <b>Task 7:</b> Code Implementation   |                        |                       |                       |                       |                        |                       |                       |                       |                        |                       |

\* Deliverables (\*) Initial deliverables T – TAC Meeting

# Innovations

- Utilizing a novel dataset of highly detailed information of households (2009 NHTS) and built environment (EPA Smart Location Database) with a US nationwide coverage;
- Modeling annual average daily Vehicle Miles Traveled (AADVMT), instead of the VMT during the day of the survey commonly used in similar models;
- Use of cross validation in model development to avoid overfitting;
- Conducting model selection, in addition to variable selection, in the model development process to select the best model structure among a handful of options;
- Implemented in the popular statistical programming language R as a self-contained package, which contains documents and functions for model (re-)estimation and prediction;
- The model development process, from data processing, model estimation, validation and testing, to report and document compiling, follows the best practices of reproducible research; results and products derived from our work, including this ITM paper/presentation, is fully reproducible by others (sans confidential data).

# Elasticities





# Validation: VETravelDemandMM Predictions

| Category                    | n     | AADVMT | Trips     |           |              | PMT     |         |            |
|-----------------------------|-------|--------|-----------|-----------|--------------|---------|---------|------------|
|                             |       |        | BikeTrips | WalkTrips | TransitTrips | BikePMT | WalkPMT | TransitPMT |
| Overall                     |       |        |           |           |              |         |         |            |
| RVMPO                       | 74045 | 41.800 | 0.146     | 0.891     | 0.144        | 0.290   | 0.578   | 0.751      |
| DevelopmentType             |       |        |           |           |              |         |         |            |
| Rural                       | 6476  | 49.200 | 0.158     | 0.754     | 0.134        | 0.294   | 0.513   | 0.816      |
| Urban                       | 67569 | 41.100 | 0.145     | 0.905     | 0.145        | 0.290   | 0.584   | 0.745      |
| Income                      |       |        |           |           |              |         |         |            |
| <\$40k                      | 31432 | 25.100 | 0.124     | 0.762     | 0.180        | 0.167   | 0.482   | 0.676      |
| \$40k-\$80k                 | 18071 | 43.800 | 0.149     | 0.907     | 0.125        | 0.288   | 0.586   | 0.754      |
| >\$80k                      | 24542 | 61.800 | 0.172     | 1.045     | 0.111        | 0.449   | 0.694   | 0.844      |
| Popuplation per Square Mile |       |        |           |           |              |         |         |            |
| <1k                         | 19126 | 42.300 | 0.143     | 0.710     | 0.133        | 0.249   | 0.476   | 0.739      |
| 1k-5k                       | 35477 | 42.300 | 0.144     | 0.898     | 0.141        | 0.294   | 0.579   | 0.753      |
| 5k-10k                      | 18211 | 40.700 | 0.151     | 1.071     | 0.157        | 0.327   | 0.682   | 0.757      |
| >10k                        | 1231  | 36.900 | 0.157     | 0.876     | 0.202        | 0.258   | 0.575   | 0.792      |

# Validation: RSPM Predictions

| Category                    | n     | DVMT   | Trips     |           |              |
|-----------------------------|-------|--------|-----------|-----------|--------------|
|                             |       |        | BikeTrips | WalkTrips | TransitTrips |
| Overall                     |       |        |           |           |              |
| RVMPO                       | 74045 | 52.400 | 0.092     | 0.690     | 0.037        |
| DevelopmentType             |       |        |           |           |              |
| Rural                       | 6676  | 65.400 | 0.088     | 0.741     | 0.023        |
| Urban                       | 67369 | 51.200 | 0.092     | 0.685     | 0.038        |
| Income                      |       |        |           |           |              |
| <\$40k                      | 31791 | 34.700 | 0.090     | 0.604     | 0.053        |
| \$40k-\$80k                 | 17852 | 56.200 | 0.090     | 0.645     | 0.023        |
| >\$80k                      | 24402 | 72.800 | 0.095     | 0.834     | 0.026        |
| Popuplation per Square Mile |       |        |           |           |              |
| <1k                         | 19208 | 57.400 | 0.087     | 0.598     | 0.022        |
| 1k-5k                       | 34215 | 54.300 | 0.093     | 0.704     | 0.035        |
| 5k-10k                      | 19384 | 45.900 | 0.094     | 0.752     | 0.050        |
| >10k                        | 1238  | 29.200 | 0.103     | 0.751     | 0.108        |


# Validation: "Observed" OHAS

| Category                    | n   | DVMT   | Trips     |           |              | PMT     |         |            |
|-----------------------------|-----|--------|-----------|-----------|--------------|---------|---------|------------|
|                             |     |        | BikeTrips | WalkTrips | TransitTrips | BikePMT | WalkPMT | TransitPMT |
| Overall                     |     |        |           |           |              |         |         |            |
| RVMPO                       | 931 | 36.700 | 0.232     | 0.870     | 0.094        | 0.395   | 0.276   | 0.538      |
| DevelopmentType             |     |        |           |           |              |         |         |            |
| Rural                       | 81  | 50.200 | 0.159     | 0.435     | 0.008        | 0.210   | 0.137   | 0.042      |
| Urban                       | 850 | 35.700 | 0.237     | 0.901     | 0.100        | 0.408   | 0.286   | 0.573      |
| Income                      |     |        |           |           |              |         |         |            |
| <\$40k                      | 367 | 27.200 | 0.138     | 0.798     | 0.144        | 0.164   | 0.222   | 0.762      |
| \$40k-\$80k                 | 329 | 39.100 | 0.455     | 0.777     | 0.014        | 0.763   | 0.313   | 0.050      |
| >\$80k                      | 235 | 53.900 | 0.072     | 1.186     | 0.114        | 0.300   | 0.336   | 0.845      |
| Popuplation per Square Mile |     |        |           |           |              |         |         |            |
| <1k                         | 226 | 40.800 | 0.079     | 0.510     | 0.037        | 0.270   | 0.135   | 0.013      |
| 1k-5k                       | 460 | 37.100 | 0.361     | 0.891     | 0.084        | 0.595   | 0.304   | 0.495      |
| 5k-10k                      | 232 | 32.800 | 0.167     | 1.036     | 0.145        | 0.222   | 0.310   | 0.979      |
| >10k                        | 13  | 43.500 | 0.000     | 1.408     | 0.076        | 0.000   | 0.528   | 0.055      |

# VisionEval Framework

- When the project started, VisionEval (formerly RSPM Framework) was still on the drawing board;
- As VE development picked up steam and materialized, the project team and TAC decided that it made more sense to implement for VE instead;
- Started switching to implement as a VE module package in 12/2016;
- Amended the Scope of Work to include the contribution review in 02/2017

# VETravelDemandMM Implementation

- GitHub Repository: <https://github.com/cities-lab/VETravelDemandMM>
- A standard R package with
  - inst/extdata - external datasets (HPMS, NTD, Place Types etc; 2009 NTHS and SLD are dependencies as separate packages)
  - data-raw/ - scripts for model estimation; can be adapted for re-estimating models with new data
  - data/ - estimated R model objects
  - R/ - implementation of the module
  - man/ - manuals for functions implemented in the package
  - vignettes/ - vignettes (documents) for the package, including an introduction document, contribution review and feedback
  - test/ - tests that are automatically with travis-ci 

# Contribution Review Process

- Contribution Review Criteria Check List
- Responses to Contribution Review Criteria
- Pull Request
- Comments from the Review team

# Reflections

- The modular VE framework, along with the design principle, sample modules, extensive documentation and coding style guide, is extremely helpful;
- Best practices we follow (mostly blessings to our team) and facilitate incorporating our code with the VE code base:
  - Code organization as R package
  - The git/GitHub workflow
  - Automated tests and continuous integration
  - Reproducible research practice
- Working closely with VE core developers like Brian Gregor and myself being part of the team that helped devising the review criteria helped;
- Bridging the gap between transportation research and professional practice and leveraging SPR/UTC funding

# Acknowledgements

- Oregon Department of Transportation (SPR 788)
- National Institute for Transportation and Communities (NITC-881)