

# Representing Pedestrian Tours in Contemporary Travel Forecasting Models

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Presentation for  
**iCity-ORF: 4<sup>th</sup> Annual Research Day**

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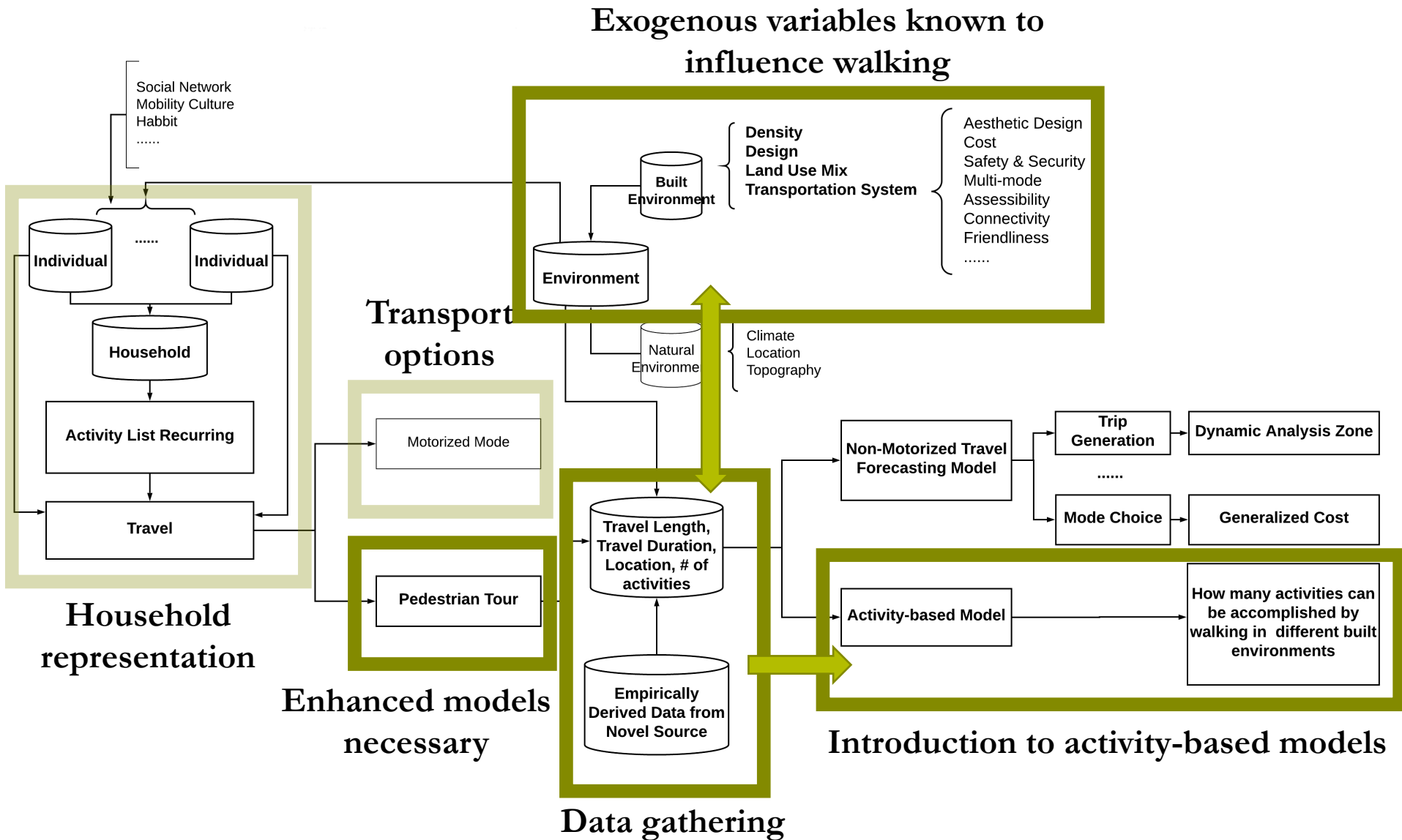
Toronto, Canada  
31 May 2019



# Presentation Outline

1. **Structure of Concepts and Background**
2. **Evolution of Travel Forecasting Models**
3. **Pedestrian Tours: Typology, Complexity, and Costs**
4. **Characteristics Influencing Walking Decisions**
5. **Primary Obstacles to Improve Pedestrian Models**
6. **Future Work**

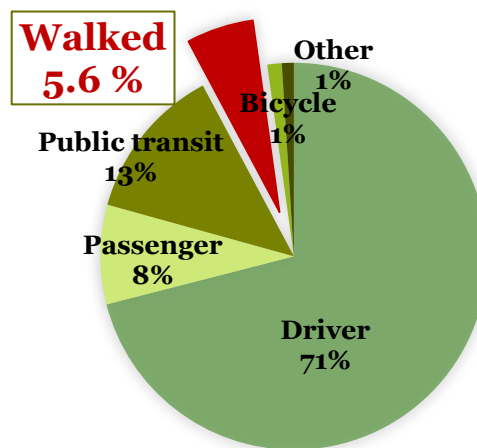
# Structure of Concepts



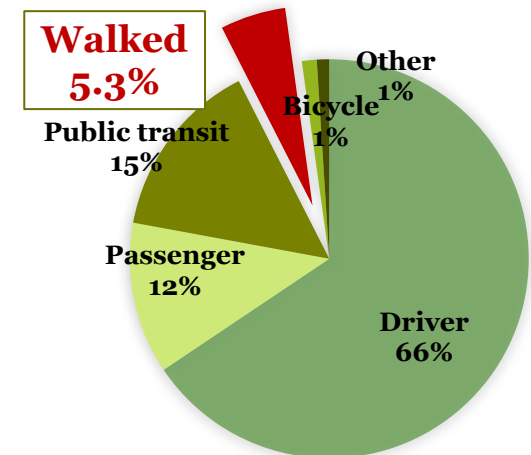
# Some Facts: Mode of Transportation to Work

Province	Walked (%) 2006	Walked (%) 2016
Canada	6.4	5.5
N.L.	7.7	4.9
P.E.I.	6.6	5.4
N.S.	8.2	6.3
N.B.	6.6	4.6
Que.	6.6	<b>Lowest</b> 5.6
<b>Ont.</b>	<b>5.6</b>	5.3
Man.	7.4	5.6
Sask.	<b>Lowest</b> 5.1	5.6
Alta.	5.9	<b>4.5</b>
B.C.	6.9	6.8

SOURCE: Statistics Canada 2006, 2016



**Ontario 2006**


















**Ontario 2016**

SOURCE: Ontario Census 2016; Statistics Canada 2006

KW Region	2006 (%)	2016 (%)
Car, Truck or Van (Driver)	78.7	81.0
Car, Truck or Van (Passenger)	9.3	6.7
Public Transit	4.6	5.9
<b>Walked</b>	<b>5.1</b>	<b>4.4</b>
Bicycle	1.6	1.1
Other	0.8	0.8

SOURCE: Region of Waterloo Census 2016, Place of work and commuting to work

# Behavioral Representation in Models

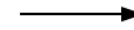
Activity List				
Daily	Location	Start Time	End Time	Participants
Work		8:30 AM	5:00 PM	 
School		9:00 AM	3:00 PM	 
Recreation		Flexible	Flexible	 <small>Chaperone</small>
Weekly	Location	Start Time	End Time	Participants
Shopping		Flexible	Flexible	
Grocery		Flexible	Flexible	
Music Lesson (Saturday)		4:00 PM	6:00 PM	 

## Long-term Household Decisions

Home Location  
Work/School Location  
Auto Ownership  
Transit Pass

**P**

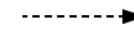
Parking



Individual trips



Joint trips



Walking trips

## Members/Decision Makers



Adult 1



Adult 2



Dependent



Senior

## Household Travel Resources



Auto



Bus



Bicycle



Walk



New LRT

## ▪ Household Travel:

- Decision-making: long-term; mid-term; short-term
- Generate different types of activities
- Share resources and experiences
- Budget: Money/Time/Resources/Chauffer



# Evolution of Travel Forecasting Models

## Trends:

**Trips** → **Activities**

**Few large TAZs** → **Thousands of TAZs** → **Parcels**

**Individual** → **Household**

**Discrete time periods** → **Time of day**

**CBD** → **All**

**Paper-based survey** → **Novel methods**

1950 1955 1960 1965 1970 1975 1980 1985 1990 1995 2000 2005 2010 2015 2020

Late 1950's Trip-based Models

1970's Disaggregate trip-based model

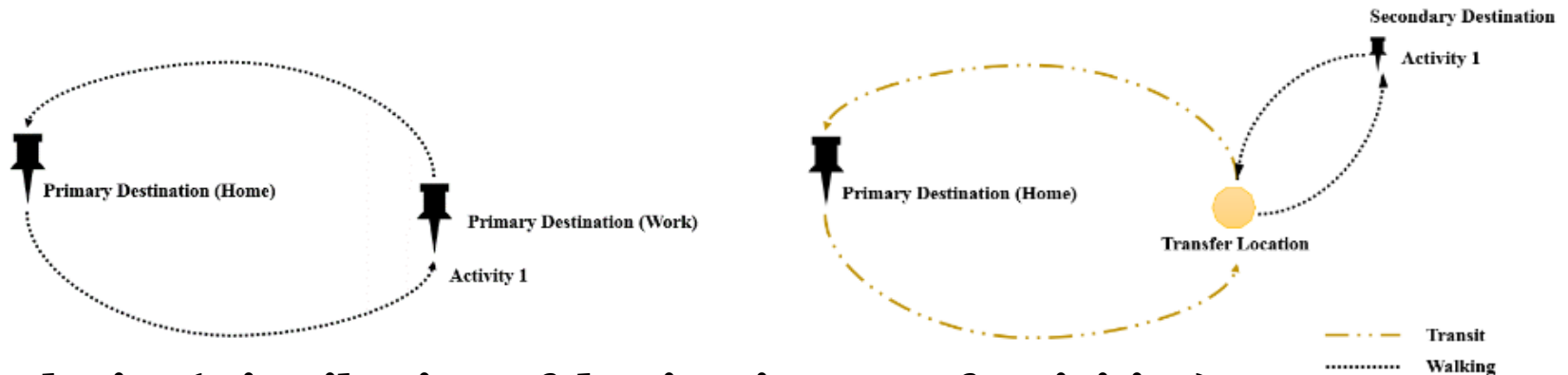
1990's Activity-based Model

**Behavioral representation, decision-making...**

# Typology and Complexity of Pedestrian Tours

- **Typology (Purpose & Access Mode)**

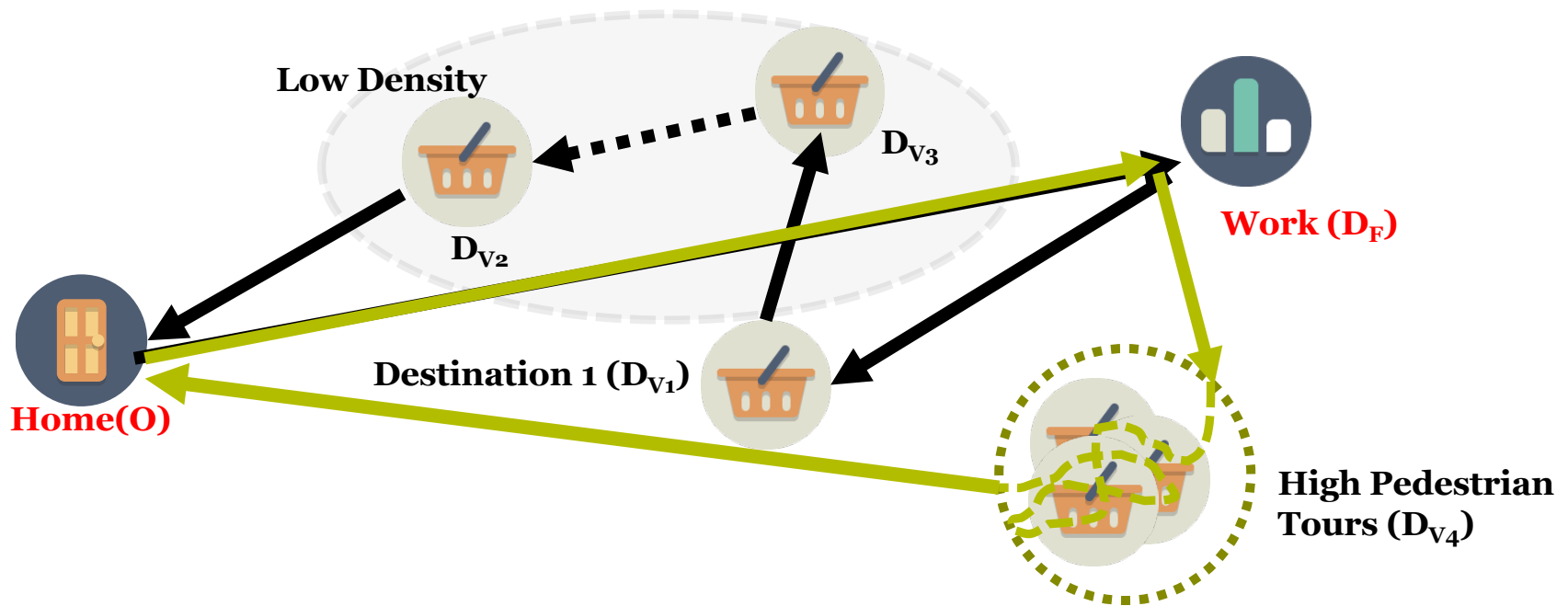
- Recreational and Utilitarian (Mokhtarian & Salomon, 2001)
- Unimodal and Multimodal (access modes)



- **Complexity (Distribution of destinations, # of activities)** (Ho & Mulley, 2013)

	Single Purpose	Multiple Purposes
Single Destination	✓	✓
Multiple Destinations	NA	✓

# Costs of Individual Tours (Total)



Case 1  Case 1 Total Cost =  $\sum TT + \sum AT = OD_F + D_F D_{V1} + AT_1 + D_{V1} D_{V3} + \dots$   
 Case 2  Case 2 Total Cost =  $\sum TT + \sum AT = OD_F + D_F D_{V4} + AT_4 + D_{V4} O$

Maximize HUF = H (u<sub>1</sub>, u<sub>2</sub>)

Choose pedestrian tour's utility > auto tour's utility

**Social Impacts: Case 2 > Case 1**



# HH Characteristics Influencing Walking Decisions

Recreational Walking		Utilitarian Walking	
Factors	Influence	Factors	Influence
<b>HH Composition:</b> Presence of children	+	<b>Car Ownership:</b> 0 # of drivers > vehicles	+ +
<b>Age:</b> 65+	+	<b>Age:</b> 65+ < 30	- +
<b>Gender:</b> men	-	<b>Gender</b>	=
<b>Income:</b> <\$30k	+	<b>Income:</b> >\$30k	-
<b>Education:</b> higher	+	<b>Education:</b> higher	+

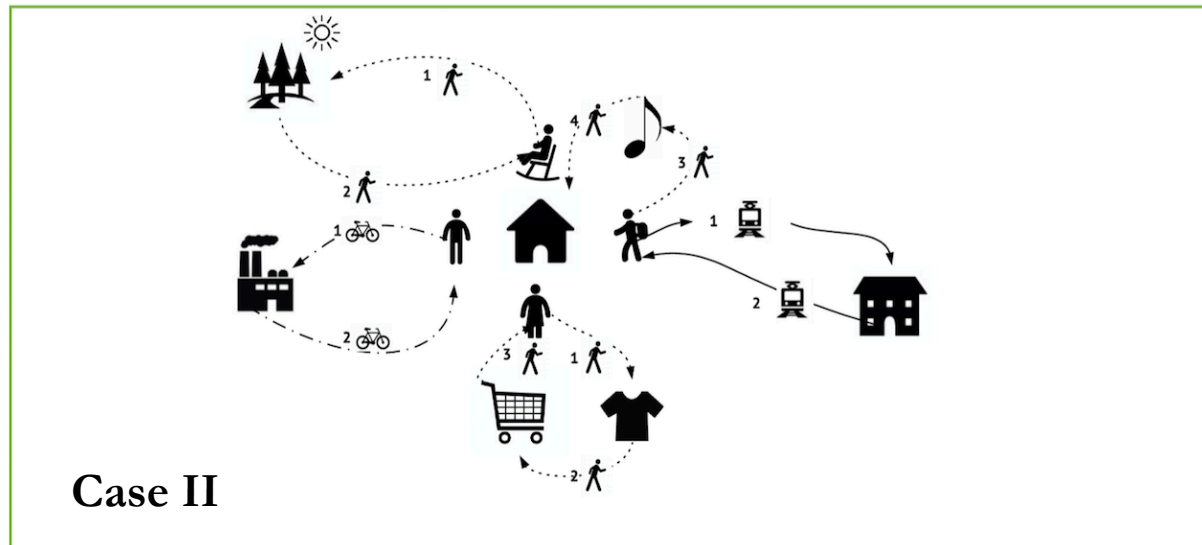
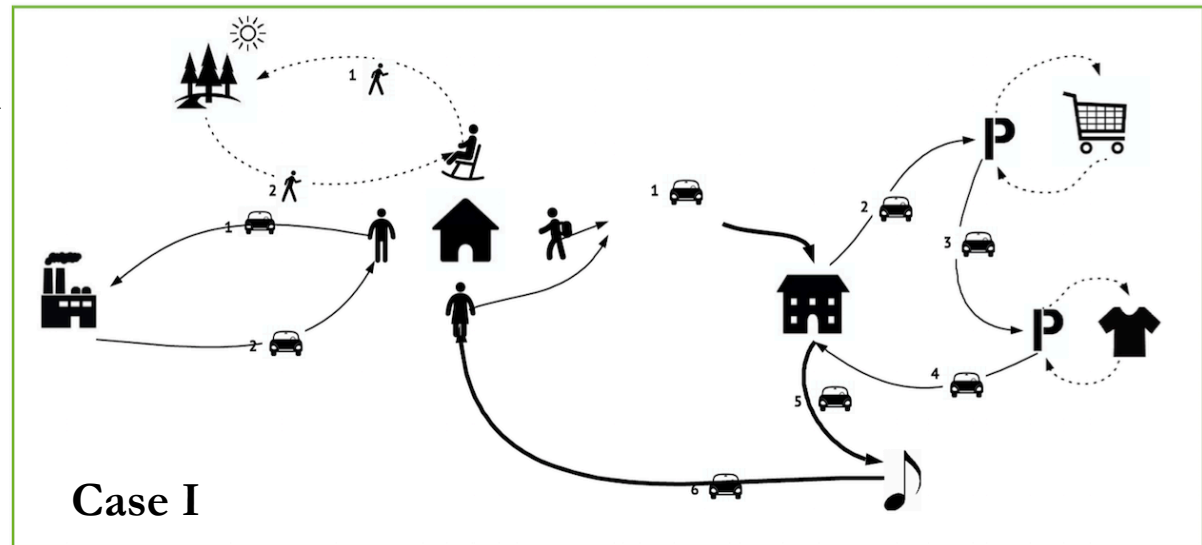
# Locational Attributes Influencing Walking

	Factors	Influence
<b>Strategic Level</b>	Higher densities, compact, and a mix of uses	+
	Proximity to non-residential destinations/transit	+
	Land use diversity	+
	Density of destinations	+
<b>Recreational</b>	Quality and proximity to natural facilities such as parks	+
<b>Tactical Level</b>	Shorter distance between destinations	+
	Sidewalk (more important in commercial areas)	+
	Visually interesting and attractive landscaping and building features (Aesthetic)	+
	High traffic volume/noise/poor lighting	-

# Locational Attributes Influence Walking

- **Residential and work area attributes:**

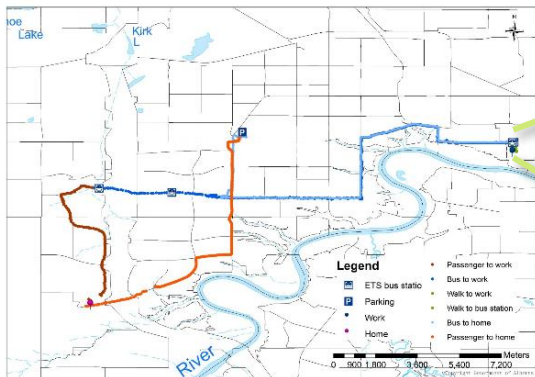
- High utility destination area (support MPSD), but different desirable functions
- Within energy expenditure
- Accessibility to destinations
- Diversity and density of land uses
- Safe neighborhood
- Within time budget
- Comfort and pleasure design



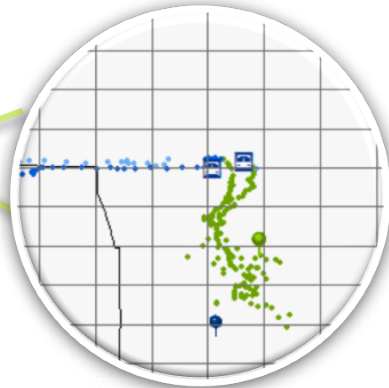
# Primary Obstacles to Improve Pedestrian Models

- A lack of empirical data (Singleton et al., 2018;)
- Inappropriate travel survey design/methods (Harding, et al., 2018)
- Inappropriate zonal structure (Iacono, 2010; Clifton, 2016)
- Failure to consider pedestrian tours in satisfying activities
- Failure to develop appropriate cost representation for pedestrians

TAZs



PAZs



Tour Segments /Trips	Mode	Time	Zone	Location	Activity
1	Transit	7:09	221	Home	Activity 1
		7:13	312	Location 1	
2	Transit	7:17	312	Location 1	Activity 2
		7:35	342	Location 2	
3	Walk	1:56	342	Location 2	Activity 3
		1:59	432	Location 3	
4	Walk	2:07	432	Location 3	Activity 2
		2:10	342	Location 2	
5	Transit	7:12	342	Location 2	Activity 2
		7:33	221	Home	

**Missing short walking trips in models**

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# Data Collection Methods: Travel Survey

**NORTH CENTRAL TEXAS COUNCIL OF GOVERNMENTS HOME INTERVIEW SURVEY**

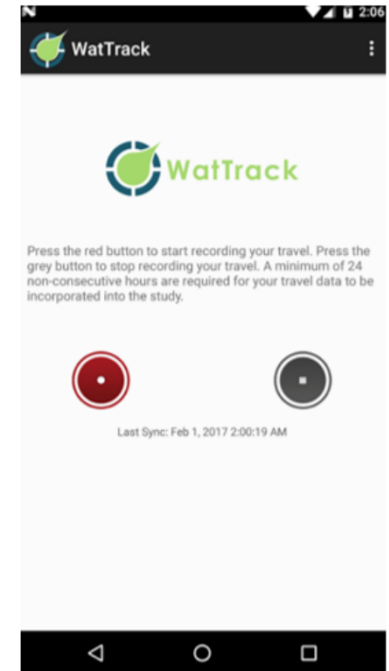
**TRAVEL DIARY**

**INSTRUCTIONS:**  
PLEASE CARRY THIS DIARY WITH YOU THROUGHOUT THE TRAVEL DATE SHOWN AT THE LEFT. PLEASE USE IT TO RECORD EACH TRIP YOU MAKE INCLUDING THE ITEMS SPECIFIED BELOW. DO NOT RECORD WALKING OR BICYCLE TRIPS UNLESS TO GO TO WORK. PLEASE LEAVE THE FILLED IN CARD IN A CONVENIENT PLACE AT HOME SO IT WILL BE AVAILABLE WHEN OUR INTERVIEWER CALLS. USE THE BACK OF THIS CARD AND AN EXTRA CARD IF NECESSARY.

NAME \_\_\_\_\_ TRAVEL DAY \_\_\_\_\_ TRAVEL DATE \_\_\_\_\_

SAMPLE NUMBER [ ] [ ] [ ] I AM \_\_\_\_\_ YEARS OLD I AM  MALE  FEMALE

WHERE DID THIS TRIP BEGIN?	WHERE DID THIS TRIP END?	TRIP PURPOSE (Enter Number)	DESTINATION ACTIVITY (Restaurant, Auto Repair, Office, etc.)	TRIP TIME (Circle AM or PM) BEGIN   END	MODE OF TRAVEL (Enter Number)	IF AUTO DRIVER (No. in Car, Include Driver)	IF CAR OR VANPOOL (No. in Car, Include Driver)	IF BUS HOW DID YOU GET TO BUS STOP? (Enter Number)	TRANSIT FARE PARKING COST
Address _____ City _____ Zip _____	Address _____ City _____ Zip _____	1 Home 2 Work 3 Shop 4 School 5 Social/ Recreation	_____	AM PM   AM PM	1 Auto Driver 2 Auto Pasgr. 3 Bus 4 School Bus			1 Walk 2 Drove Auto and Parked 3 Auto But Not Parked 4 Car Pool 5 Other	\$ . . \$ . . \$ . . \$ . .



Day \_\_\_\_\_ Activity \_\_\_\_\_

**1. What was your activity?** \_\_\_\_\_

**2. Where did your activity take place?**  
Name of place: \_\_\_\_\_  
Address: \_\_\_\_\_  
City: \_\_\_\_\_

**3. What time did your activity start?** \_\_\_\_\_ A.M./P.M.

**4. What time did your activity end?** \_\_\_\_\_ A.M./P.M.

**5. Did you have to travel to get to this activity?**  
Yes → Continue with question 6  
No → Go to next activity

**6. What time did your travel start?** \_\_\_\_\_ A.M./P.M.

**7. What time did your travel end?** \_\_\_\_\_ A.M./P.M.

**8. How did you travel to the activity? (Circle one and follow instructions)**

Private vehicle   Public bus   Train   Walk   Bicycle   School bus   Other

↓                      ↓                      ↓

Answer Q. 9-16    Answer Q. 17-20    Answer Q. 29-32

**9. Which vehicle did you use?**  
Household \_\_\_\_\_  
Other \_\_\_\_\_

**10. Were you the**  
 Driver    Passenger

**11. How many people were in the vehicle (including driver)?** \_\_\_\_\_

**12. Where did you park?**  Did not park  
 Street    Drive-through    Driveway  
 Parking lot/garage    Other

**13. How did you pay for the parking?**  
 Did not pay  
 Hourly    Weekly    Semesterly  
 Daily    Monthly    Other

**14. How much did you pay for parking?** \$ \_\_\_\_\_

**15. Who subsidized your parking?**  
 No one    Employer  
 Business/store    Other

**16. What was the full unsubsidized price to park?** \$ \_\_\_\_\_

**17. Did you have a vehicle available?**  
 Yes    No

**18. How would you have paid for parking if you went by car?**  
 Would not pay  
 Hourly    Weekly    Semesterly  
 Daily    Monthly    Other

**19. How much would you have had to pay for parking if you went by car?** \$ \_\_\_\_\_

**20. What was the first transit route taken?**

**21. Where did you board?**  
Address/place: \_\_\_\_\_  
Cross streets: \_\_\_\_\_  
City: \_\_\_\_\_

**22. How did you get to the stop?**  
 Drove & parked    Dropped off  
 Carooled    Walked    Other

**23. How did you get from the stop to your destination?**  
 Drove & parked    Dropped off  
 Carooled    Walked    Other

**24. How did you pay for your trip?**  
 Cash    Fareless square  
 Ticket    Transfer  
 Pass    Other

**25. Who subsidized your transit fare?**  
 No one    Employer  
 Business/store    Other

**26. Did you transfer to another bus or train?**  
 Yes    No

**27. To what line did you transfer?** \_\_\_\_\_

**28. How many people were in your party?** \_\_\_\_\_

**If you traveled by walking, biking, school bus or other non-private vehicle, answer Questions 29-32, then 33-34.**

**29. Did you have a vehicle available?**  
 Yes    No

**30. How would you have paid for parking if you went by car?**  
 Would not pay  
 Hourly    Weekly    Semesterly  
 Daily    Monthly    Other

**31. How much would you have had to pay for parking if you went by car?** \$ \_\_\_\_\_

**32. How many people were in your party?** \_\_\_\_\_

**If your travel mode changed during this trip (even to walking), answer Questions 33-34**

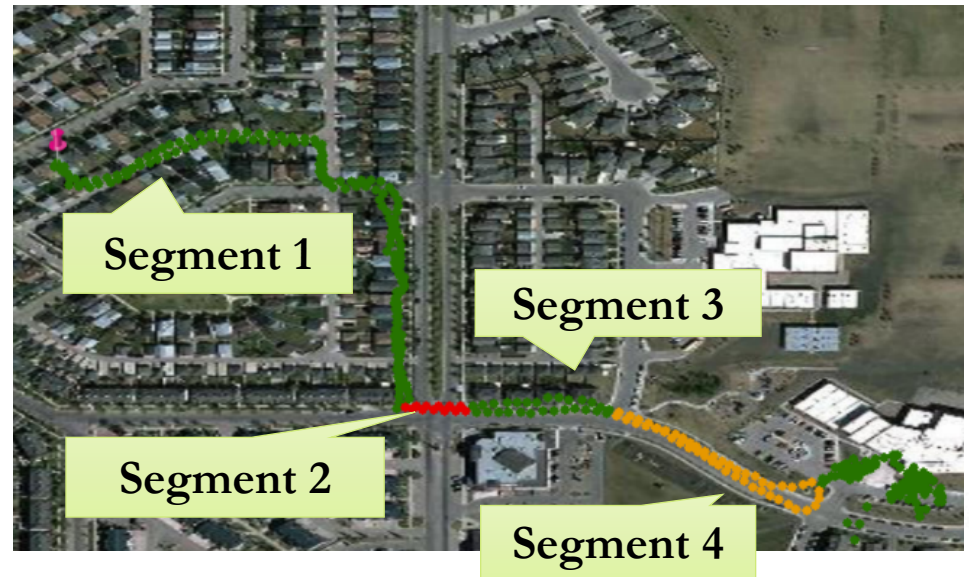
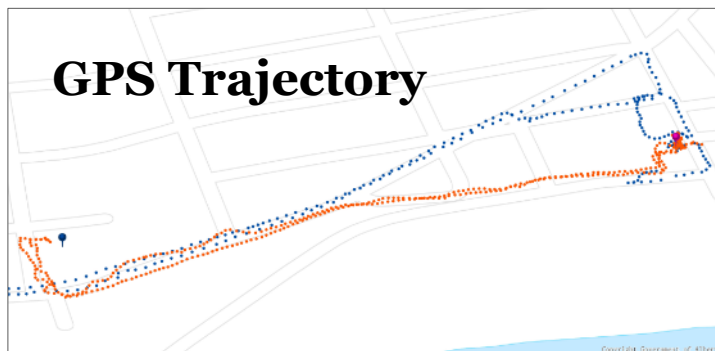
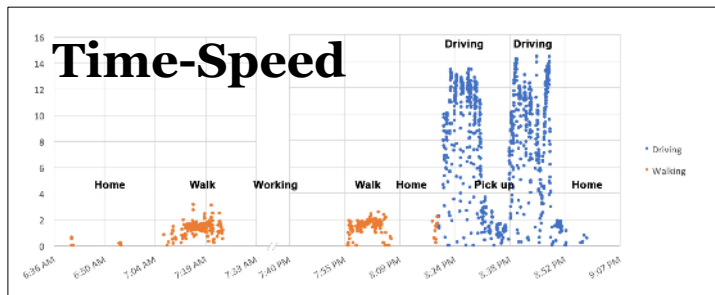
**33. To what did you change?**  
 Walk    Public bus  
 Train    Private vehicle  
 Bicycle    School bus  
 Other

**34. Where did you change travel modes?**  
Address/place: \_\_\_\_\_  
Cross streets: \_\_\_\_\_  
City: \_\_\_\_\_



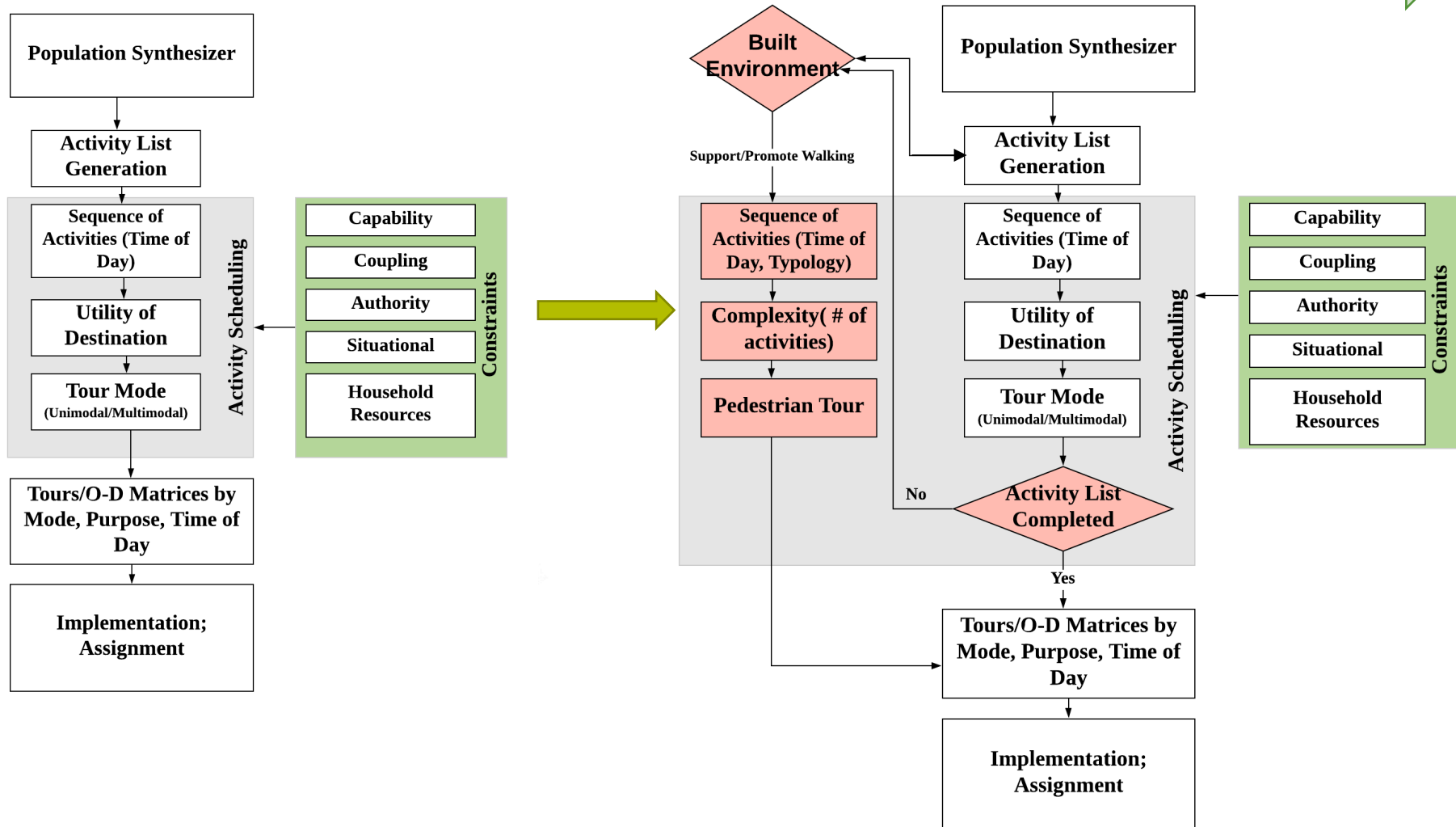
# Future Work

- Appropriate zonal structure
- Novel data collection methods (smartphone-based passive data collection)
- Tactical level pedestrian behavior and route choice
- Segment level pedestrian environment measurement



# Future Work: Key Elements in Activity-based Model

## Better Representation of Pedestrian Behaviors



# Contacts

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**Waterloo Public Transportation Initiative**

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# References

- Adams, E. J., Esliger, D. W., Taylor, I. M., & Sherar, L. B. (2017). Individual, employment and psychosocial factors influencing walking to work: Implications for intervention design. *PLoS one*, 12(2), e0171374.
- Agrawal, A. W., & Schimek, P. (2007). Extent and correlates of walking in the USA. *Transportation Research Part D: Transport and Environment*, 12(8), 548-563.
- Alfonzo, M. A. (2005). To walk or not to walk? The hierarchy of walking needs. *Environment and behavior*, 37(6), 808-836.
- Barnes, G., & Davis, G. (1999). Understanding urban travel demand: Problems, solutions and the role of forecasting. University of Minnesota, Center for Transportation Studies, 2.
- Ben-Akivai, M., Bowman, J. L. (1998). *Integration of an activity-based model system and a residential location model*. Urban Stud 35(7):1131–1153
- Ben-Akivai, M., Bowman, J. L., & Gopinath, D. (1996). Travel demand model system for the information era. *Transportation*, 23(3), 241-266.
- Cervero, R., & Kockelman, K. (1997). Travel demand and the 3Ds: Density, diversity, and design. *Transportation Research Part D: Transport and Environment*, 2(3), 199-219.
- Clifton, K. J., Singleton, P. A., Muhs, C. D., & Schneider, R. J. (2016). Representing pedestrian activity in travel demand models: Framework and application. *Journal of transport geography*, 52, 111-122
- Harding, C., Nasterska, M., Dianat, L., & Miller, E. J. (2018). Effect of land use and survey design on trip underreporting in Montreal and Toronto's regional surveys. *European Journal of Transport and Infrastructure Research*, 18(1).
- Hoogendoorn, S. P., & Bovy, P. H. (2002). Normative pedestrian behaviour theory and modelling. In *Transportation and Traffic Theory in the 21st Century: Proceedings of the 15th International Symposium on Transportation and Traffic Theory, Adelaide, Australia, 16-18 July 2002* (pp. 219-245). Emerald Group Publishing Limited.
- Hoogendoorn, S. P., & Bovy, P. H. (2005). Pedestrian route-choice and activity scheduling theory and models. *Transportation Research Part B: Methodological*, 38(2), 169-190.
- Ho, C., & Mulley, C. (2013). Multiple purposes at single destination: A key to a better understanding of the relationship between tour complexity and mode choice. *Transportation Research Part A: Policy and Practice*, 49, 206-219.
- Iacono, M., Krizek, K. J., & El-Geneidy, A. (2010). Measuring non-motorized accessibility: issues, alternatives, and execution. *Journal of Transport Geography*, 18(1), 133-140.
- Lenntorp, B. (1976). Paths in space-time environments: A time-geographic study of movement possibilities of individuals. *Lund Studies in Geography Series B Human Geography*, (44).
- Maslow, A. H. (1954). Motivation and personality. New York, NY: Harper & Brothers.
- Mokhtarian, P. L., & Salomon, I. (2001). How derived is the demand for travel? Some conceptual and measurement considerations. *Transportation research part A: Policy and practice*, 35(8), 695-719

# References

- Saelens, B. E., & Handy, S. L. (2008). Built environment correlates of walking: a review. *Medicine and science in sports and exercise*, 40(7 Suppl), S550.
- Singleton, P. A. (2013). A theory of travel decision-making with applications for modeling active travel demand. doi:10.15760/etd.1493
- Singleton, P. A., Totten, J. C., Orrego-Oñate, J. P., Schneider, R. J., & Clifton, K. J. (2018). Making strides: state of the practice of pedestrian forecasting in regional travel models. *Transportation research record*, 2672(35), 58-68. Timmermans, H. (Ed.). (2009). *Pedestrian behavior: models, data collection and applications*. Emerald Group Publishing Limited.
- Sugiyama, T., Neuhaus, M., Cole, R., Giles-Corti, B., & Owen, N. (2012). Destination and route attributes associated with adults' walking: a review. *Medicine and science in sports and exercise*, 44(7), 1275-1286.
- Tilt, J. H. (2010). Walking trips to parks: exploring demographic, environmental factors, and preferences for adults with children in the household. *Preventive medicine*, 50, S69-S73.