

# Nexus

Data-Driven Simulation Platform  
for the Planning & Management  
of Multi-Modal Transit Networks



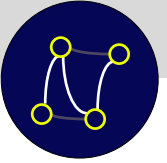
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Dec 6, 2017

# Outline

- Introduction
- Overview of Nexus
- Demo
- Case Studies
- Ongoing Developments





# Introduction

# What is Nexus?

- Nexus is a
  - Software platform combining big data, simulation and other models/analytics to support transit planning and management
  - Research program to develop the Nexus building blocks and various analytics for specific applications



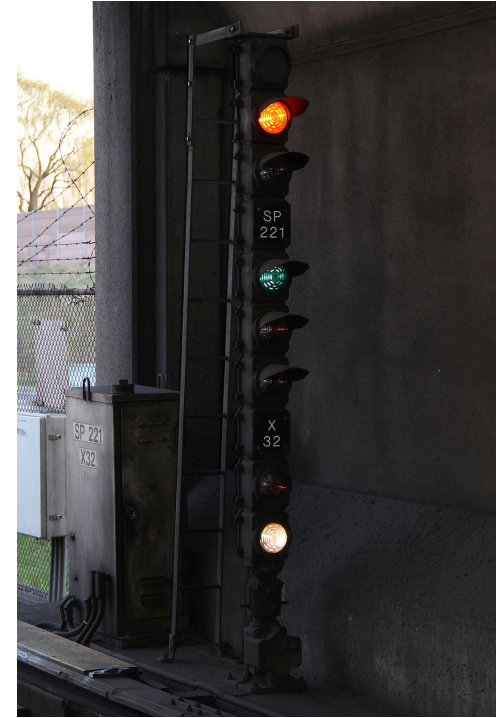


# What can Nexus do?

- Nexus aims at allowing the user to
  - Quickly build or update a transit network model based on GTFS and other big transit data (important for short range planning, scheduling and management)
  - Simulate operations and demand
    - of all transit modes: rail, bus, streetcar and pedestrian
    - at various spatial levels: rail platform, transit hub, route, corridor, network
    - at different resolution levels: microscopic, mesoscopic, hybrid
  - Represent system and user behaviours under normal conditions or scenarios of service disruption and emergencies



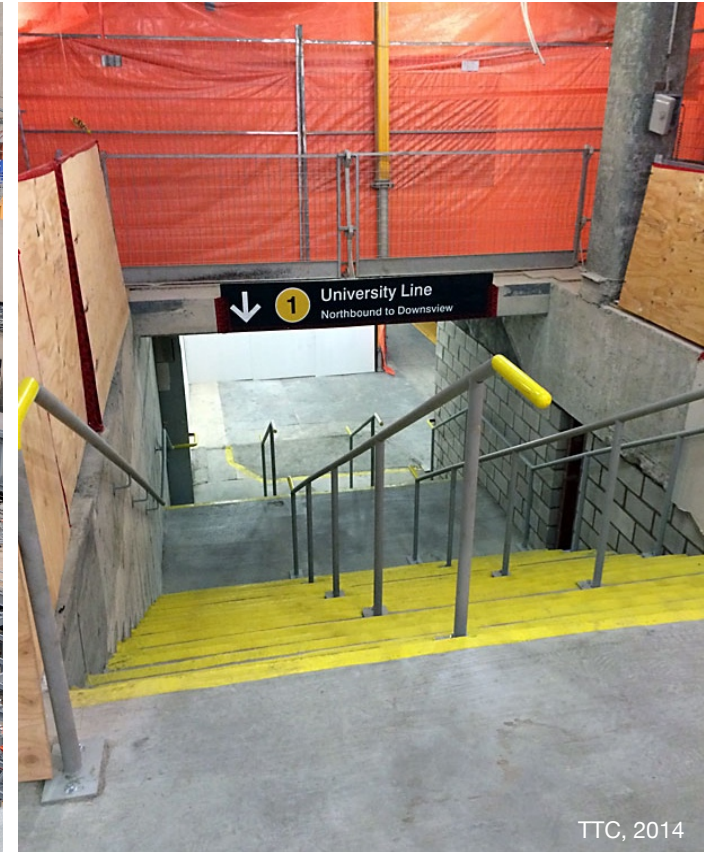
# Capacity/Performance Analysis



- Capacity analysis of YUS under ATC and other operational improvements



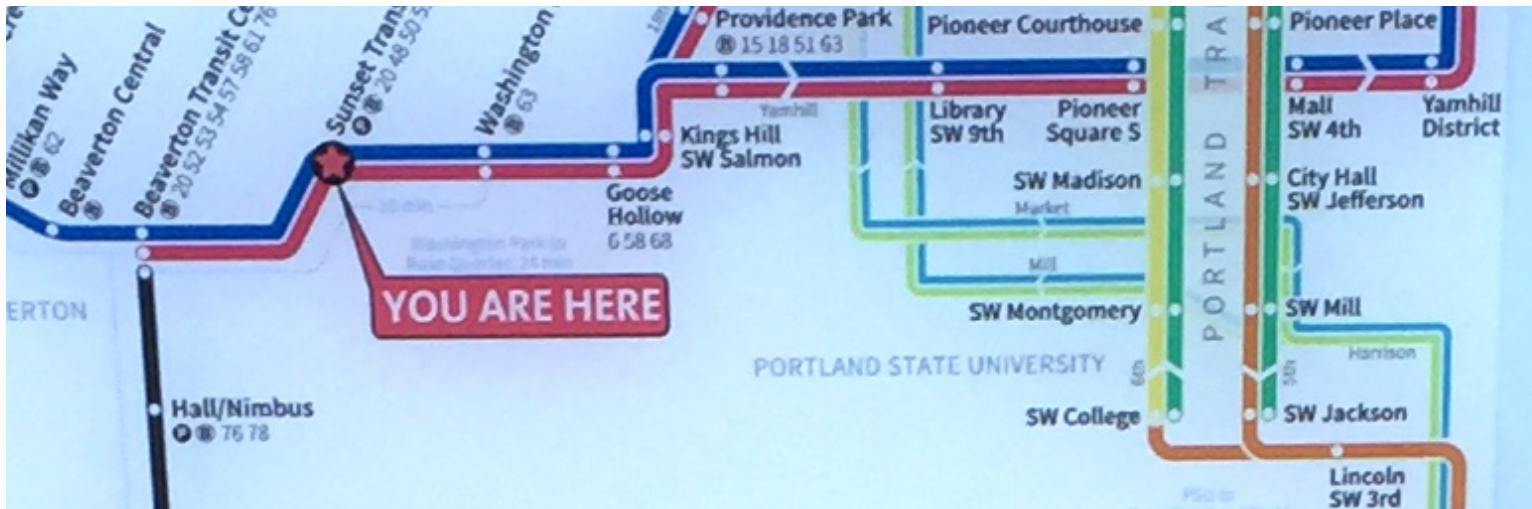
# Capacity and Expansion Studies



- Impact is traditionally tested in isolation – Nexus will offer the ability to test within a high-fidelity, calibrated network



# Integrated Route Planning & Scheduling



**Weekday**

MAX Blue and Red Line to Portland City Center and Gresham or Airport

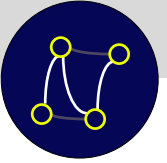
Station	Beaverton Central	Sunset Transit Center	Washington Park	Goose Hollow	Kings Hill	Providence Park	Pioneer Courthouse	Pioneer Square S	Library SW 9th	SW Madison	SW Montgomery	SW College	SW Jackson	SW Mill	City Hall SW Jefferson	Mall SW 4th	Yamhill District	Pioneer Place	Lincoln SW 3rd
Beaverton Central	4:05	4:13	4:22	4:30	4:38	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30
Sunset Transit Center	4:13	4:22	4:30	4:38	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38
Washington Park	4:22	4:30	4:38	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46
Goose Hollow	4:30	4:38	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54
Kings Hill	4:38	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02
Providence Park	4:46	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10
Pioneer Courthouse	4:54	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18
Pioneer Square S	5:02	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26
Library SW 9th	5:10	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34
SW Madison	5:18	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42
SW Montgomery	5:26	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50
SW College	5:34	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58
SW Jackson	5:42	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06
SW Mill	5:50	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14
City Hall SW Jefferson	5:58	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14	8:22
Mall SW 4th	6:06	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14	8:22	8:30
Yamhill District	6:14	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14	8:22	8:30	8:38
Pioneer Place	6:22	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14	8:22	8:30	8:38	8:46
Lincoln SW 3rd	6:30	6:38	6:46	6:54	7:02	7:10	7:18	7:26	7:34	7:42	7:50	7:58	8:06	8:14	8:22	8:30	8:38	8:46	8:54

**Saturday**

# Network Resilience & Response



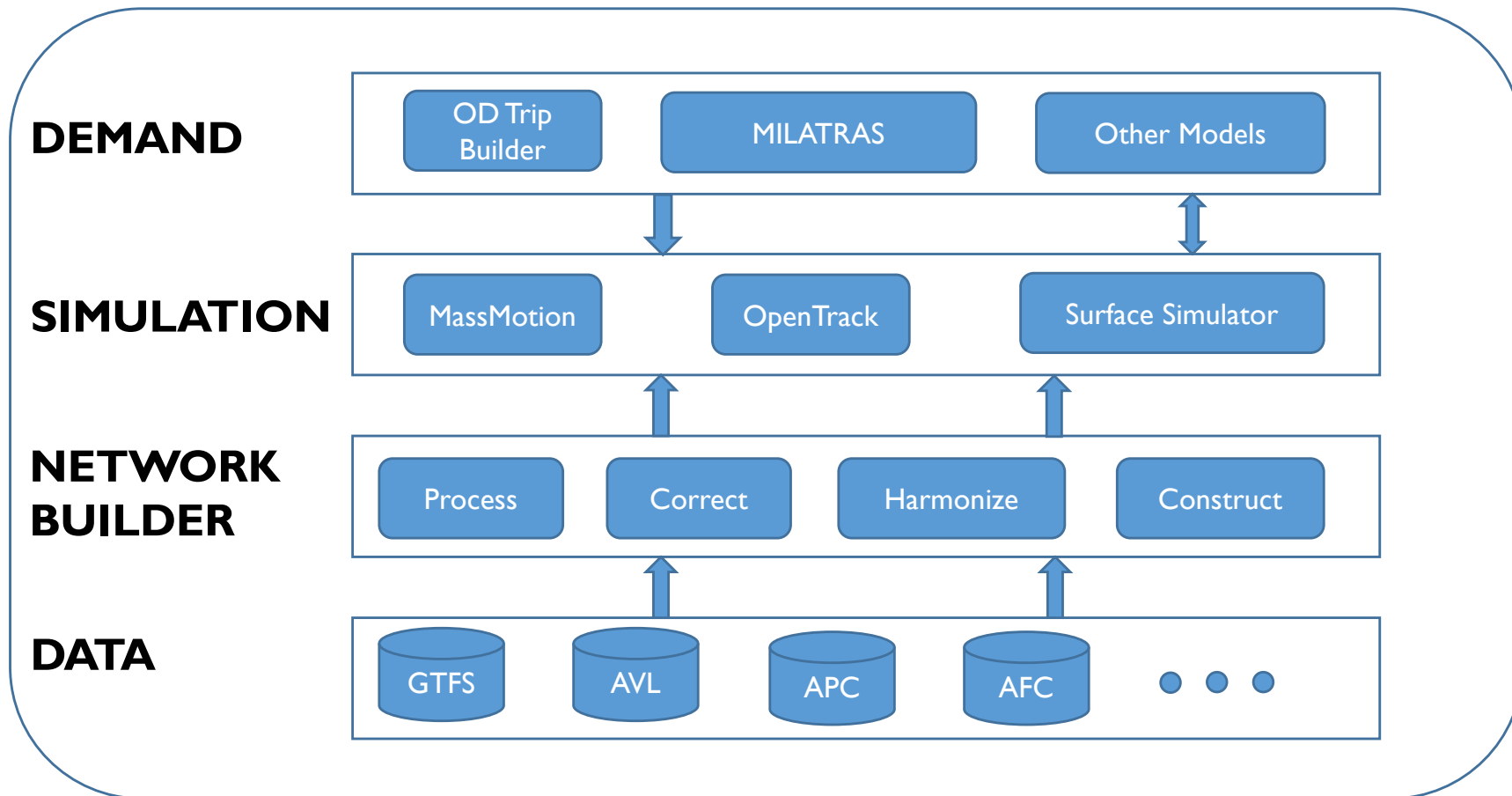
- Current analysis is performed using simplified network models, and can only handle complete removals of network segments
- Nexus will allow for a broader range of examination, including testing of transient disruptions and accounting for passenger behaviour



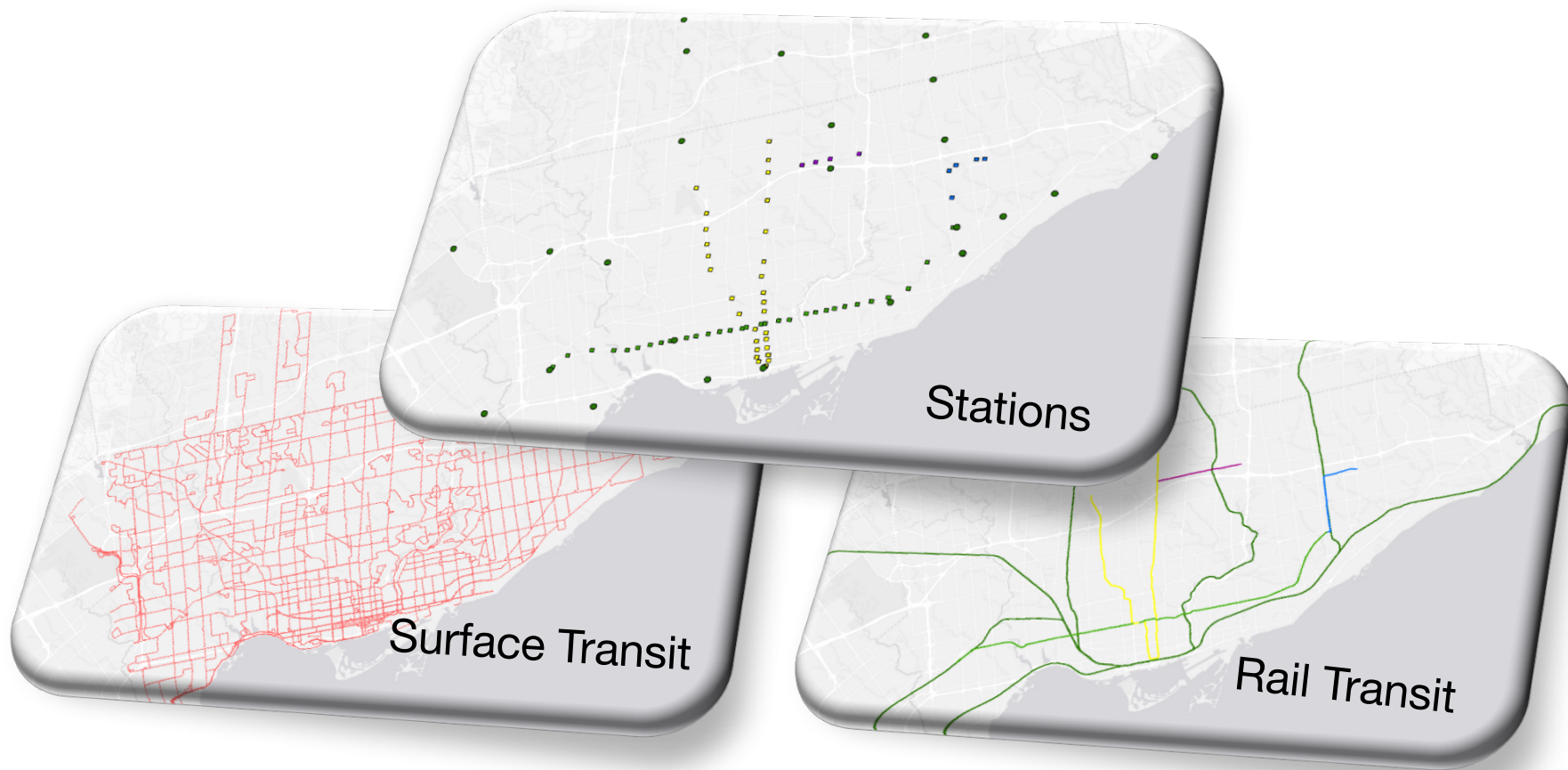
# Overview of Nexus



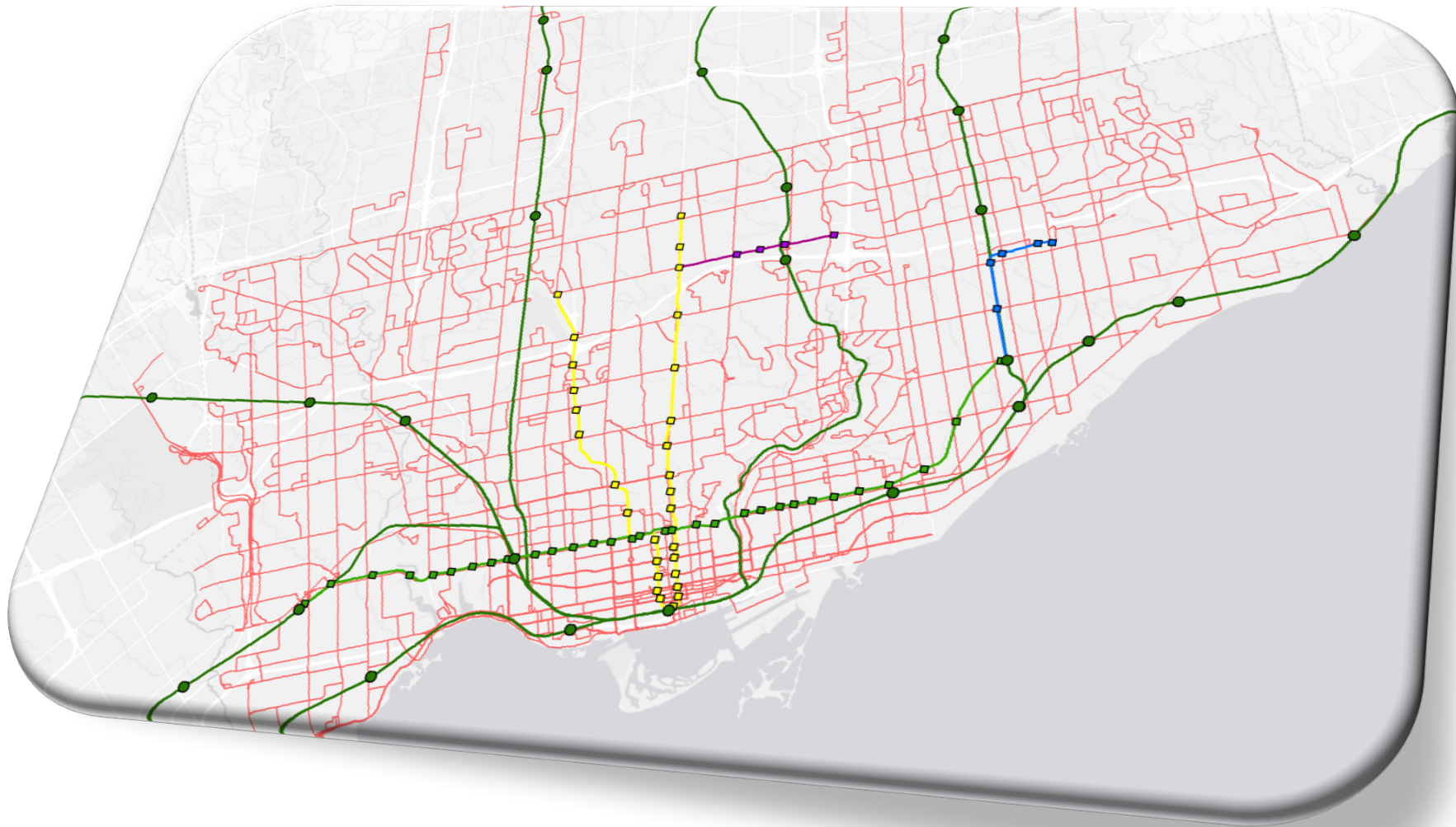
# Nexus Framework



# Description of Nexus

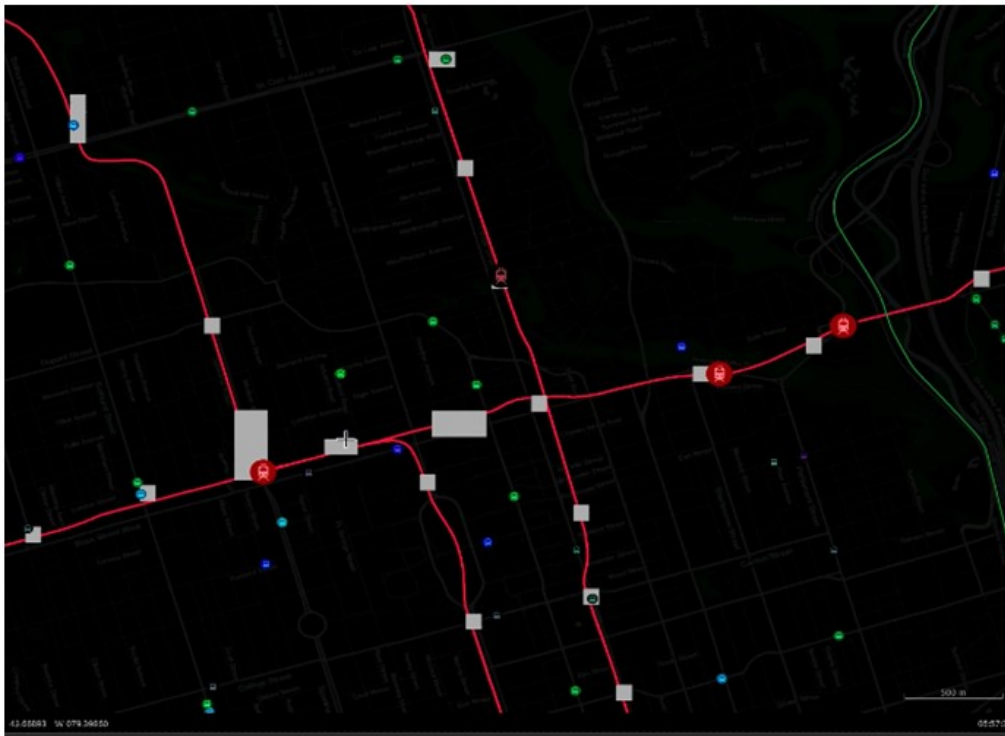


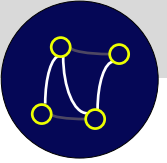
# Description of Nexus



# Nexus Main Features

Live network-view dashboard visualizing key network service performance.





# MILATRAS

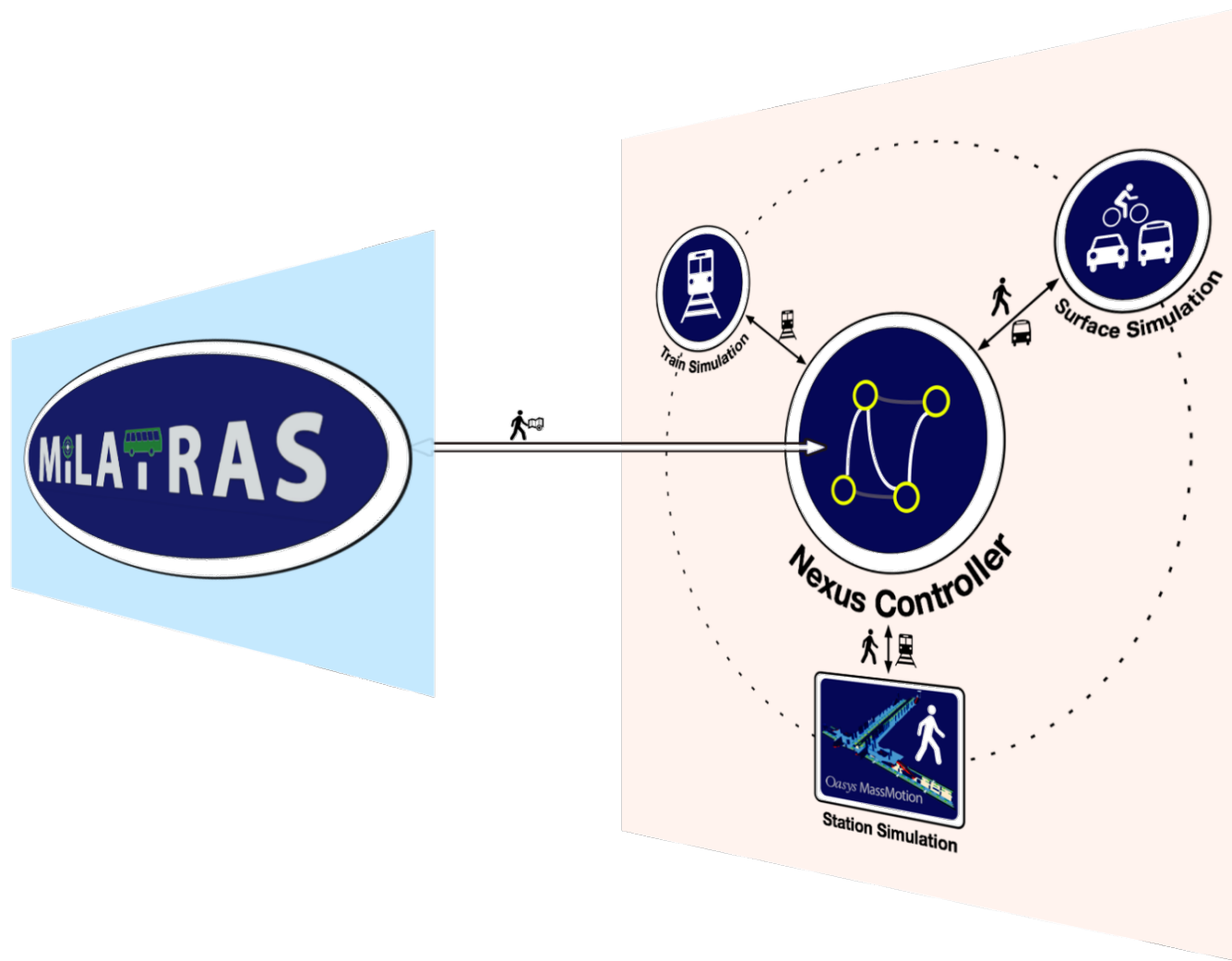
# MILATRAS

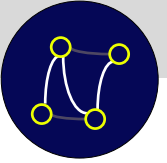
- Multi-agent learning based transit assignment
- Models departure time, stop and path choices simultaneously using the Markovian Decision Process and Reinforcement Learning-based techniques
- Cognitive model to represent the learning process of users as they choose stop, path, departure time
- Agents learn from prior experience, update trip choices with each iteration
- Allows for re-routing midway based on new information



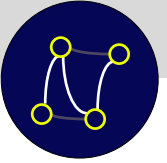


# The *Nexus* Platform





# Demo

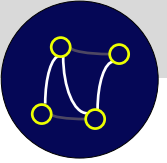


# Nexus Building Blocks: Recent Research Projects

# Recent Research Projects

- Data-driven surface transit simulator
- Models of user behaviour under transit service disruption
- Agency decision-making during/after disruptions
- Models of crowd dynamics





# Data-Driven Mesoscopic Surface Transit Simulator

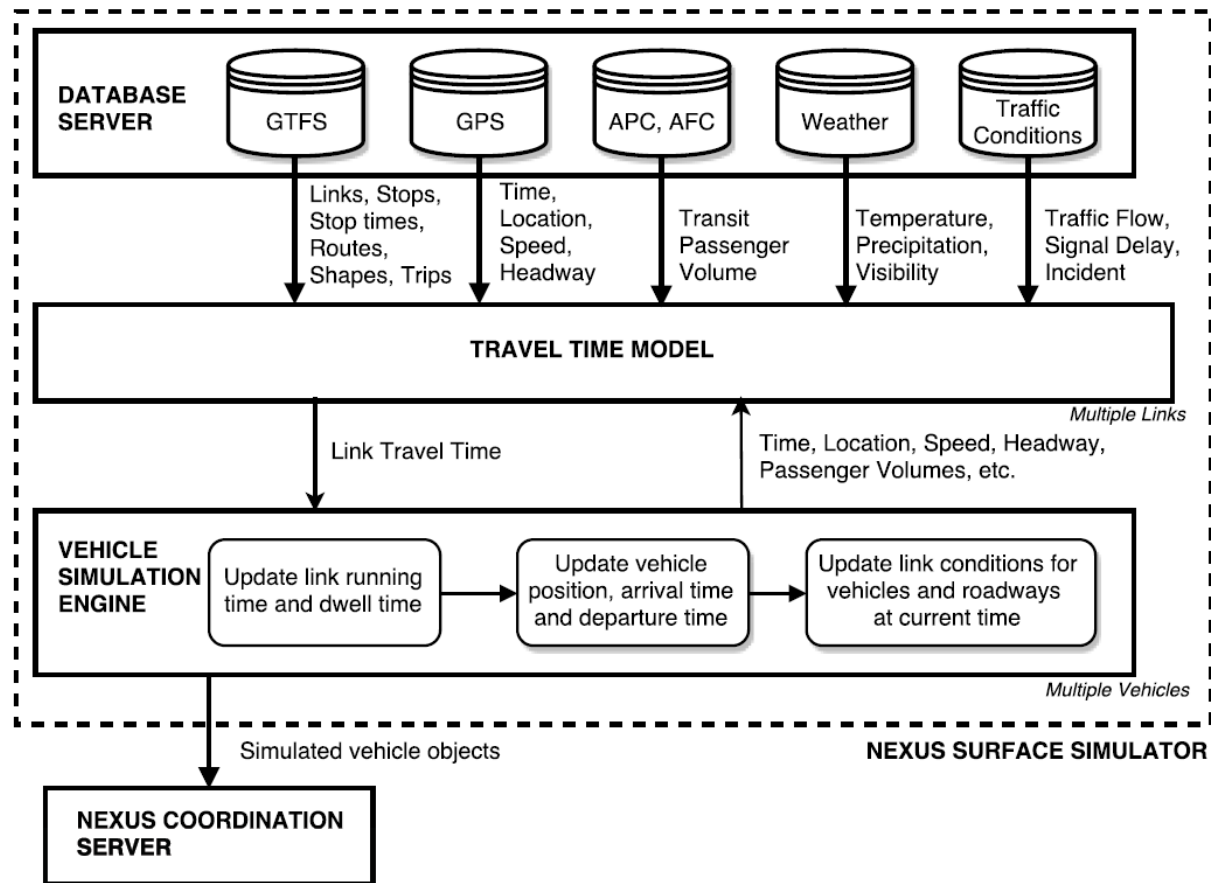
# Background

- Main goal: Represent accurately bus and streetcar on-route travel patterns and arrival/departure patterns at subway stations
- Existing microsimulation methods impose high computational requirements for network-wide simulation
- Instead, travel time models constructed using open data and machine learning algorithms
- TTC surface network used as a case study





# Framework



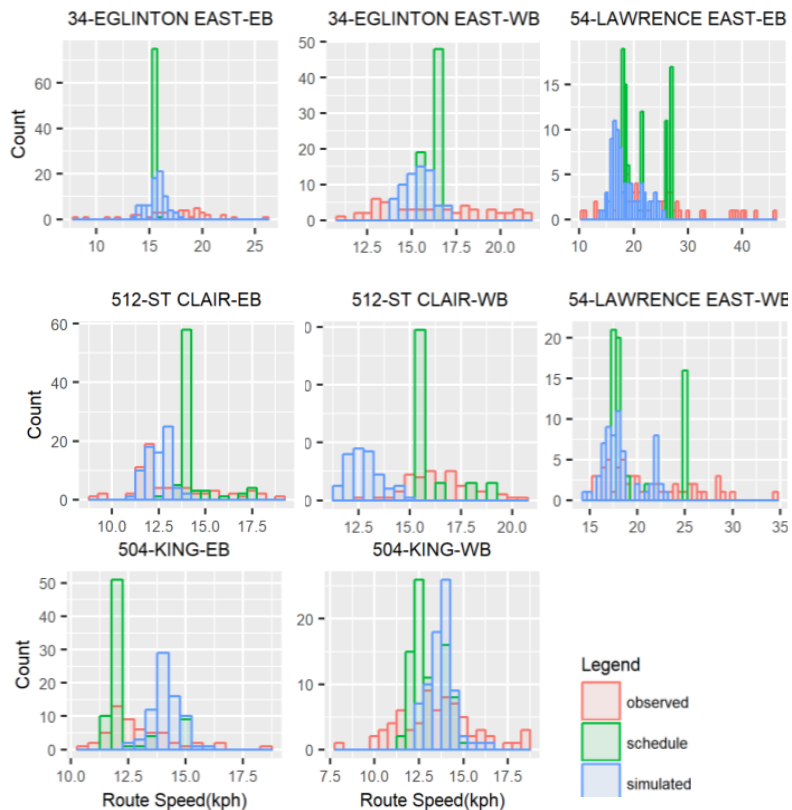
# Methods

- Segment Travel Time Models
  - Multiple Linear Regression (MLR)
  - Support Vector Machine (SVM)
  - Linear Mixed Effect Model (LME)
  - Regression Tree (RT)
  - Random Forest (RF)

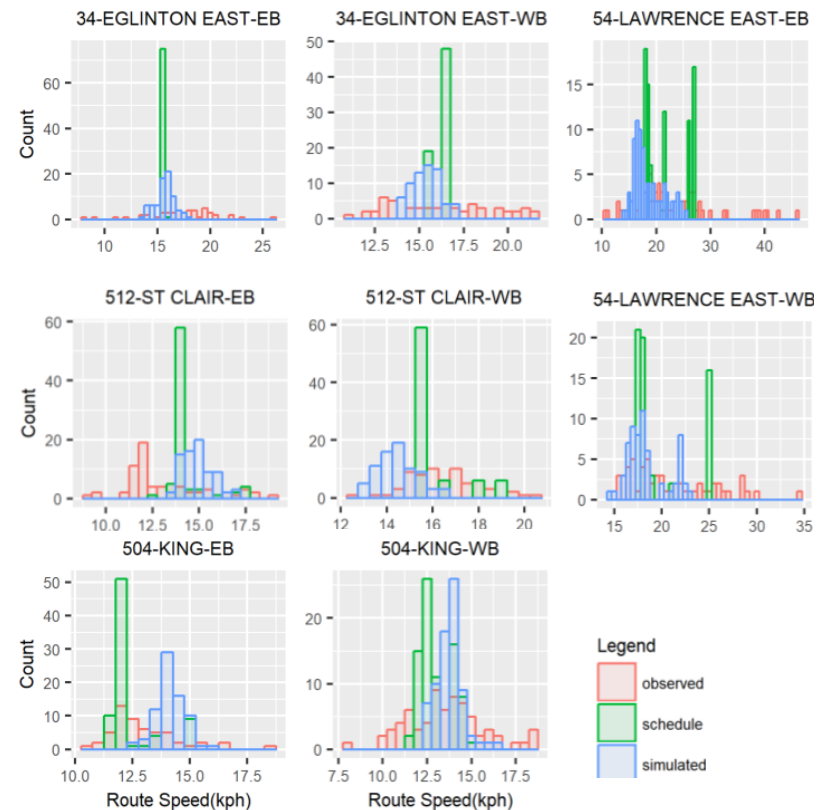


# Model Validations – Route Speeds

## Random forest



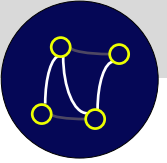
## Linear Mixed Effect



# Findings

- Data-driven transit simulation model
  - replicated instances of vehicle bunching, distribution of dwell times, and stochastic patterns of delays and headways
- Validation results suggests the need to incorporate:
  - Effect of traffic congestion
  - Signal delays
  - Vehicle short-turns





# Disruption Behaviour

# Agency Response During Disruptions

- Survey of Canadian and international transit agencies with rail systems
- Focus: process followed by agencies from disruption detection to response
- Goal: provide understanding to allow for better modelling of decisions made during response





# User Behaviour During Disruptions

- Goal

Understand the mode choice of passengers when faced with different types of rapid transit disruptions



# Survey Scope

- Riders of TTC rapid transit system
- Peak period school and work trips
- Immediate actions: pre-trip and en-route
- Seven available mode options
- Revealed Preference: last experience
- Stated Preference: hypothetical scenarios



You are on your way to your destination and the weather is not comfortable outside with rain, snow or extreme temperature. You are approaching Spadina Station and you have just found out that there is a "Medical Emergency" at St George Station, causing the subway service to be suspended between Spadina Station and Union Station. You have the following mode options shown in the table with the associated attributes. **Please choose your most preferred option to get to your destination from Spadina Station given the situation.**

	Taxi ?	Other TTC Routes ?	Shuttle ?	Walk ?	Wait ?	Cancel Trip ?
Length of Delay (minutes) ?			No Information Provided		50-60	
Cost (CAD)	\$6.7	\$0	\$0	\$0	\$0	\$0
Number of Transfers		0	2		1	0
Access Time (minutes) ?		0	0		0	1
In-vehicle Travel Time (minutes) ?	6	1	15		7	23
Transfer Time (minutes) ?		0	9		4	6
Egress Walking Time (minutes) ?		13	2		2	0
Total Travel Time (minutes) ?	6	14	At least 27	17	64-74	30
Total Travel Distance (KM)				1		
Choice	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>

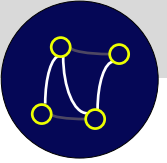
In the future, how likely are you to get to your destination using your selected choice above if you encounter this scenario in real life?

– select an option –

# Findings

- Econometric models developed, including one combining the RP/SP results
- Significant variables: Travel time, cost, frequency of subway trip, trip purpose, subway delay, shuttle bus delay, weather, age, income
- Importance of getting across info on alternative options clear

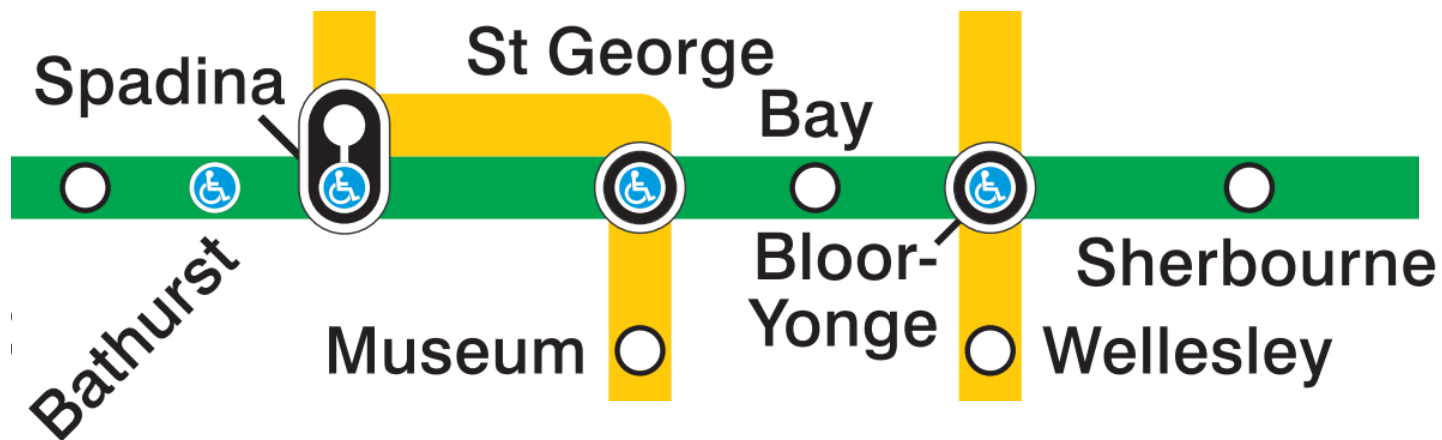




# Pedestrian Modelling Approaches

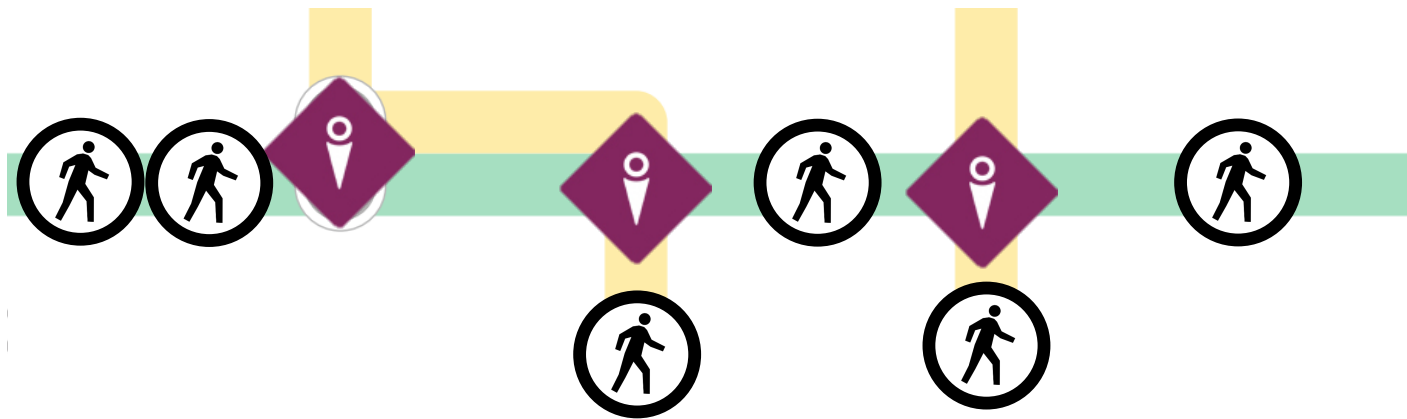
# Context & Motivation

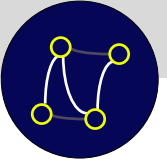
- Currently, MassMotion is the simulator of choice for accurate station models – very demanding in terms of data, computer resources, and time
- Practical solution is to use a simplified station simulator for smaller and less complex facilities when simulating the full network



# Context & Motivation

- Currently, MassMotion is the simulator of choice for accurate station models – very demanding in terms of data, computer resources, and time
- Practical solution is to use a simplified station simulator for smaller and less complex facilities when simulating the full network





# Case Studies



# Union Station Rail Corridor

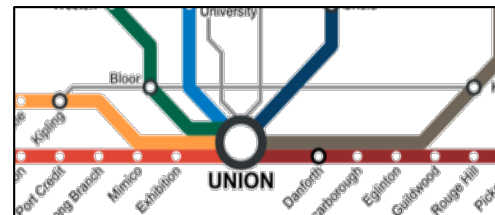
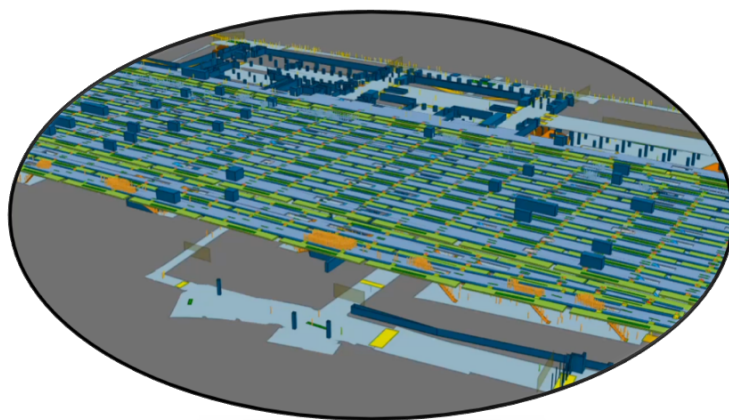
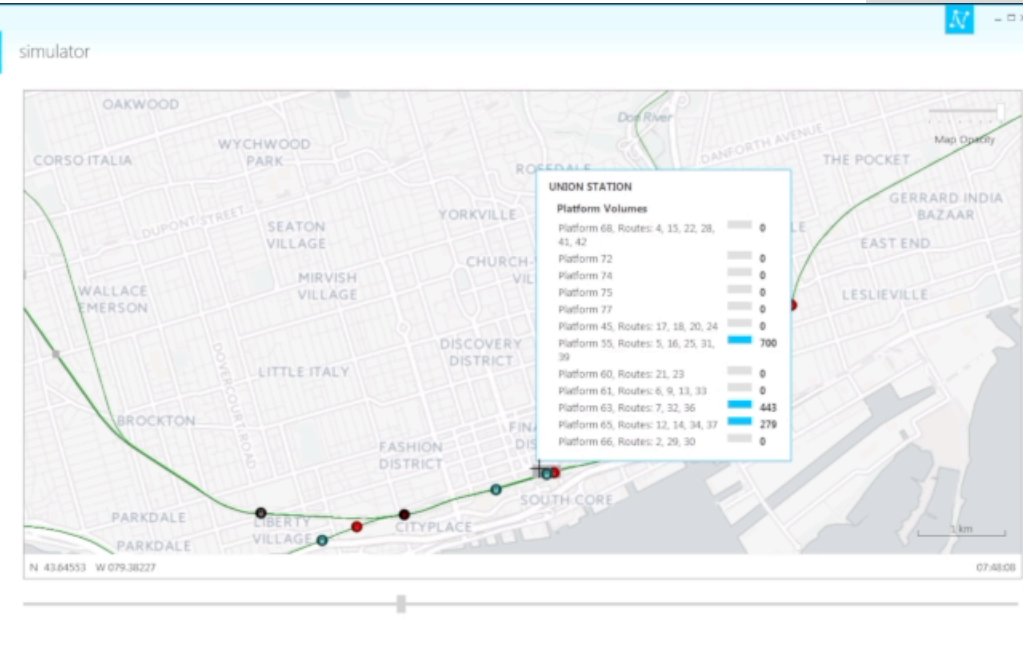
- Increased train frequency can affect platform density, which in turn can result in train delays
- Whether complex infrastructure at rail hubs can support demand growth and system expansion can be difficult to evaluate
- Comprehensive capacity analysis of a complex station area is necessary to identify bottlenecks and maximum throughput



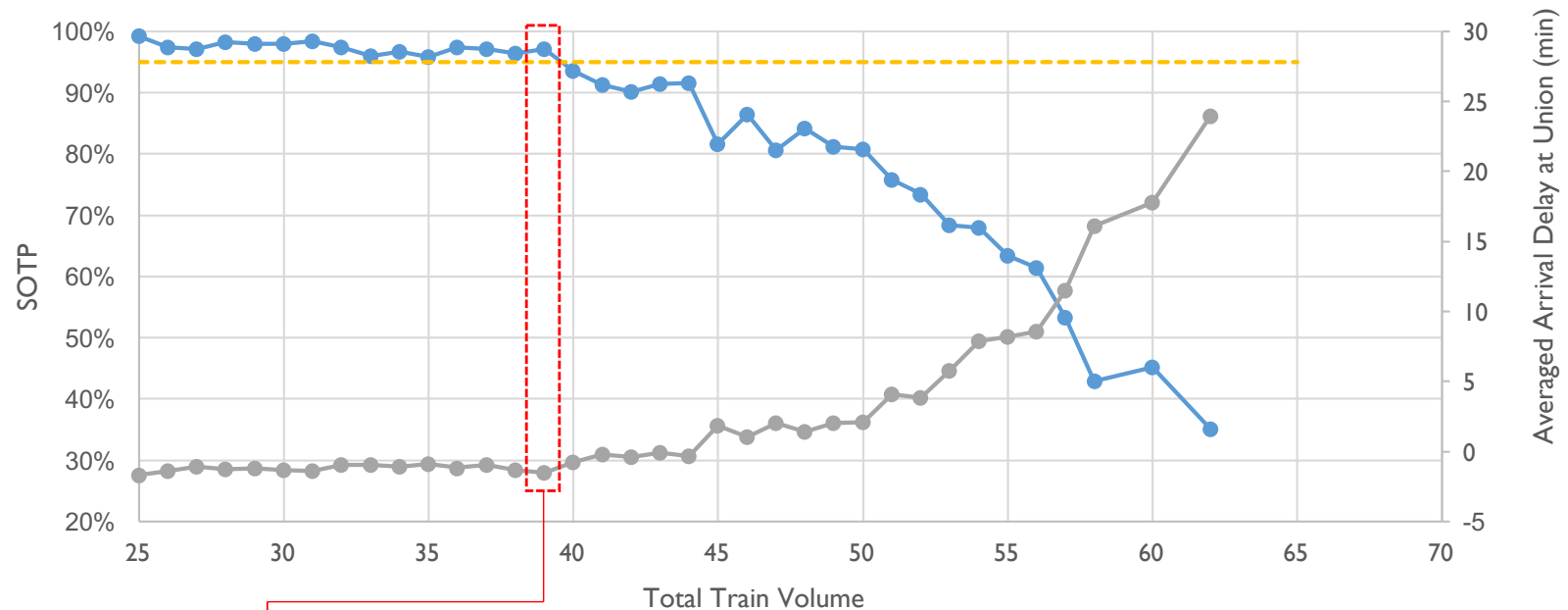
# Union Station Rail Corridor

- OpenTrack was used to model the complex track configuration and signal layout at Union GO Station
- MassMotion was used to model Union Station (developed by Arup); separate model developed for alighting behaviour at the terminal
- Nexus allowed these two models to interact in real-time to examine interplay during dwell

# USRC Case Study



# Trackside Train Capacity



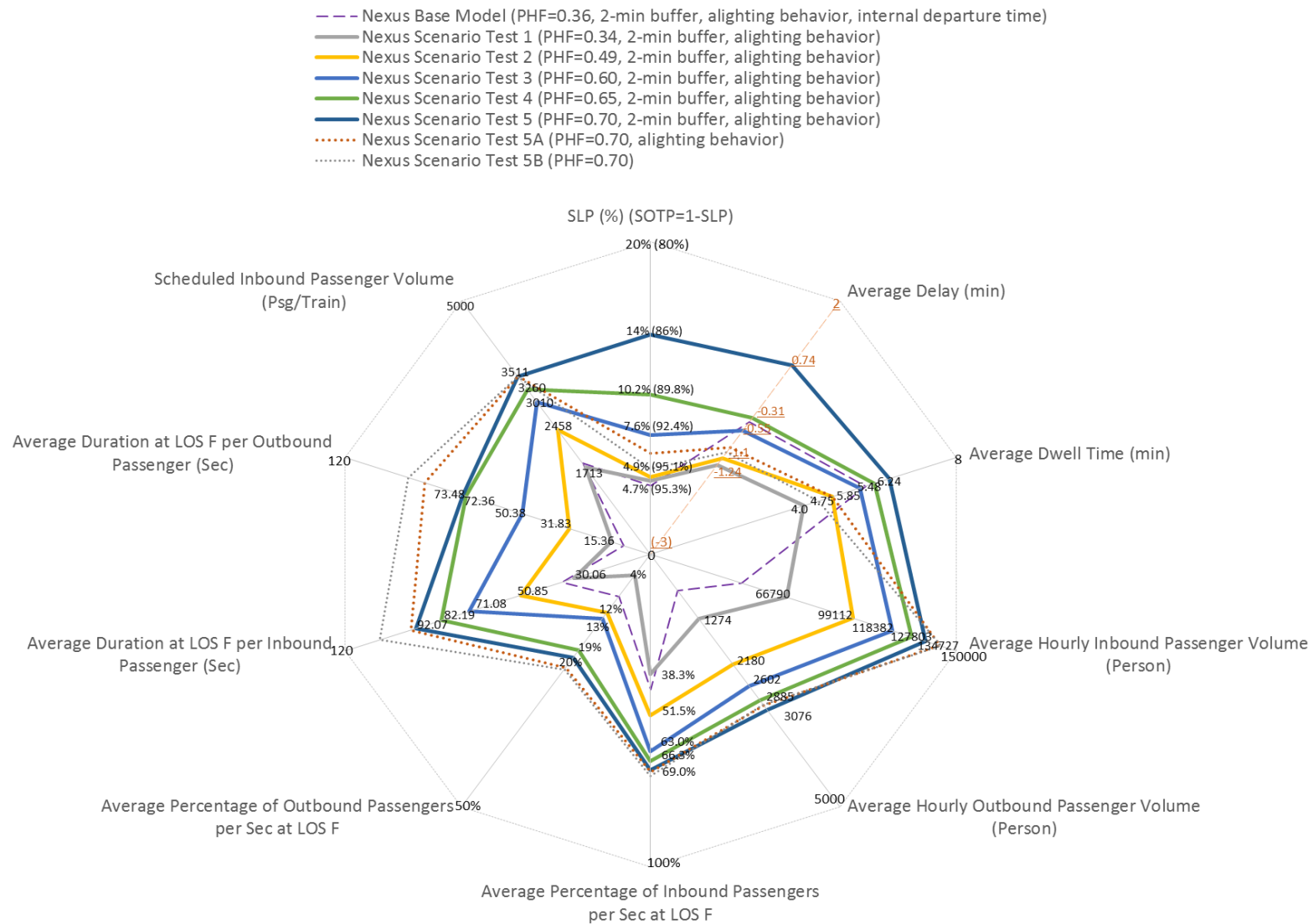
LSW: Lakeshore West Line  
 LSW\_E: Lakeshore West Express  
 LSE: Lakeshore East Line  
 LSE\_E: Lakeshore East Express

KI: Kitchener Line  
 MI: Milton Line  
 BA: Barrie Line  
 RH: Richmond Hill Line  
 ST: Stouffville Line

—●— SOTP    —●— 95% Threshold    —●— Simulated Average Arrival Delay

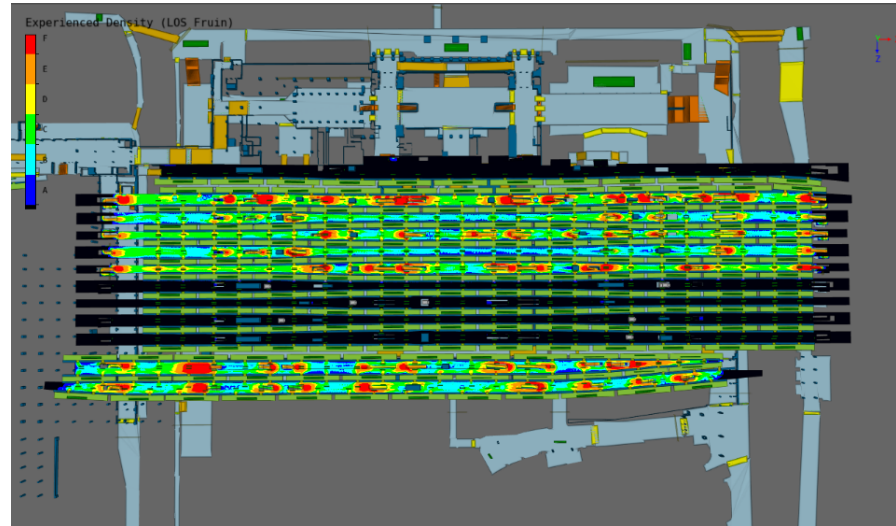


# Scenario Tests Results

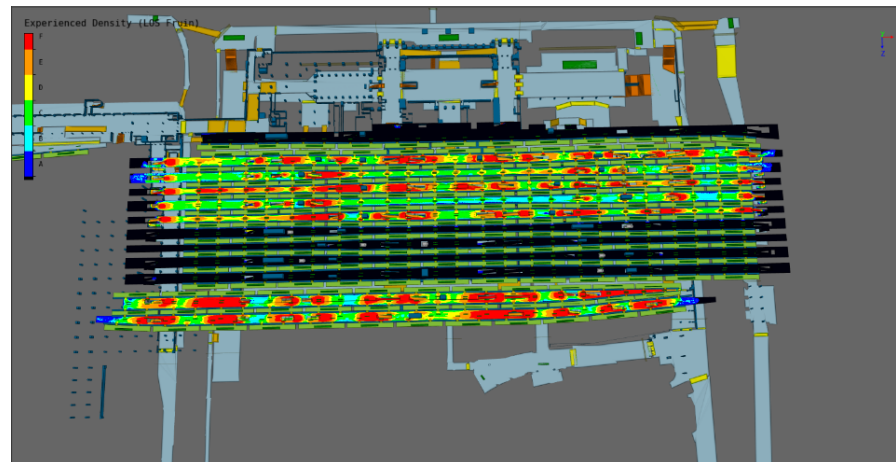


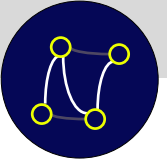
# Scenario Tests Results

Base Model



Scenario 5





# Downtown Relief Line Case Study

# Objective



- Transit planning showcase of Nexus platform
- Show impact of DRL on transit user flow, line and station capacity



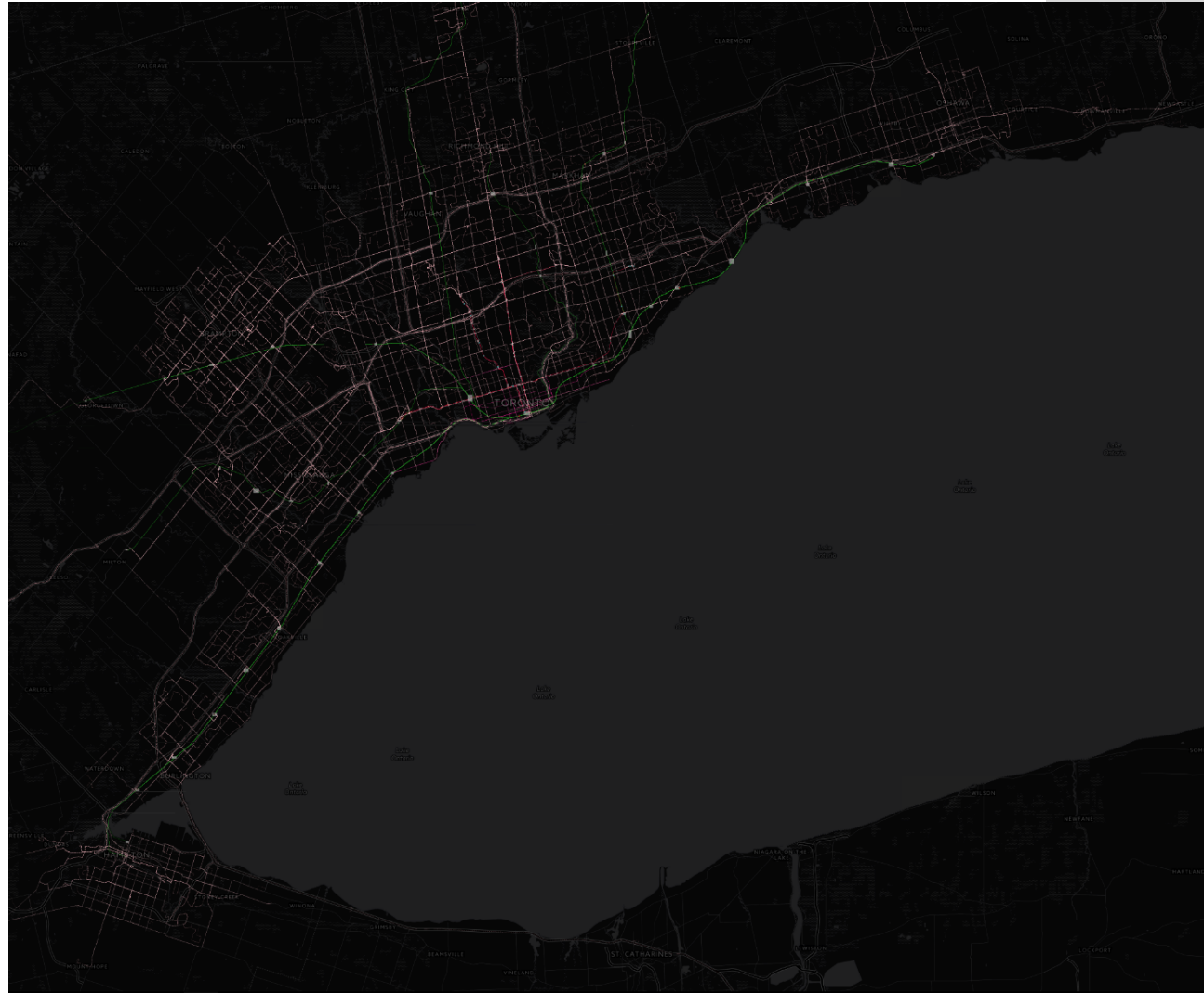
# Scope



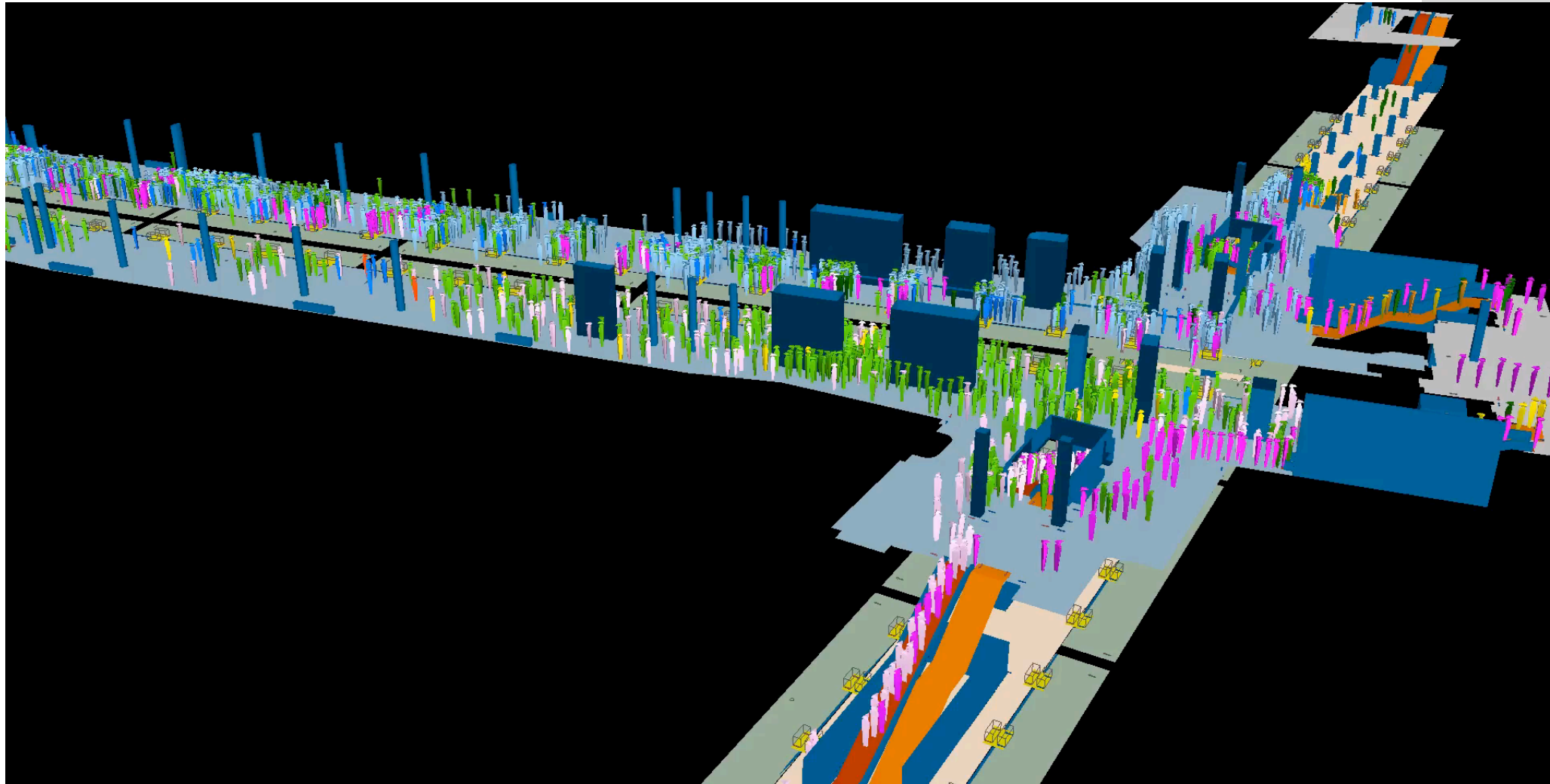
- Detailed model of inner area of DRL zone
  - MassMotion models of most stations
  - OpenTrack model of USRC section and subway lines
- Lower level of detail for rest of GTHA Network

# Scope

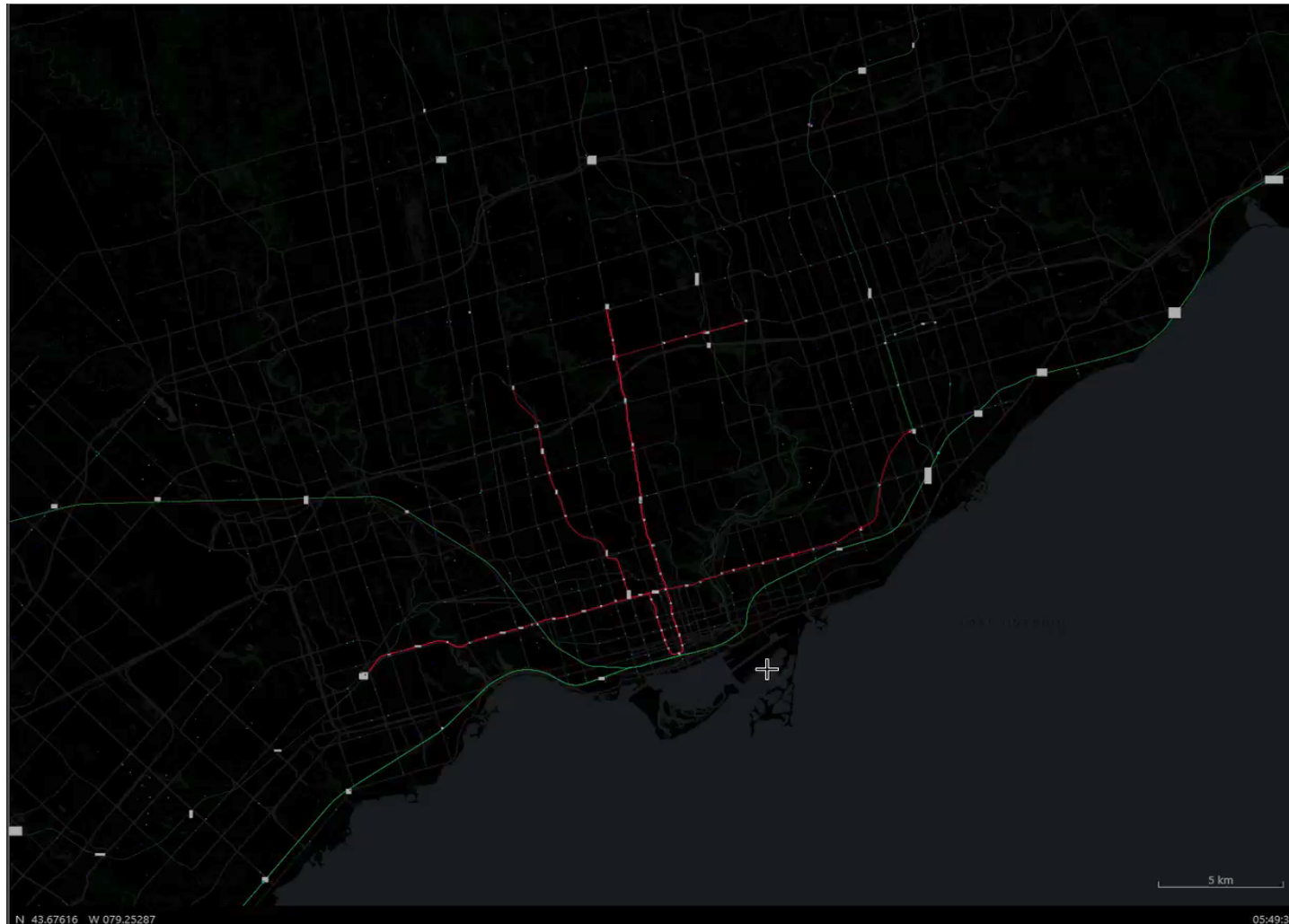
- Greater Toronto Area
- 13 transit agencies
- OpenTrack models of GO and TTC Subway
- Detailed MassMotion models of Union Station and 10 subway stations
- GTFS based surface transit model
- Schedule-based route choice model

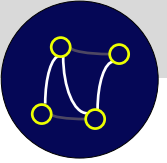


# Yonge/Bloor Station



# GTHA Case Study





# Ongoing Efforts

## ANALYTICS

Performance  
Analytics

Stop and  
Route Design

Bus Bridging  
Decision Support

Scheduling

## DEMAND

OD Trip  
Builder

MILATRAS

Other Models

## SIMULATION

MassMotion

OpenTrack

Surface Simulator

## NETWORK BUILDER

Process

Correct

Harmonize

Construct

## DATA

GTFS

AVL

APC

AFC

...

# Stop & Service Pattern Optimization

- Assessment of changes to an existing route is usually made based on a set of metrics that do not comprehensively evaluate their impact
- Impact assessment tends to disregard implications for timetables and vehicle schedules



# Stop & Service Pattern Optimization

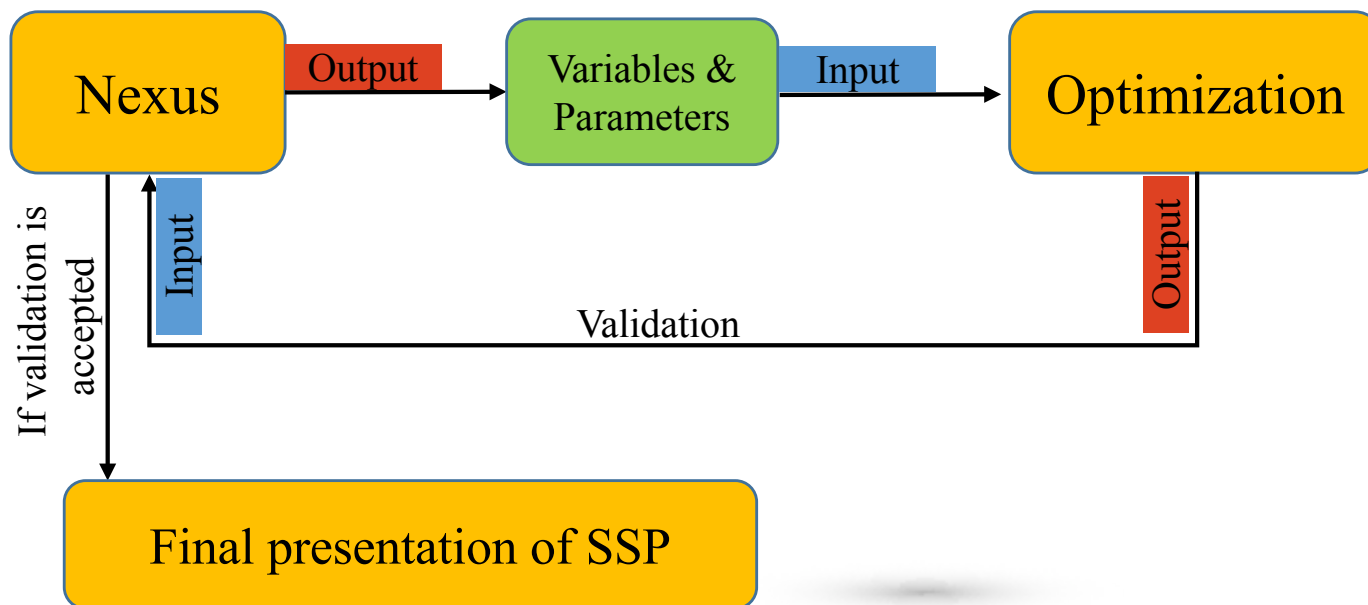
- Goal: Develop a model that can be used in service planning to achieve efficient selection of stop and service patterns (route branches)
- Aims at reducing both passenger travel time and improving system performance
- Can result in savings of the required # of vehicles



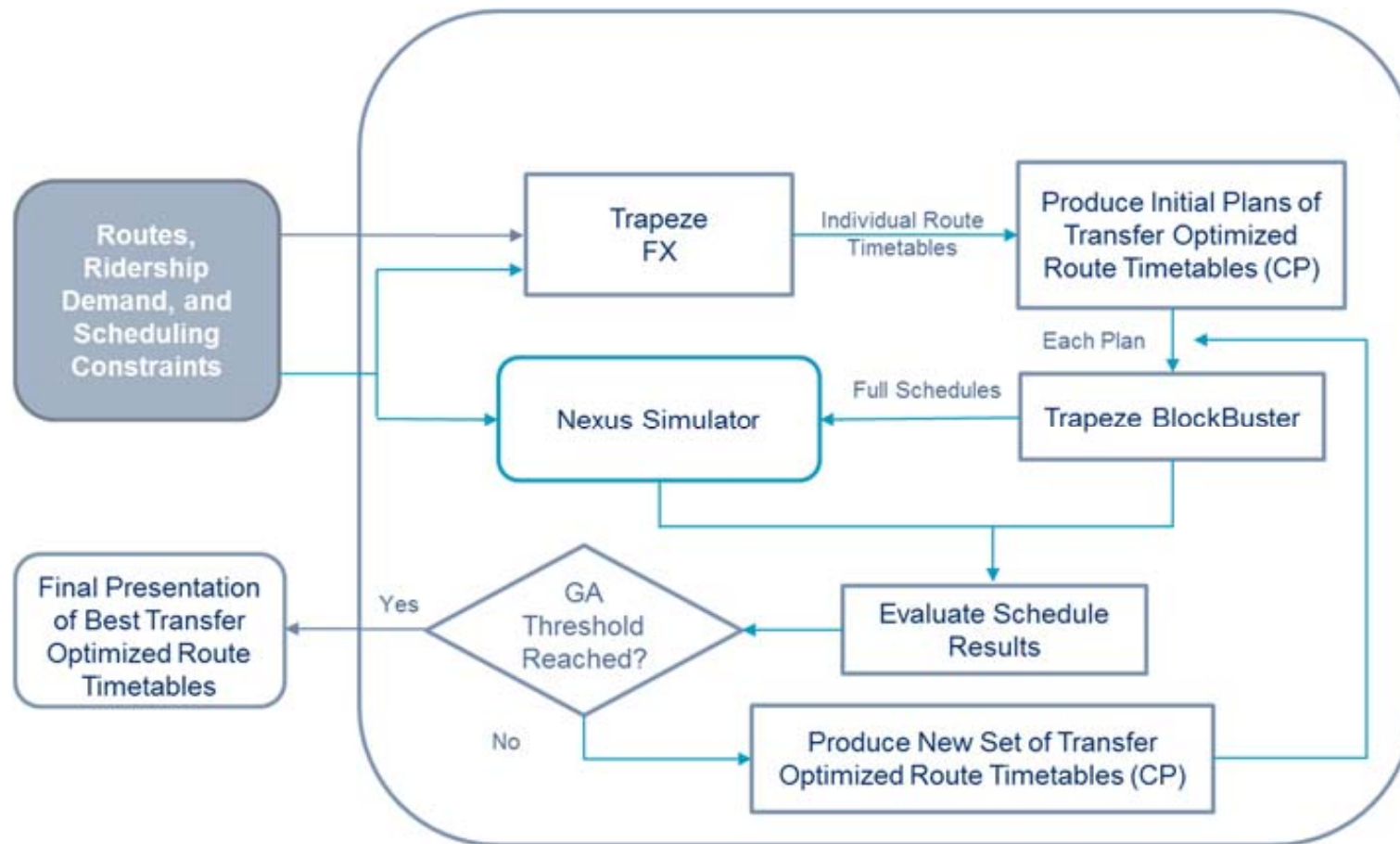


# Stop & Service Pattern Optimization

- Nexus used for network-wide simulation of public transit vehicle and transit user movements
- Allows dynamic modification to service and automation in a cloud environment



# Transfer Optimization



# Bus Bridging Module

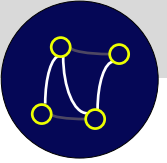
- Motivation: Large # of agencies (including TTC) pull buses from existing routes to serve as shuttles in response to rail service disruptions
- Number of buses based on expected delay, affected stations and time period
- For the TTC, buses are dispatched equally from each of the seven divisions, no clear criteria



# Bus Bridging Module

- Goal: Enhance transit resiliency by expediting return of service to normal after disruptions
- Focused on assisting practice of bus bridging with a tool to help decide how to deploy shuttle buses, using Nexus to calculate and evaluate
- Two phases:
  - Tool to calculate total user delay
  - Optimize bus bridging assignment





# Questions?