Background	Methodological Approach O	Case Study Area	SP-RP Survey

### Flexible Transit for Low-Density Communities

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Background	Methodological Approach O	Case Study Area	SP-RP Survey

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#### Outline



- 2 Methodological Approach
  - Semi-Flexible Service Design

#### 3 Case Study Area

Service Performance



Case Study Area

SP-RP Survey

#### Public Transportation Provision in Low-Density Areas



#### Figure: Comparison of Street Connectivity in urban vs. suburban setting

- Vicious and virtuous cycles of regional transit allocation
- High-cost of demand-responsive transit, taxis
- Demographics: youth travel, silver tsunami, suburbanization of poverty

### Semi-Flexible Systems: Types

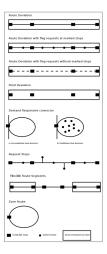


Figure: Flexible Service Types (From Errico et al. [4])

#### Demand-Responsive Transit Services

- Typically door-to-door unless some structure in place (as in previous slide)
- Sometimes a deadline (2 hours before, evening before), particularly for paratransit
- Most research focuses on different service combinations, meaningful objective functions, varying input parameters (time windows, vehicle types)



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# Transportation Network Companies (TNCs) and other emerging options

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- Bridj (Boston) serves origins and destinations that are otherwise not connected, or require many transfers
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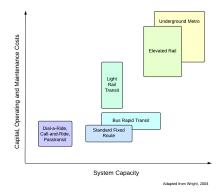
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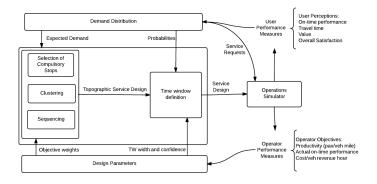
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#### **Research Questions**



- How much structure is needed at what level of demand?
- What level of structure offers benefits to both users and operators, as compared to DRT or fixed-route?

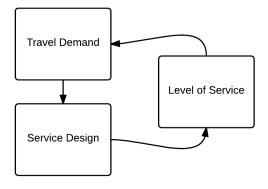
#### **Conceptual Framework**



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Case Study Area

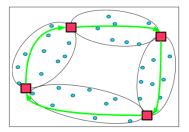
### Simplified Concept



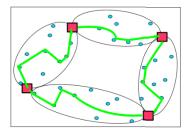
#### Semi-Flexible Service Design

## Existing Method: Single-Line DAS

- Crainic et al. single line, single vehicle on networks with crow-fly distance
- Some interesting practical examples exist, e.g. Flexlinjen in Sweden and Kutsuplus in Finland, but little knowledge of supply-demand interactions
- Contribution: simulate on a real network with multiple vehicles and actual travel demand data



Visiting compulsory stops only



Visiting compulsory and active optional stops

Compulsory stops with time windows [earliest departure, latest arrival]

Optional stops (some activated)



Errico et al. 2011a, 2011b; Crainic et al. 2010

#### Case Study Service Area Information

Census Fact Finder 2012 Estimates:

- Population: 42,000
- Current trip requests: ~5-10 per hour (off-peak/peak)
- <u>Service Area</u>: 16 square miles
- Median income: \$57,330
- Employment:
  - 33,000 over age 16
  - ~22,000 in labor force
  - 7.4% unemployment
  - Lockheed Martin employs 14,000



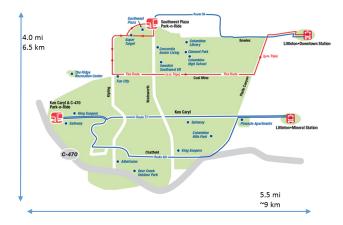




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#### Applied to Existing Service Area



#### Figure: South Jefferson County Call-and-Ride Area

#### **Clustering and Network Analysis**

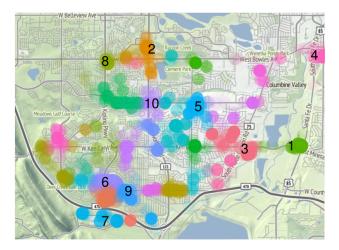


Figure: K-means Clustering with Clusters of highest degree labeled and some

Methodological Approach

Case Study Area

SP-RP Survey

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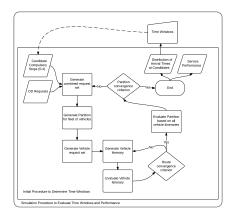
#### Bird's Eye View of Location 6/7



Figure: Bird's Eye View of Kipling Ave. & W Chatfield Ave.

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#### Identifying Time Windows



- Simulate service without time windows (i.e. earliest arrival and latest departure from a "checkpoint"), but with compulsory stops, to determine ideal time for visiting.
- Then add time windows to simulation to assess performance.

#### Example: Joliet IL, 3 vehicles

Compulsory	Stop	Mean	SD	75 %ile	90th %ile
Stops		Arrival	Arrival		
1	1: Joliet Metra Station	6.07	9.99	12.27	18.70
2	1: Joliet Metra Station	11.27	11.31	14.97	25.66
2	2: Twin Oaks Shopping Place	14.42	12.37	22.98	27.31
3	1: Joliet Metra Station	8.62	11.99	15.53	25.80
3	2: Twin Oaks Shopping Place	15.69	12.66	23.93	32.03
3	3: Larkin Village Apartments	6.86	9.26	15.05	15.05
4	1: Joliet Metra Station	13.49	13.49	22.59	29.99
4	2: Twin Oaks Shopping Place	7.34	12.13	10.93	27.31
4	3: Larkin Village Apartments	6.58	8.29	15.05	15.05
4	4: Joliet Mall and Shopping	12.65	13.77	22.35	25.90
	Center				

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### Service Objectives

- Typical DRT service objective function is to maximize slack time in the schedule.
- Here, minimize sum of operator and user cost and impose a large penalty for time window violations
- User travel time vs. operating time
  - Simple test showed including user costs does not increase operator cost much, but an objective minimizing only operator costs resulted in much high user costs.
  - Sensitivity analysis regarding weights for users, operators and violations

Case Study Area

#### Candidates tested: 1, 2, 4 and 6

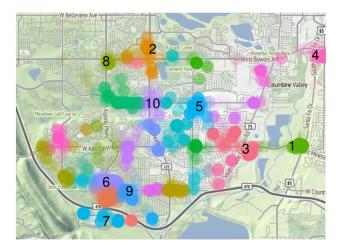


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Case Study Area

SP-RP Survey

#### Assessment of Appropriate Candidate "Checkpoints"

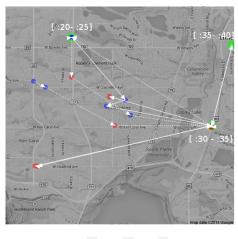




 Figure: South Jefferson County, Colorado: Potential Last mile connector, 3 compulsory stops,

 2 vehicles

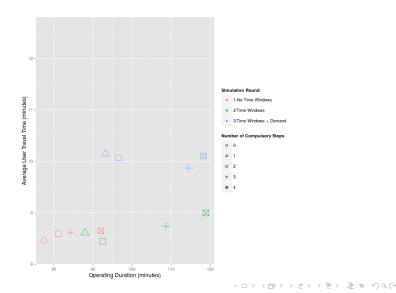
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Methodological Approach

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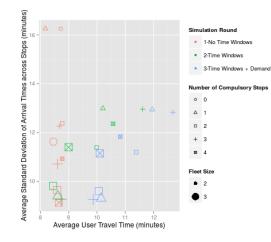
Service Performance

#### User Travel Time vs. Operating Time for Fleet Size = 3



#### Service Performance

#### Improved Reliability (for some cases)



- As you add vehicles and compulsory stops, arrival times at any point in service area are more predictable
- For 3 vehicles, 3 compulsory stops: 1.5 minute reduction in standard deviation of arrival time, 0-1.2 minute increase in average travel time

Background	Methodological Approach O	Case Study Area	SP-RP Survey
Survey Design			

- Convenience sample of Chicago area commuters, 120 responses in September 2014:
  - CMAP newsletter
  - NUTC Facebook and Twitter accounts
  - Personal Facebook and Twitter accounts
- Short-, medium- and long-commute markets to generate different attribute levels for efficient design
  - Maximizes information obtained from each respondent, and choices presented are more realistic
  - Gathered information about actual commute and revealed preference to classify respondents
- Will conduct a winter panel, Feb 1-28
  - 35 respondents from summer offered to take follow-up survey.

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#### Stated Choice Survey

Scenario 1:				
	Transit	Car	Flexible Transit	
In-Vehicle Travel Time	13min	46 min	68 min	
Travel Costs	4USD	14.57 USD**	1USD	
Walk Time	18 min	3 min	3 min	
Wait Time			7 min	
Frequency (Headway)	every 12 minutes		every 20 minutes	
Number of Transfers	2		1	
**Travel cost for car is a combin ***Transit wait time is dependen Choose one of the following ans	t on a number of things includir		cy and when you decide to	leave your house
			e Transit	None

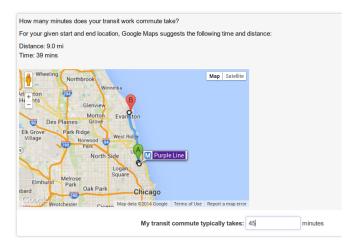
#### Figure: Sample Scenario from Stated Choice Survey

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### Reliability of current travel mode

Survey captured current reliability by asking the user to report their **actual** travel time (ATT) for transit and/or auto, compared to Google API generated result, and rate how confident they were in on-time arrival given their reported **allowed** time:



Planning time index = Allowed/ Free flow; Buffer time index = (Allowed - Reported)/Reported

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#### Initial Findings

#### Preliminary results for flexible mode choice

- Value of...
  - Travel Time: \$19/hour
  - Reliability: \$10/hour
  - Wait Time: \$27± 11/hour
  - Access Time: \$29± 4 /hour
- Age ranged from 22 to 57 years old; 52% males in sample
- 57 of the 120 (48%) respondents have used a TNC such as Uber, Lyft, Sidecar:
  - These respondents were less likely to choose traditional transit in choice scenarios, all else equal, but neither more nor less likely to choose flexible transit over car

#### Initial Findings

### Preliminary results for flexible mode choice (continued)

- Other notable items
  - Divvy significant, car-sharing was not -> Early-adopters, low VOT, active travelers?
  - Whether a passenger conducts activities on-board (leisure reading, working on a laptop, relaxing) increased probability of choosing transit modes



- Respondents' revealed preference tended toward transit use, simple inertia parameter does not explain much variation <sup>1</sup>
  - Stated Choice: 31% Car, 13% flexible transit, 56% traditional transit

<sup>&</sup>lt;sup>1</sup>60% transit, 26% car, 11% walk, 3% bike in sample, versus 45/55 transit/auto split for trips to CBD for all Chicago commuters

#### Initial Findings

## Key Takeaways and Expected Findings

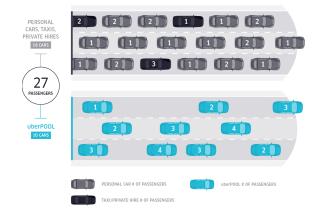
- Extract performance measures from user and operator objectives to determine appropriate service.
- Adding structure to a demand-responsive service may reduce (perceived) barriers to entry for people accustomed to a traditional transit service
  - Current transit users seem to prefer a timetable, had some wariness of (hypothetical) flexible mode
  - Structure can enhance reliability, but some flexibility will mean less walking in sparse areas
- Expect to identify thresholds for acceptable frequency of service in low-density areas
- **On-going** sensitivity analysis related to:
  - fleet size and capacity
  - objective function defined by user cost trade-offs for operator and impact on demand
  - demand fluctuation: how robust is service design?

#### Initial Findings

#### References

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- [2] Crainic, T. G., Errico, F., Malucelli, F., and Nonato, M. (2010). Designing the master schedule for demand-adaptive transit systems. *Annals of Operations Research*, 194(1):151–166.
- [3] Errico, F., Crainic, T. G., Malucelli, F., and Nonato, M. (2011a). The design problem for Single-Line demand- adaptive transit systems. Technical Report 2011-65.
- [4] Errico, F., Crainic, T. G., Malucelli, F., and Nonato, M. (2011b). A unifying framework and review of Semi-Flexible transit systems. Technical Report 2011-64, CIRRELT.
- [5] Errico, F., Crainic, T. G., Malucelli, F., and Nonato, M. (2012). A benders decomposition approach for the symmetric TSP with generalized latency. Technical Report 2012-78, CIRRELT.
- [6] Errico, F., Crainic, T. G., Malucelli, F., and Nonato, M. (2013). A survey on planning semi-flexible transit systems: Methodological issues and a unifying framework. *Transportation Research Part C: Emerging Technologies*, 36:324–338.

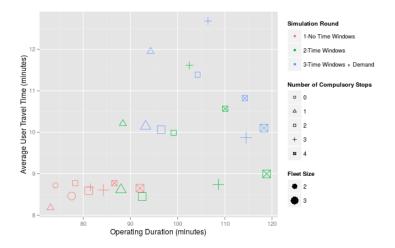
## A Comment on Emerging and Existing Flexible Modes



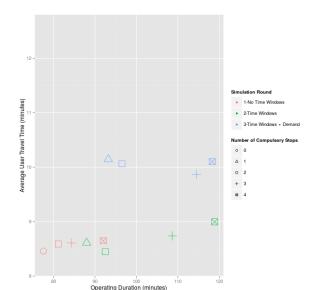
- How will cities and agencies work with these platforms to improve service, potentially with their existing rolling stock?
- Will these services be low-cost enough to serve current captive markets?
- What is the role of car-sharing (and autonomous shared vehicles) in filling this gap?

### User Travel Time vs. Operator Cost for Fleet Size 2 & 3

(Where user travel time has same penalty as operating time in objective function)

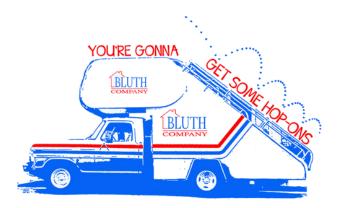


#### User Travel Time vs. Operator Cost for Fleet Size = 3



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#### Watch out for hop-ons



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#### Passenger Delay when Random Demand is Introduced

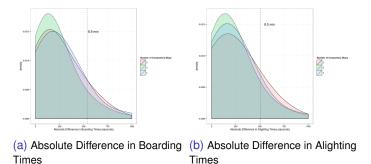
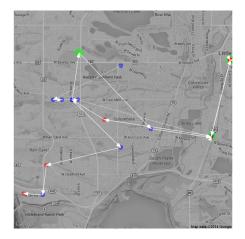


Figure: Difference in Boarding and Alighting times after Additional Demand at Compulsory Stops with Time Windows

## Assessment of Appropriate Candidate "Checkpoints"-Another example

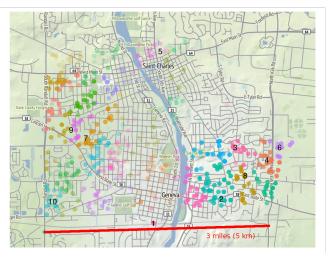


Request Type 

Compulsory 
Destination 
Origin

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# Flexible Technique: St. Charles, Illinois, USA (Chicago metro area)



#### Flexible Technique: Joliet, Illinois, USA (Chicago metro area)

