## Outline

- Real Time Control Strategies for Rail Transit
- Prior Research
- Shen/Wilson Model Formulation
- Model Application and Results
- Implementation Issues
- Conclusions
- Follow-on Subjects
- Final Exam


## Prior Research

## O'Dell and Wilson (1999):

- Formulated and solved to optimality holding and (restricted) short-turning models
- Active control strategies resulted in significant passenger wait time savings
- Train impact set need not be large and can be restricted to trains ahead of the blockage
- Hold-at-first station strategy is recommended
- Short-turning is most effective where:
-- blockage is long relative to short-turn time
-- number of stations outside short-turn loop is small
- Solution time is typically 30 seconds or less


## Prior Research

## Limitations:

- only specified short-turns included in solution
- expressing not included
- objective function ignored in-vehicle delay time
- did not recognize the stochastic nature of disruption duration


## Model Formulation

## Key Features:

- station specific parameters: passenger arrival rates, alighting fractions, minimum safe headways
- station dwell time a linear function of passengers boarding, alighting and crowding
- train order is variable
- train capacity constraint


## Simplifications:

- predictable disruption length
- passenger flows estimated from historical data
- system is modelled as deterministic
- strategies selected to produce minimum inter-station travel times.


## Shen/Wilson Model Formulation*

## Decision variables:

- departure time of train $i$ from station $k$
- short-turning binary variables
- expressing binary variables

Objective function:

- minimization of weighted sum of passenger waiting time at stations and in-vehicle delay


## Control set:

- set of trains and stations where control actions may be applied, typically:
-- 2-4 holding candidates ahead of the disruption
-- 1-2 expressing candidates behind the disruption
-- 1-3 short-turning candidates
*Reference: Shen, S. and N.H.M. Wilson, "Optimal Integrated Real-Time Disruption Control Model for Rail Transit Systems", Computer-Aided Scheduling of Public Transport, Lecture Notes in Economics and Mathematical

Systems \#505 (S. Voss and J. Daduna, co-editors), pp. 335-364, April 2001.
10 December 2003

## Model Formulation

## Impact set:

- consider a finite set of trains and stations over which to evaluate the impacts of the control strategies

Constraints include:

- train running time and minimum safe separation
- train dwell time = f (passengers boarding and alighting)
- passenger loads and train capacity


## Model Structure:

- mixed integer program


## Model Simplifications

A. Piece-wise linear approximation of quadratic terms in objective function:

- waiting time
- holding time
B. Simplification of non-separable terms
- additional waiting time for passengers left behind:
-- approximate headway by minimum headway
- in-vehicle delay:
-- approximate passengers on train by normal passenger load at that time and point on route


## Model Applications

## MBTA Red Line Characteristics:

- 23 stations (including 3 terminals)
- 27 six-car trains in A.M. peak
- 3.4 minute trunk headways ( 6 and 8 minutes on branches)
- 30,000 passengers in peak hour


## Simplified system:

- single loop
- scaled passenger arrival rates and minimum safe separation on trunk portion of line
- 6-minute headways


## Scenario Description



## Comparison of Strategy Effectiveness for 10-Minute Disruption Scenario

| Control <br> Strategy | Mean Platform <br> Waiting Time <br> $(\mathrm{min})$ | Mean In- <br> Vehicle Delay <br> $(\mathrm{min})$ | Mean Weighted <br> Waiting Time <br> $(\mathrm{min})$ | Saving <br> over NC |
| :---: | :---: | :---: | :---: | :---: |
| ND | 3.00 | 0.00 | 3.00 | - |
| NC | 5.70 | 0.15 | 5.78 | - |
| H | 4.53 | 1.39 | 5.23 | $10 \%$ |
| HE | 4.59 | 0.83 | 5.00 | $13 \%$ |
| HET | 3.55 | 0.39 | 3.74 | $35 \%$ |

ND = No Disruption
HE = Holding and Expressing Only

NC = No Control H = Holding Only
HET = Holding, Expressing, and Short-Turning

## Comparison of Strategy Effectiveness for 20-Minute Disruption Scenario

| Control <br> Strategy | Mean Platform <br> Waiting Time <br> $(\mathrm{min})$ | Mean In- <br> vehicle Delay <br> $(\mathrm{min})$ | Mean Weighted <br> Waiting Time <br> $(\mathrm{min})$ | Saving <br> over NC |
| :---: | :---: | :---: | :---: | :---: |
| NC | 9.11 | 0.19 | 9.20 | - |
| H | 6.57 | 1.98 | 7.56 | $18 \%$ |
| HE | 6.23 | 1.75 | 7.10 | $23 \%$ |
| HET | 3.79 | 0.35 | 3.97 | $57 \%$ |

NC = No Control H = Holding Only HE = Holding and Expressing Only HET = Holding, Expressing, and Short-Turning

## Sensitivity Analysis: Effect of Under-estimating Disruption Duration

| Blockage Duration <br> Estimate | 15 Minutes |  |  | 10 Minutes |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| Control Schemes | H | HE | HET | H | HE | HET |
| Mean Weighted <br> Waiting Time (min) | 6.34 | 5.97 | 3.77 | 6.37 | 6.21 | 4.31 |
| Increase due to <br> Inaccurate Estimate |  |  |  | $+0.5 \%$ | $+4.0 \%$ | $+14.3 \%$ |

H = Holding Only HE = Holding and Expressing Only
HET = Holding, Expressing, and Short-Turning

## Sensitivity Analysis: Effect of Over-estimating the Disruption Duration

| Blockage Duration <br> Estimate | 5 Minutes | 10 Minutes |  |
| :--- | :---: | :---: | :---: |
| Control Schemes | H, HE, HET | H \& HE | HET |
| Total Weighted Waiting <br> Time (min) | 14875 | 14888 | 14968 |
| Increase due to Wrong <br> Estimate |  | - | $+0.6 \%$ |

$$
\mathrm{H}=\text { Holding Only } \quad \mathrm{HE}=\text { Holding and Expressing Only }
$$

HET = Holding, Expressing, and Short-Turning

## Solution Times

- Micron P-II, $300 \mathrm{MHz}, 64 \mathrm{MB}$ RAM computer
- C-PLEX v. 4.0

| Solution Times with and without Expressing (in seconds) |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: |
| Scenario | H | HE | HET | HT |
| 10-Minute | 2.91 | 5.60 | 11.28 | 12.06 |
| 20-Minute | 12.10 | 155.01 | 68.32 | 24.72 |

H = Holding Only HE = Holding and Expressing Only
HET = Holding, Expressing, and Short-Turning HT = Holding and Short-Turning Only

## Conclusions

- Holding provides 10-18\% passenger waiting time savings over the no-control case
- Expressing provides little incremental benefit over holding
- Short-turning combined with holding can provide substantial savings: in the case analyzed, 35-57\% savings.
- Holding is not sensitive to errors in estimating disruption deviation, but short-turning can be
- Solution time is typically less than 30 seconds


## Future Directions

- Develop robust disruption control models recognizing key stochastic elements such as disruption duration, running time, dwell time, and passenger loads
- Develop fast routine control models incorporating control strategies such as speed variation and dwell time variation


## Follow-on Subjects

- Optimization
- 15.057 Systems Optimization
- 15.093 Optimization Methods
- 15.094 Systems Optimization: Models and Computation
- 15.081 Introduction to Mathematical Programming
- 15.082 Network Optimization
- 15.083 Combinatorial Optimization
- 15.084 Nonlinear Programming
- Transportation and Logistics/Optimization
- 1.206J/16.77 J Airline Schedule Planning
- 1.258J/11.541 J/ Public Transportation Service and ESD.226J Operations Planning
- 1.270J/ESD.270J Logistics and Supply Chain Management


## Final Exam

- Tuesday, December 16, Room 4-149, 9 AM - noon
- $18.5 \times 11^{\prime \prime}$ page of notes, both sides
- Focus on modeling and basics of optimization

