## Real-Time Control Strategies for Rail Transit

## Outline:

- Problem Description and Motivation
- Model Formulation
- Model Application and Results
- Implementation Issues
- Conclusions


## Problem Context

- High frequency urban rail service (e.g. headways of 2-10 minutes)
- passengers arrive randomly
- service regularity is a key goal
$-E(W T)=\frac{E(H)}{2}\left[1+\operatorname{cov}(H)^{2}\right]$
- Branching route structure
- Central real-time train location information and dispatch capability


## Three Levels of Control Problems

## Routine disturbances - several minutes' deviation from schedule

Control Strategies:

- speed adjustment
- dwell time adjustment (selective holding) terminal recovery

Short-term disruptions: 5-30 minute blockages on the line

Longer-term disruptions - greater than 30 minute blockages
Control Strategies:

- single-track reverse direction operations
- replacement bus service around blockage


## Disruption Response Strategies



## Problem Description

- Overall Objective:
-- Develop a real-time decision support system to determine control strategies to recover from disruptions
- Specific Objective:
-- Minimize passenger waiting times (implies maintaining even headways)
- Key Characteristics:
-- Instability of even headways
-- Passenger sensitivity to long waiting time and crowding
-- Cost insensitivity to different strategies
- Possible Strategies:
-- Holding
-- Short-turning
-- Expressing


## Example of Transit Control Strategies



- 6-minute scheduled headways
- 3-minute minimum safe headway
- 10-minute disruption
- impact set includes trains T2, T3, and T4 and stations S1 and S2


## Example Results

1. Do nothing: $h_{T_{2}}=6$ mins.; $h_{T_{3}}=16$ mins.; $h_{T_{4}}=3$ mins. Total Passenger Waiting Time $=\frac{1}{2}\left[4\left(16^{2}+3^{2}\right)\right]+\frac{1}{2}\left[20\left(6^{2}+16^{2}+3^{2}\right)\right]=3540$ pass - mins.
2. Holding: Hold T 2 at S 2 for 4 mins.

Then at S2: $\mathrm{h}_{\mathrm{T}_{2}}=10$ mins.; $\mathrm{h}_{\mathrm{T}_{3}}=12$ mins.; $\mathrm{h}_{\mathrm{T}_{4}}=3$ mins.

$$
\left.T P W T=\frac{1}{2}\left[4\left(16^{2}+3^{2}\right)+20\left(10^{2}+12^{2}+3^{2}\right)\right)\right]=3060 \text { pass }- \text { mins. }
$$

3. Expressing: Express T 3 past S 1 to save 1 minute in travel time. Then at S 2 : $\mathrm{h}_{\mathrm{T}_{2}}=6$ mins.; $\mathrm{h}_{\mathrm{T}_{3}}=15$ mins.; $\mathrm{h}_{\mathrm{T}_{4}}=4$ mins.

$$
T P W T=\frac{1}{2}\left[4 * 19^{2}+20\left(6^{2}+15^{2}+4^{2}\right)\right]=3492 \text { pass }- \text { mins. }
$$

## 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.


## Model Formulation

Decision Variables: departure time of train $i$ from station $k$
Objective function: minimization of passenger waiting time - quadratic function approximated by a piecewise linear function

Impact Set: consider a finite set of trains and stations and approximate the effects beyond this set

Constraints: train running time and minimum safe headways

- other relationships govern passenger loads, train dwell times

Model Structure: mixed integer program except if passenger capacity is not binding when it is a linear program

## Specific Models

## Holding Strategy Models:

- Hold all
- Hold once
- Hold at first station

Combined Short-turning and Holding Models:

- Predetermined train order
- Undetermined train order


## Model Application

## 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


## Red Line



## Incident 1, Ten Minute Delay

|  |  | Control Strategies |  |  |  |
| :--- | :---: | ---: | ---: | ---: | ---: |
|  |  | FOHPC |  |  | STPP |
| Passenger Waiting Time <br> (Passenger-Minutes) | Do <br> Nothing | Hold <br> All | Hold <br> Once | Hold at <br> First | Hold <br> All |
| Ahead of Blockage | 11202 | 8863 | 8931 | 8961 | 9997 |
| Savings (percent) |  | $15 \%$ | $14 \%$ | $14 \%$ | $8 \%$ |
| Behind Blockage | 4791 | 4763 |  |  | 4753 |
| Savings (percent) |  | $0 \%$ |  |  | $0 \%$ |
| Maximum Train Load | 988 | 603 | 614 | 666 | 603 |
| Problem Size |  | 95 | 95 | 95 | 88 |
| CPU Time (seconds) |  | 22 | 37 | 21 | 16 |

## Incident 1, Twenty Minute Delay

|  |  | Control Strategies |  |  |  |
| :--- | :--- | ---: | ---: | ---: | ---: |
|  |  | FOHPC |  |  | STPP |
| Passenger Waiting Time <br> (Passenger-Minutes) | Do <br> Nothing | Hold <br> All | Hold <br> Once | Hold at <br> First | Hold <br> All |
| Ahead of Blockage | 36868 | 16934 | 17306 | 17385 | 16836 |
| Savings (percent) |  | $43 \%$ | $42 \%$ | $42 \%$ | $43 \%$ |
| Behind Blockage | 9218 | 7833 |  |  | 6842 |
| Savings (percent) |  | $3 \%$ |  |  | $5 \%$ |
| Maximum Train Load | 1646 | 666 | 759 | 805 | 651 |
| Problem Size |  | 95 | 95 | 95 | 88 |
| CPU Time (seconds) |  | 25 | 82 | 27 | 17 |

## Incident 2, Ten Minute Delay

|  |  | Control Strategies |  |  |  |
| :--- | :--- | ---: | ---: | ---: | ---: |
|  |  | FOHPC |  |  | STPP |
| Passenger Waiting Time <br> (Passenger-Minutes) | Do <br> Nothing | Hold <br> All | Hold <br> Once | Hold at <br> First | Hold <br> All |
| Ahead of Blockage | 32495 | 23101 | 24465 | 25327 | 23016 |
| Savings (percent) |  | $25 \%$ | $21 \%$ | $19 \%$ | $25 \%$ |
| Behind Blockage | 5593 | 5320 |  |  | 5404 |
| Savings (percent) |  | $<1 \%$ |  |  | $<1 \%$ |
| Maximum Train Load | 1336 | 1137 | 964 | 985 | 776 |
| Problem Size |  | 69 | 69 | 69 | 78 |
| CPU Time (seconds) |  | 17 | 274 | 23 | 12 |

## Incident 2, Twenty Minute Delay

|  |  | Control Strategies |  |  |  |
| :--- | :---: | ---: | ---: | ---: | ---: |
|  |  | FOHPC |  |  | STPP |
| Passenger Waiting Time <br> (Passenger-Minutes) | Do <br> Nothing | Hold <br> All | Hold <br> Once | Hold at <br> First | Hold <br> All |
| Ahead of Blockage | 88204 | 48978 | 52620 | 55487 | 38244 |
| Savings (percent) |  | $41 \%$ | $37 \%$ | $34 \%$ | $52 \%$ |
| Behind Blockage | 6773 | 6124 |  |  | 5964 |
| Savings (percent) |  | $<1 \%$ |  |  | $<1 \%$ |
| Maximum Train Load | 1653 | 1422 | 1343 | 1307 | 1200 |
| Problem Size |  | 69 | 69 | 69 | 78 |
| CPU Time (seconds) |  | 25 | 2458 | 763 | 62 |

## Impact Set Size


1.224J/ESD.204J

## Passenger On-Board Time

| Incident | Delay | Objective Function | Passenger Time |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  | Waiting | On-Board | Total (Weighted) |
| 1 | 10 Min . | PWT | 8961 | 1543 | 9578 |
|  |  | TPT | 9074 | 271 | 9182 |
| 1 | 20 Min. | PWT | 17385 | 2372 | 18334 |
|  |  | TPT | 17659 | 806 | 17982 |
| 2 | 10 Min . | PWT | 23411 | 8666 | 26877 |
|  |  | TPT | 23702 | 5920 | 26070 |
| 2 | 20 Min . | PWT | 50018 | 17617 | 57065 |
|  |  | TPT | 51201 | 10488 | 55396 |

## Execution Times

- Sun SPARC 20 workstation
- GAMS V. 2.25
- CPLEX V. 3.0
- Simple front-end heuristic to fix some binary variables

Large Problems: Execution Time:

Realistic Size:
Execution Time:

11-13 trains, 69-95 train/station decision var.
10 out of $16<30 \mathrm{sec}$.

7-8 trains, 40-50 train/station decision var.
16 out of $16<34 \mathrm{sec}$.

## Conclusions

- Holding and short-turning models formulated and solved to optimality
- Active control strategies result in significant passenger waiting time savings
- Train control set can be reduced to trains ahead of the blockage
- Train control set need not be large


## Conclusions

- Hold at First or Hold Once strategies can be almost as effective as Hold All strategy
- Short-turning most effective where:
-- blockage is long relative to short-turn time
-- number of stations outside the short-turn loop is small
- Consideration of on-board time is desirable
- Execution time is 30 seconds or less but faster heuristics are probably achievable

