Predicting the Impact of Disruptions to Urban Rail Transit Systems

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Metro disruption





The causes of disruption vary, from train fault, power failure, to extreme weather, etc.



Images from straitstimes.com

Metro disruption



- affected 413,000 commuters on 7 Jul, 2015
- affected 123,000 commuters on 14 Oct, 2020

How many stranded commuters can be absorbed by nearby buses?



The resilience of the public transit system

 $\widehat{\mathbf{v}}$

The impact of disruption on commuters

Image from straitstimes.com

Predict impact

Given a disrupted metro network,



and a pair of affected Origin-Dest (OD) metro stations

Image from todayonline.com

Predict impact

We are to predict:

•What percentage of commuters will stay in the public transit system rather than leave for private transit?

——the *stay ratio* metric

•How long is the average travel delay for commuters staying in the public transit system?

——the *travel delay* metric

Data

- Disruption time & locations: official tweets
- Commuters' trajectories in public transit system: transit card records





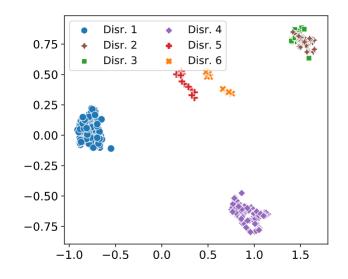
Key challenges

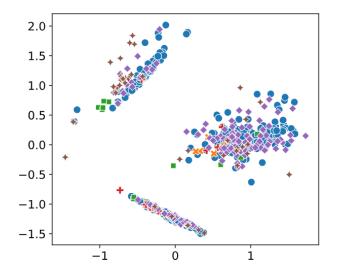
- Sample sparsity for supervised learning
 - 6 disruptions, hundreds of OD pairs
- Commuters' travel behaviours are too unstable to infer their decisions during disruption

Main ideas (1)

• Different disruptions hardly coincide in the domain of disruption and OD features.

But they highly overlap in the domain of *interested alternative route* features.



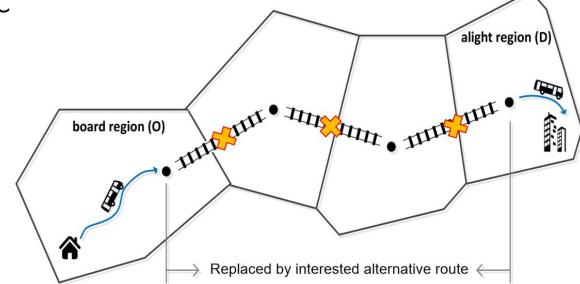


Main ideas (2)

- Recognize *regular communters*
 - stabler departure time and OD
- on behalf of all commuters about their choices during disruptions

Main ideas (3)

- Generate interested alternative routes (IARs) based on the real choices of regular commuters
 - sample sparsity again about IARs for supervised learning
 - negative sampling
- Build predictors using IAR features for every impact metric



Evaluation

- We adopt a *leave-one-out* scheme to evaluate the impact predictors.
- We evaluate prediction accuracy and model stability of the proposed method.

Q & A