



UNIVERSITE PARIS-SACLAY



données et algorithmes pour une ville intelligente et durable

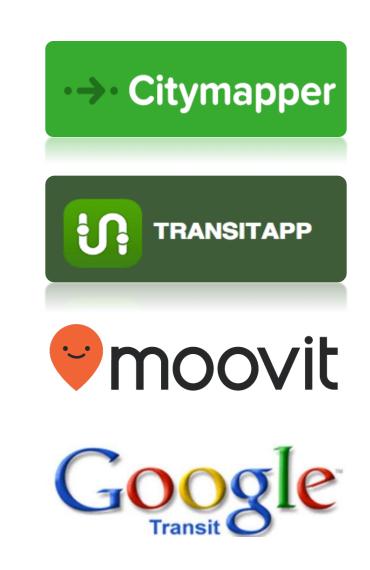
# Link++: Adaptive Linking of Multiple Transportation Networks

Authors:

Ali MASRI, Karine ZEITOUNI & Zoubida KEDAD

#### Introduction

- Transportation data integration → improves transportation services e.g. trip planning
- Mainly focused on public transportation services
- Individual and collective transport services e.g. dynamic car pooling are not taken into account or not fully integrated
- Integrating such services will boost the performance of existing solutions



# The Integration Problem

- Heterogeneous data representations
  - Many formats and representation models
- Spatiotemporal feature
- Dynamicity of the network
  - e.g. Stops may appear/disappear in real-time
- Dynamicity on the network
  - unexpected events such as alerts



### Problem



How to achieve the integration of the transportation data sources?

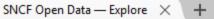
## **Open Transportation Data**

- Companies are moving towards publishing their data for public
- This allows
  - Better market visibility
  - Support for better transportation applications
- Multiple formats
  - GTFS
  - CSV
  - Shape
- Connecting these data together allows easier access and richer information – Data Interlinking





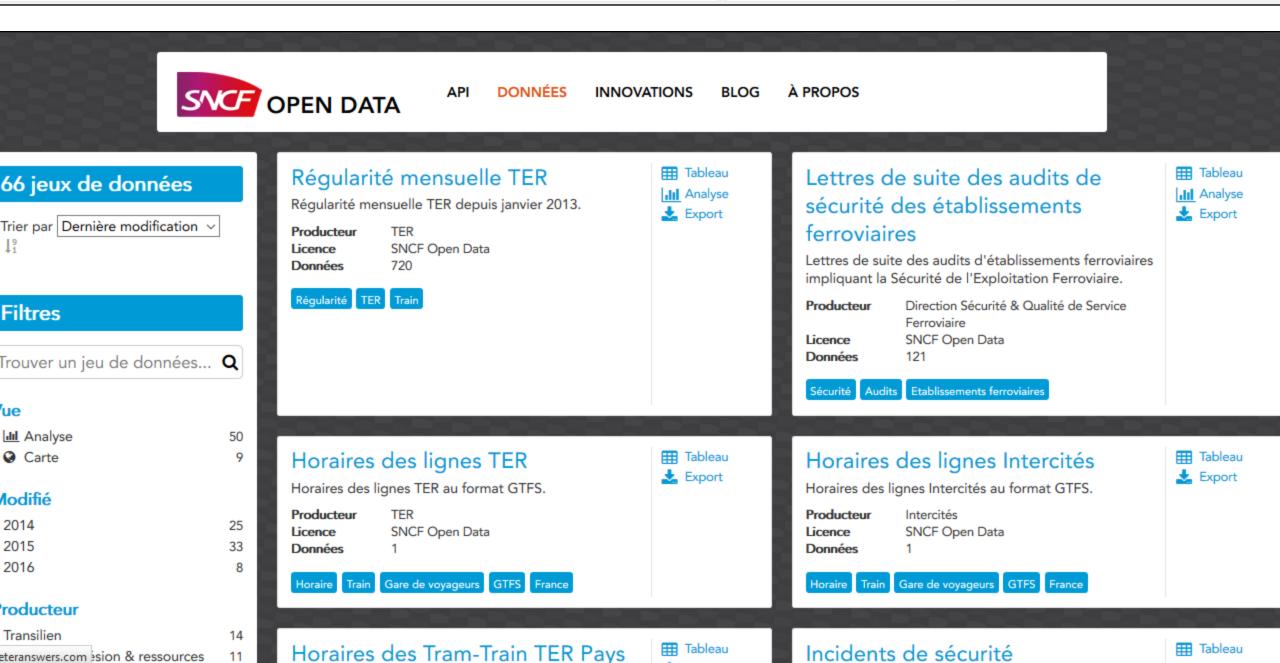




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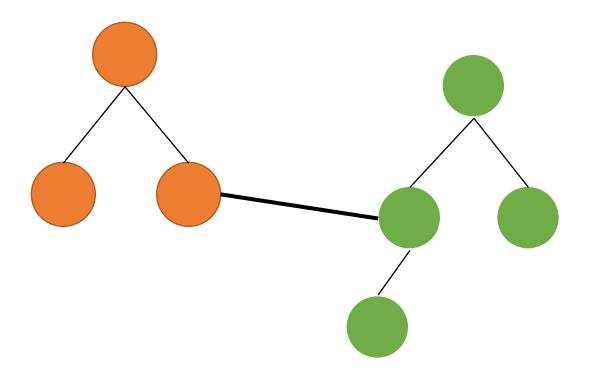
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# What is data interlinking?

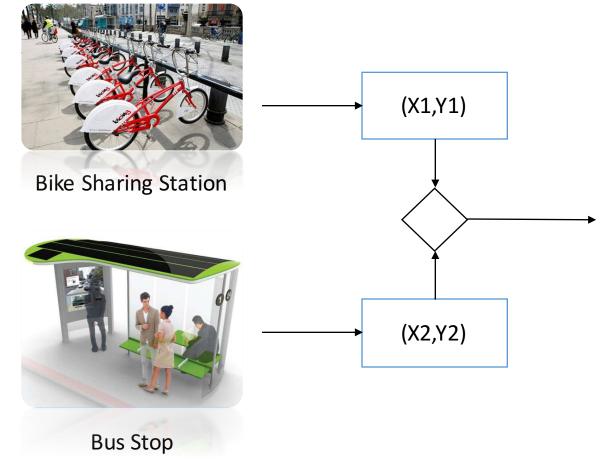
- Finding relations between entities in different datasets
- Discovery based on a linkage rule defined by
  - Preprocessing functions
  - Distance functions
  - Threshold
- If a rule is valid then a link is created



## Related Work

- MELINDA [Scharffe et al. 2011]
  - A framework for integrating open data
- DataLift [Scharffe et al. 2012]
  - A platform for transforming, interlinking and publishing open data
- GeoKnow [Athanasiou et al.]
  - Same objective as DataLift
  - More specific to geospatial data
  - Column indexing, faster interlinking and querying
- LinkedGeoData [Auer et al.]
  - An approach to integrate and publish OSM data as open data
- [Silk] and [LIMES]
  - Interlinking tools

# Example – Transportation Data



#### Linking Rule

- Get the coordinate of both locations
- Calculate the geometric distance
- Link if distance < threshold ,

#### <BikeStation1><owl:sameAs><BusStop1>

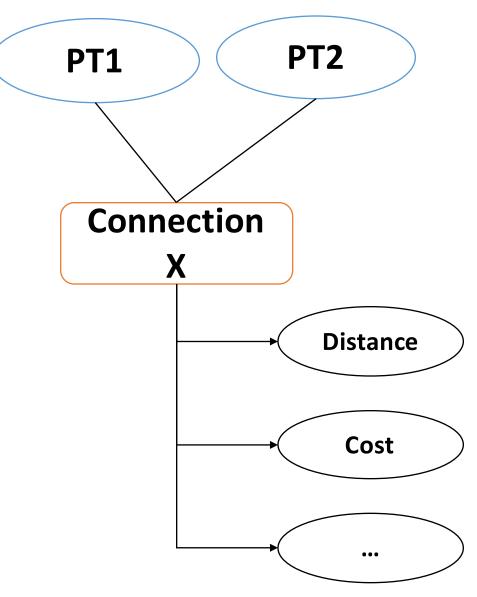
#### Is this enough?

#### Problems

- Limited distance functions
- Insufficient information level (output)
- Static links

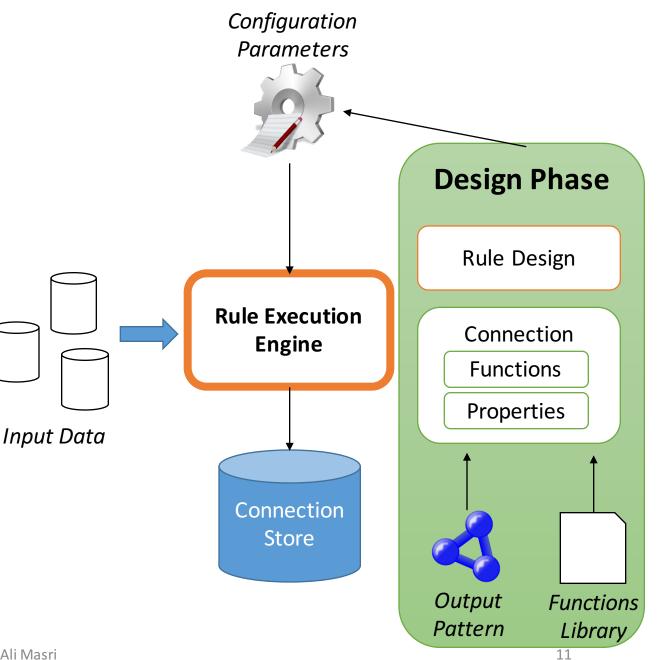
#### Introducing New Transportation Connections

- Existing approaches discover sameAs links
- Dedicated to equivalence matching
- We want a link that is able to
  - Define a connection between two transportation points of transfer
  - Affected by the status of transportation system
    - Time schedule
    - Operating days
    - Real-time status
  - Capable of expressing information



## Link++

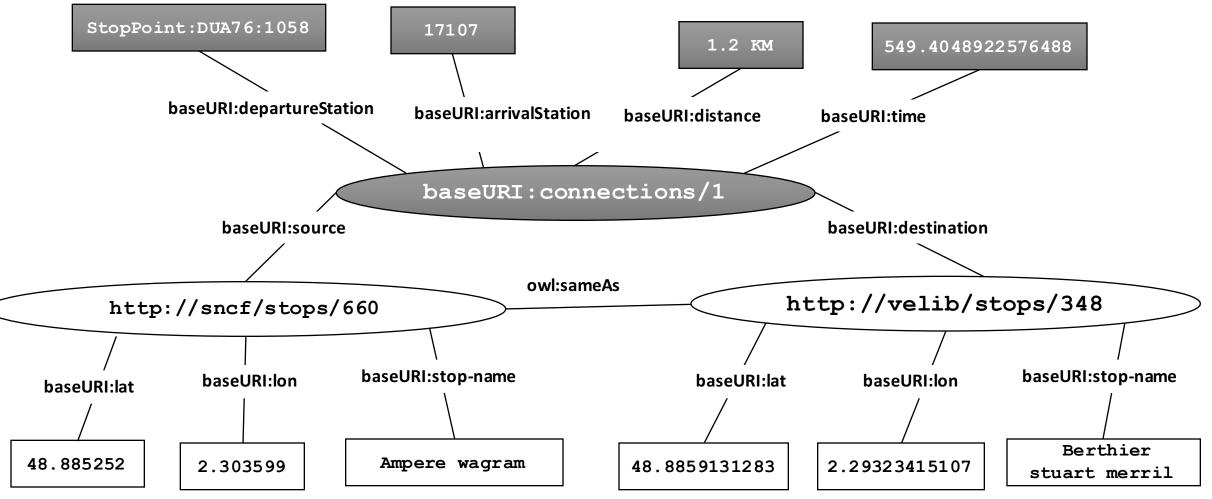
- Consists of two phases
  - Design phase
  - Execution phase
- Enables users to define
  - Custom functions
  - External libraries
  - Custom linking rules
  - Custom output
- Can be customized to fulfill any interlinking problem



## Interlinking Tools - Outputs

	Techniques	Output	Domain
RKB-CRS	String	owl:sameAs	Publications
GNAT	String, Similarity-propagation	owl:sameAs	Music
ODD-Linker	String	linkset	Independent
RDF-AI	String, WordNet	alignment format	Independent
Silk	String, Numerical, Date	owl:sameAs, user-specified	Independent
LIMES	String, Geographical, Numerical, Date	owl:sameAs, user-specified	Independent
Link++	User defined	User defined	Independent

# Comparison between our connections and existing links baseURI = http://www.vedecom.fr/transport



### Evaluation



Railway services http://www.sncf.com/ 1067 train stations Find connections between two different modes of transportation to enable Multimodality

Bike sharing services <u>http://www.velib.fr</u> 1242 bike stations

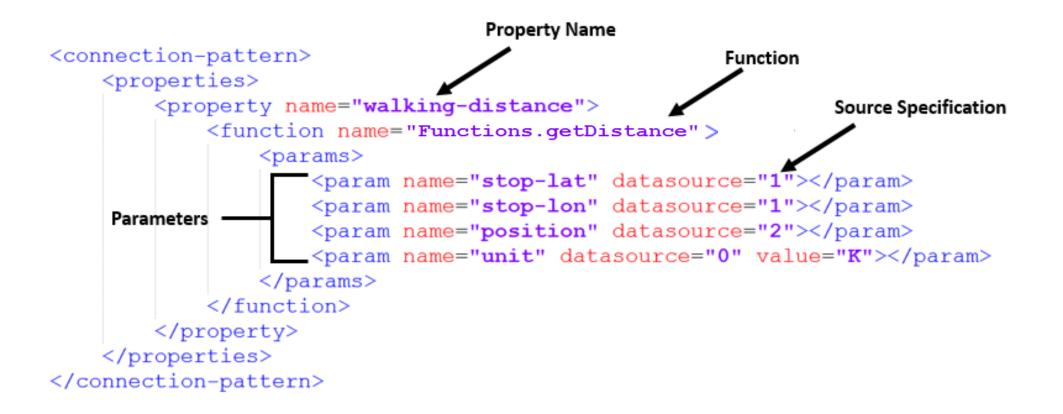
VELIB dataset <u>http://opendata.paris.fr/explore/dataset/stations-velib-disponibilites-en-temps-reel</u> SNCF dataset <u>http://gtfs.s3.amazonaws.com/transilien-archiver\_20160202\_0115.zip</u>

#### Process

- 1. Transform data into RDF
  - DataLift framework [Scharffe et al. 2012]
- 2. Define custom functions
  - Google distance API
  - More precise results
- 3. Define linking rule
  - Bike to bike station: If a cycling path exists within three kilometers, create a connection
  - Bike to train station: If a walking path exists from one stop to another within one kilometer, create a connection
- 4. Define output pattern



## Output Pattern



#### **Connection Generation**





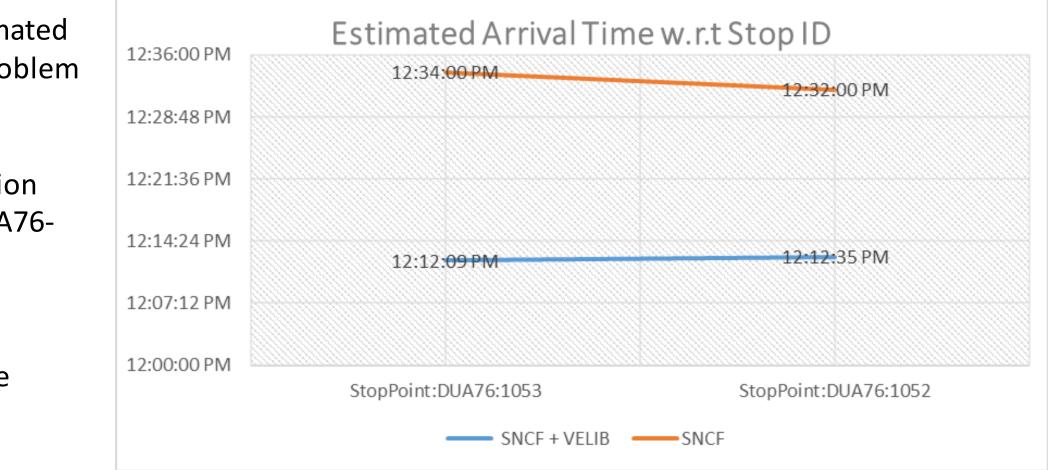
# 3643 new connections between SNCF and VELIB

319594 internal connections between VELIB bike stations

### SNCF vs SNCF+VELIB

Minimum Estimated Arrival Time Problem Departure Station "StopPoint-DUA76-356"

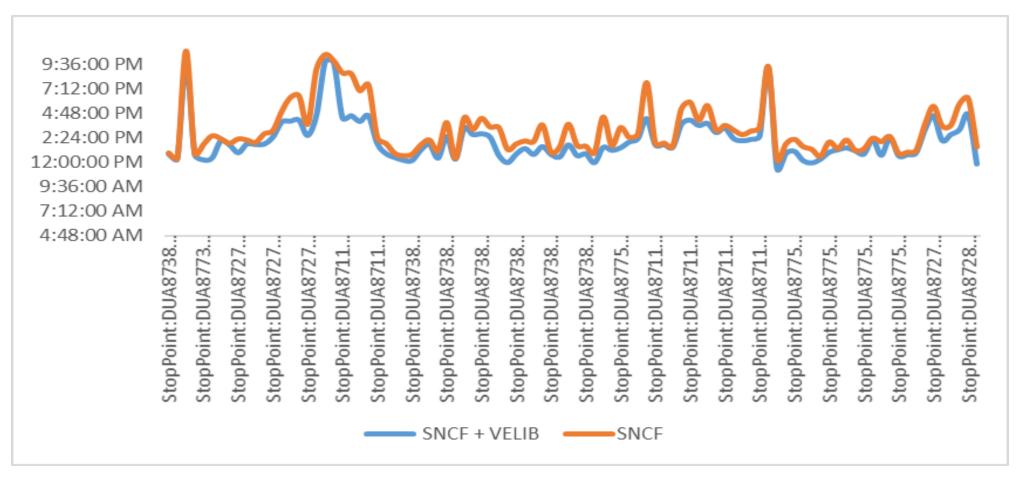
#### Departure Time 14:00



#### SNCF vs SNCF+VELIB

Departure Station "StopPoint-DUA8739300"

Departure Time 14:00



#### Link++ [SNCF-VELIB-GEOMETRIC]

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#### Discussion

- Transportation data integration is important to enable Multimodality
- Existing approaches focus on interlinking datasets based on equivalence matching
- Generated links lack the properties relevant to a transportation link
- Our approach enables interlinking beyond equivalence matching
  - Custom functions, rules and output patterns
  - Provide a rich semantic connection between entities

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תודה Dankie Gracias Спасибо Takk Köszönjük Terima kasih Grazie Dziękujemy Dekojame Ďakujeme Vielen Dank Paldies Kiitos <sup>Täname teid</sup> 谢谢 Thank You Tak 感謝您 Obrigado Teşekkür Ederiz 감사합니다 Σας ευχαριστούμε Bedankt Děkujeme vám ありがとうございます Tack