## Preferred citation style for this presentation

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## Walkability and pedestrian route choice Studying walking behavior in Singapore's city centre

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Urban Sustainability R&D Congress 2015 10 July 2015

(FCL) FUTURE 未来
CITIES 城市
LABORATORY 实验室

(SEC) SINGAPORE-ETH 新加坡-ETH CENTRE 研究中心

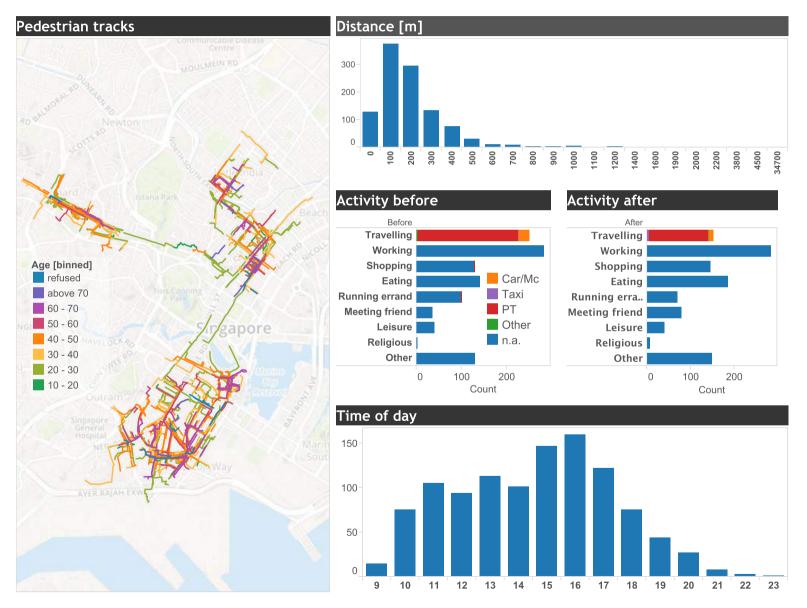




# Field survey

Tracking 1113 pedestrians in Singapore's city centre

### Who walks where?



#### Some basic facts

Number of valid tracks: 1077

Average walking distance: 259 m

Median walking distance: 210 m

Lower quartile: 143 m

Upper quartile: 305 m

Average walking duration 3.96 min

Media walking duration 3.23 min

Average walking speed 4.51 km/h

Median walking speed 3.98 km/h

Comparison of average walking distance in other cities:

Calgary, city centre (1986): 330m

Portland, whole city (2014): 876m

San Jose / Portland, MRT stops (2012) 832m

Seneviratne, P. N. and J. F. Morrall (1985). 'Analysis of Factors Affecting the Choice of Route of Pedestrians', Transportation Planning and Technology 10(2): 147–159. Dill, Jennifer (2015). Where Do People Prefer to Walk?, Active Living Research Conference, San Diego.

Agrawal, Asha Weinstein, Marc Schlossberg and Katja Irvin (2008). 'How Far, by Which Route and Why? A Spatial Analysis of Pedestrian Preference', *Journal of Urban* 13(1): 81–98.

### Walking distance by weather

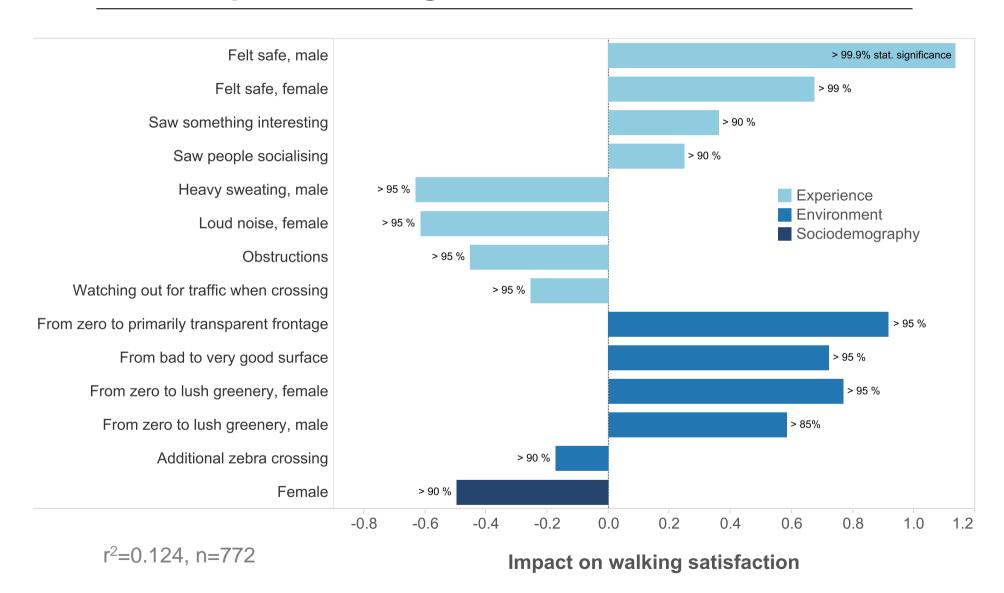


Compared to sunny conditions, people walk:

- 37 meters more, when it is cloudy
- 98 meters less, when it is drizzling

We have too few observation of walks in heavy rain condition to draw a valid conclusion.

## What impacts walking satisfaction?

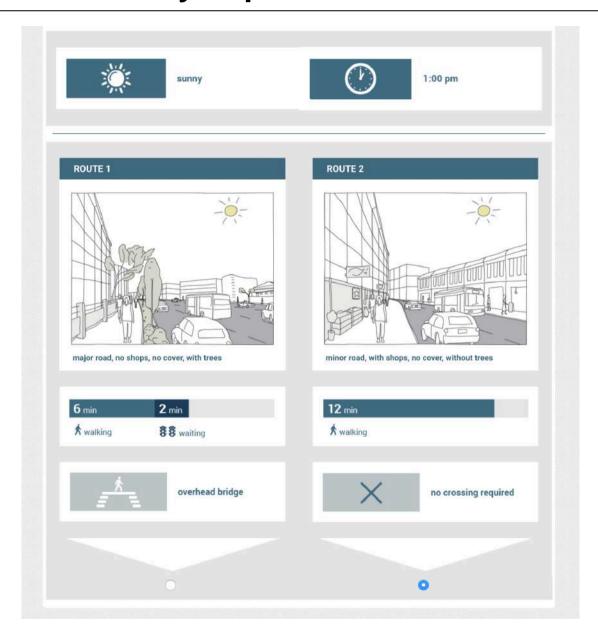


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# Web-based follow up survey

From actual to perceived distance

# Which route would you prefer?



## **Results of choice model**

Parameters	Value	Sign.(>95%)
Walking time (through park, cloudy) [min]	-0.019	*
along major road	+59%	*
along minor road	+47%	*
cover	-18%	*
when rainy	-75%	*
when sunny	-51%	*
through block/underpass	-16%	*
when rainy	-66%	*
with greenery	-23%	*
with active frontage	-18%	*
Crossing 2-lane road	-0.015	*
Crossing 4-lane road	-0.094	*
Overpass	-0.082	*
Overpass with lift	-0.043	*
Trafficlight	-0.016	*

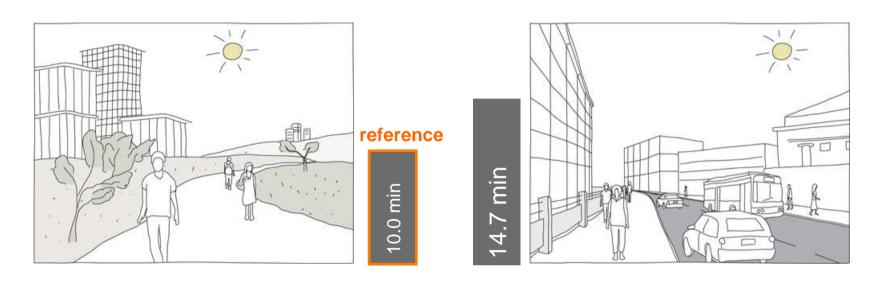
$$n = 2451$$
,  $\rho^2 = 0.131$ 

## **Numerical example**

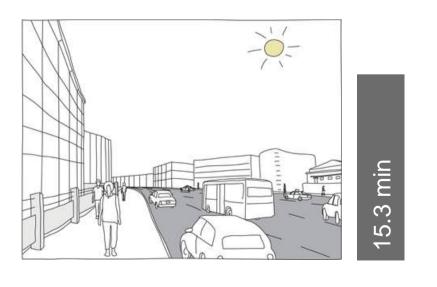
```
U = -0.00193 \cdot 10 \cdot (
       (1 + \mathbf{0.473 \cdot minor} + \beta_{maj} \cdot 0 + \beta_u \cdot under \cdot (1 + \beta_{u_r} \cdot 0))
       (1 + -0.228 \cdot \text{greenery}) \cdot
       (1 + -0.175 \cdot \text{shops})
       (1 + -0.175 \cdot \text{cover} \cdot (1 + 1.9 \cdot \text{sunny} + \beta_{c_r} \cdot 0)) +
       \beta_o \cdot 0 +
       \beta_{ol} \cdot 0 +
       \beta_{i_2} \cdot 0 +
       \beta_{j_4} \cdot 0 +
       \beta_{tl} \cdot 0
    = -0.00193 \cdot 10 \cdot 0.62
```

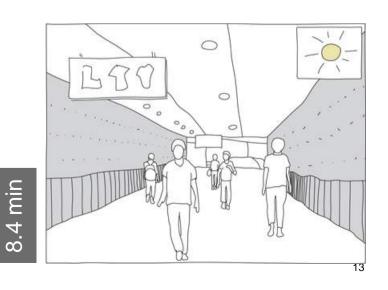
6.2 min

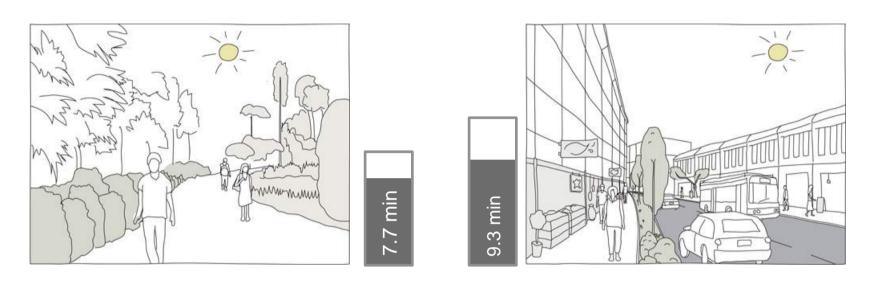
10 min



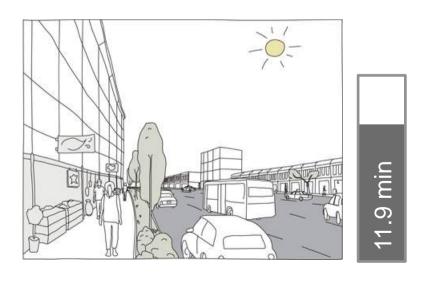
#### Reference case

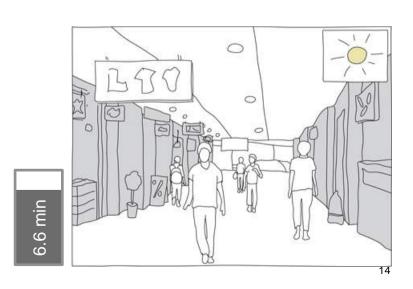


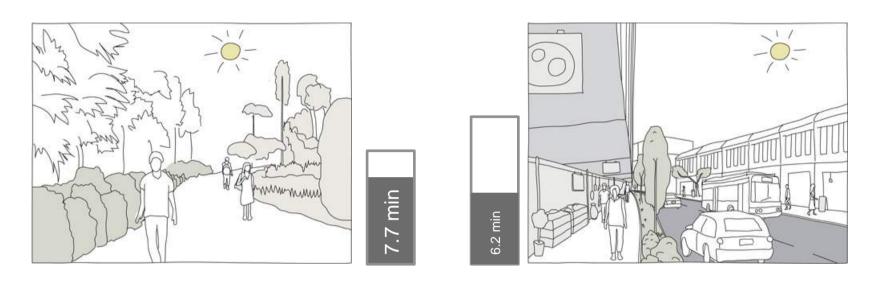




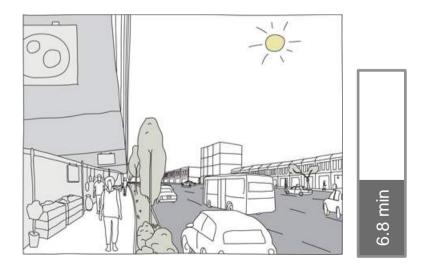
Add greenery (-23%) and shops (-18%)

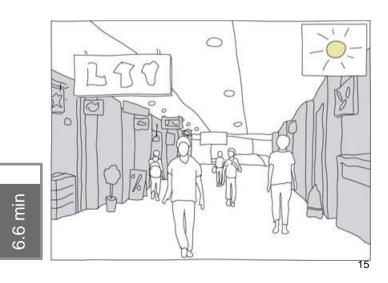


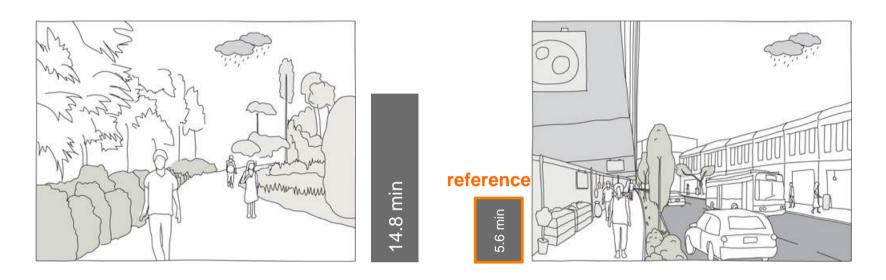




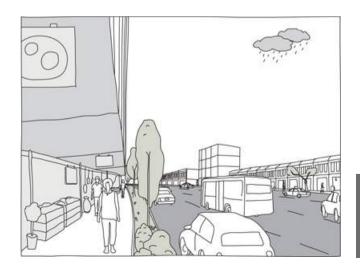
Add cover: -33% perceived walking time



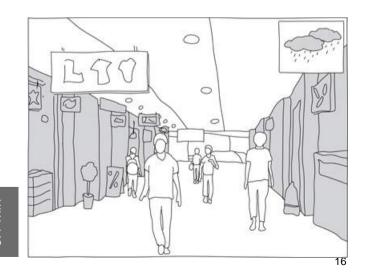




### Tropical rain sets in



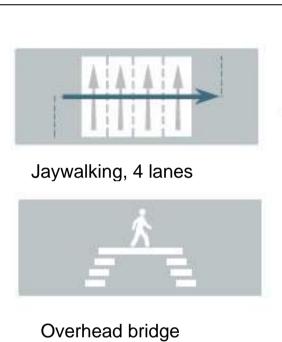




# Crossings' equivalent of walking time

4.9 min

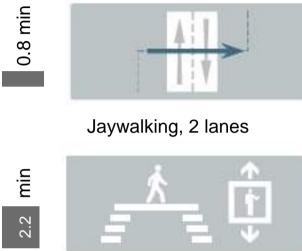
4.2 min







2.0



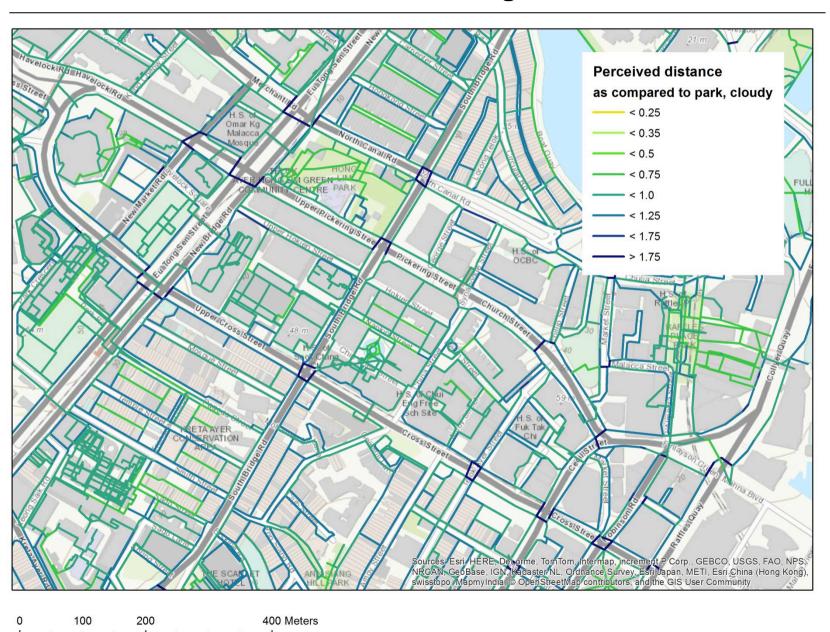




Underground with Escalator

\*stat. not significant as variable only available ein subsample-> assumed values

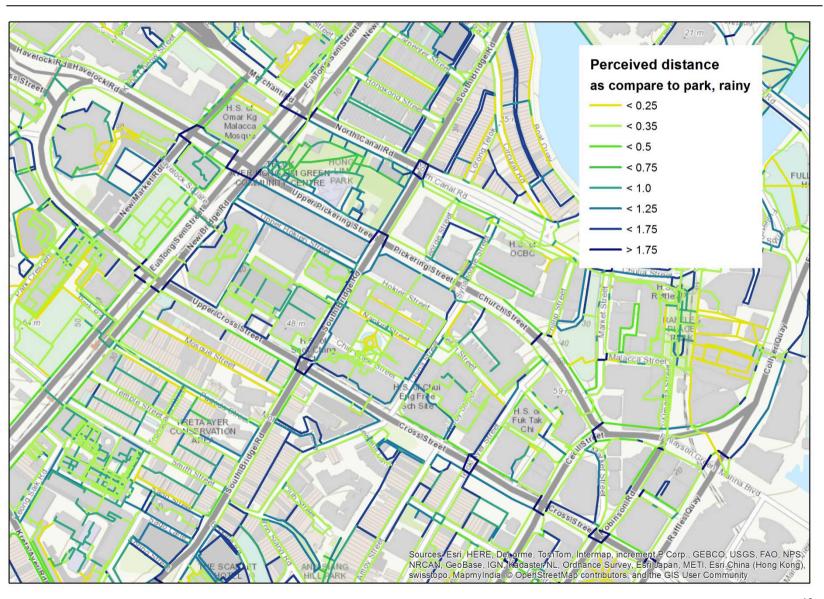
### The barrier effect of the overhead bridge



### The barrier effect of the overhead bridge

400 Meters

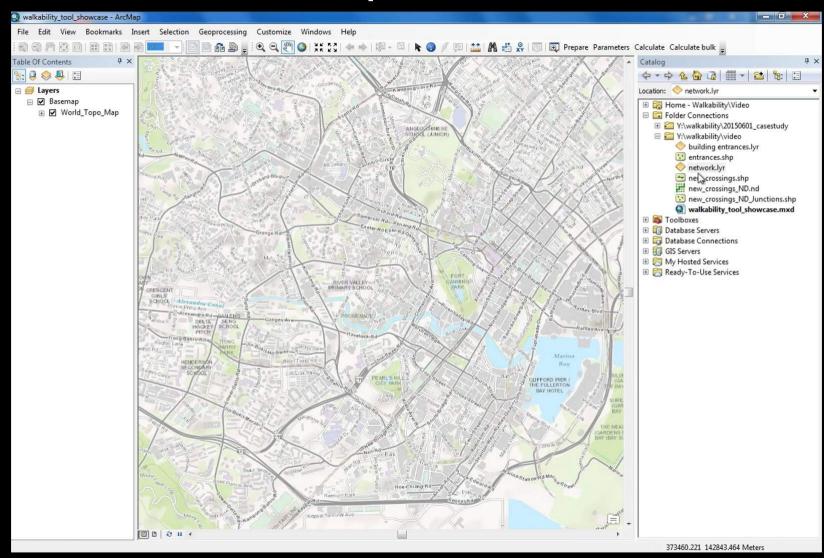
200



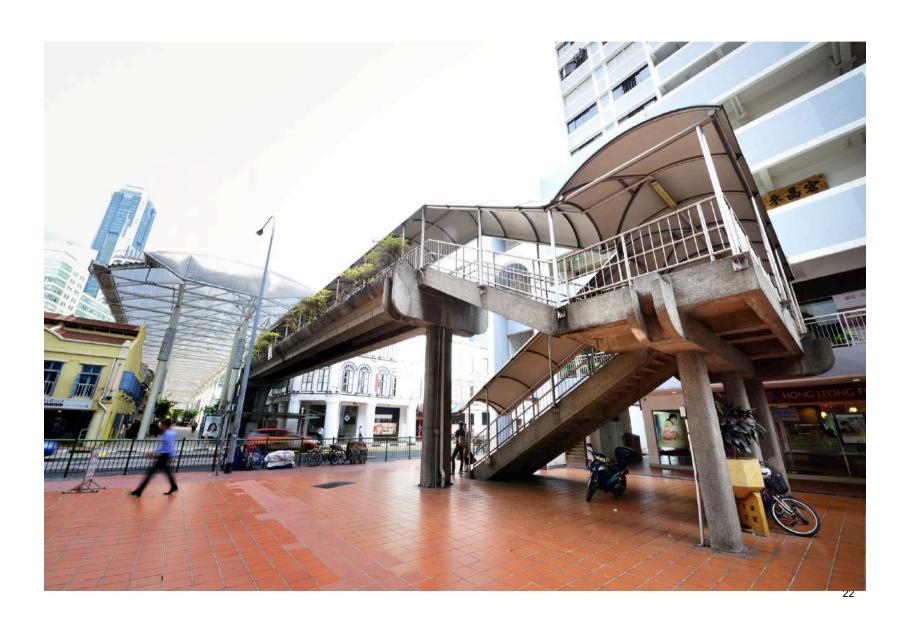
# **Walkability Tool**

A new ArcGIS add-in to compute walkability

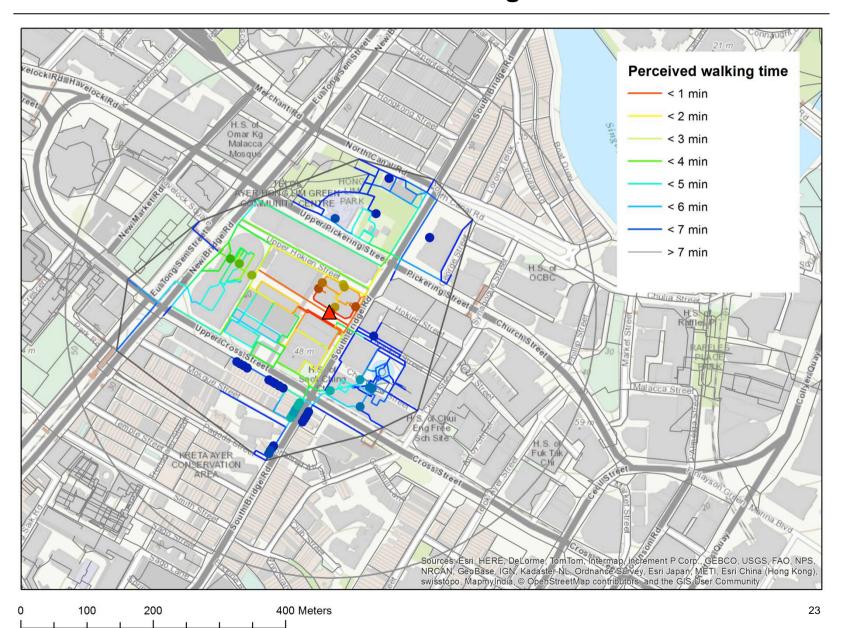
## **New ArcGIS add-in for planners**



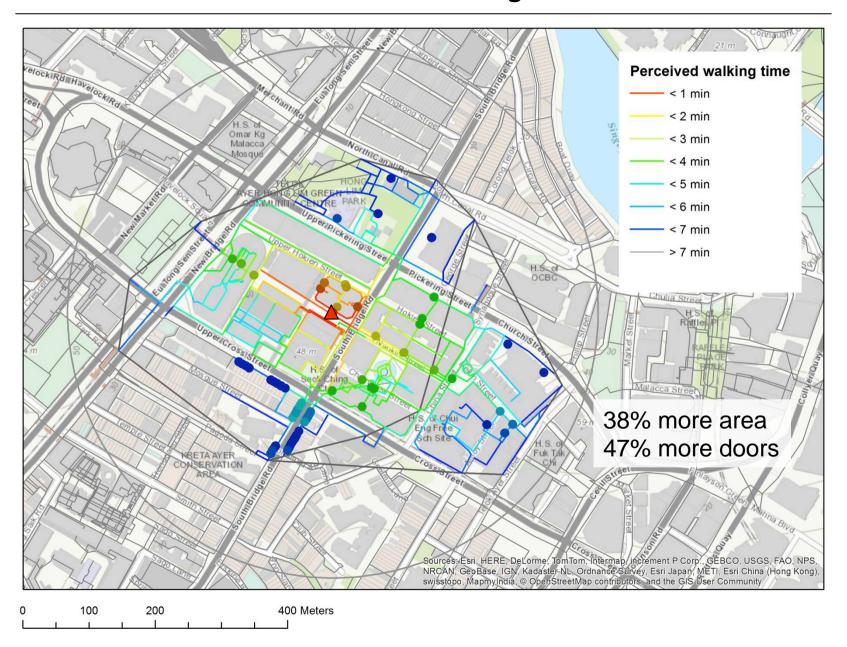
## **Connecting Hong Lim complex with Nankin Road**



### The barrier effect of the overhead bridge



### The barrier effect of the overhead bridge

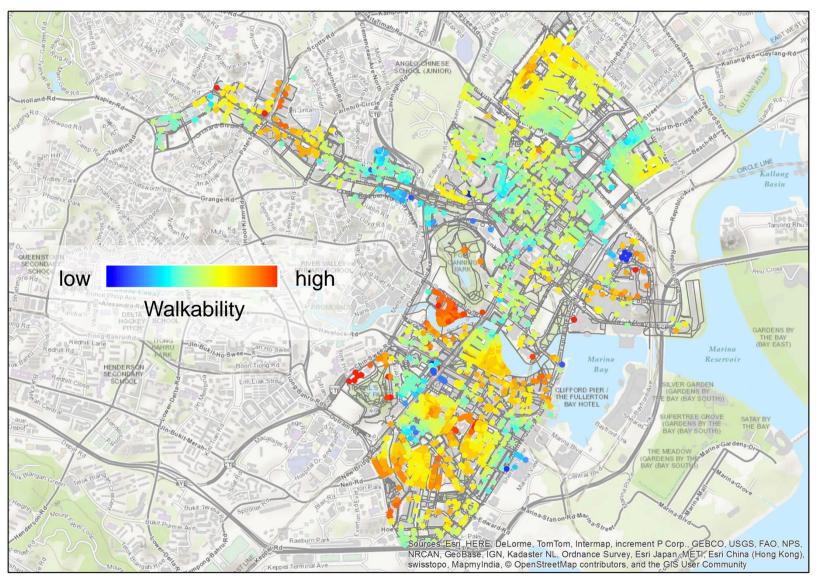


## Walkability in Singapore

500

1,000

2,000 Meters



#### What's next

Model pedestrian route choice to better understand influence of:

- Influence of turns, wayfinding
- Traffic lights
- Distance vs built environment based on actual behavior

#### Deployment of Walkability Tool

- Developed in collaboration with URA, but to be shared
- Training session in August, please contact me if you are interested

## The team to make it happen



Michael van Eggermond Spatial database, methodology



Sergio Ordonez PhD student App, ArcGIS add-in



Prof. Dr. Kay Axhausen Pl



Dr. Alex Erath Survey, modelling, methodology



Kim Helmersen Piloting



Atizaz Ali Survey support, Network cleaning



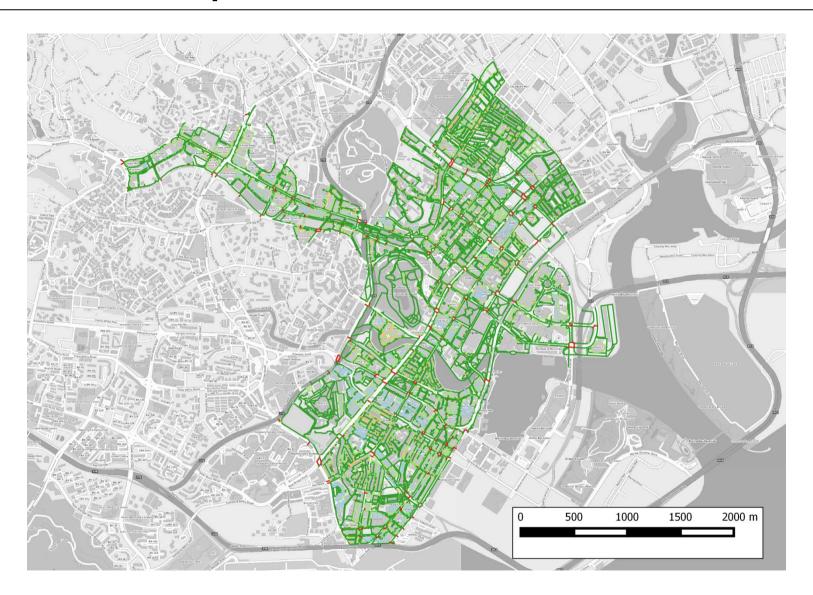




# **Pedestrian network survey**

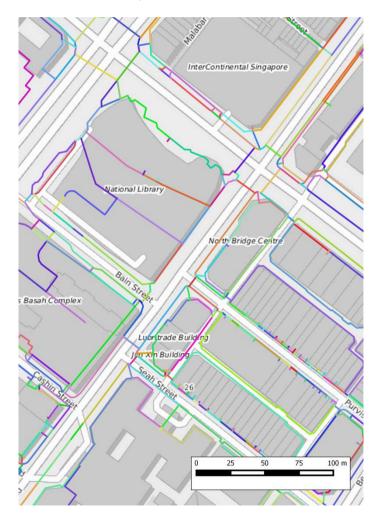
Collecting information for 43km walkways

# **Extent of the pedestrian network**



## Simplification of network to collect characteristics

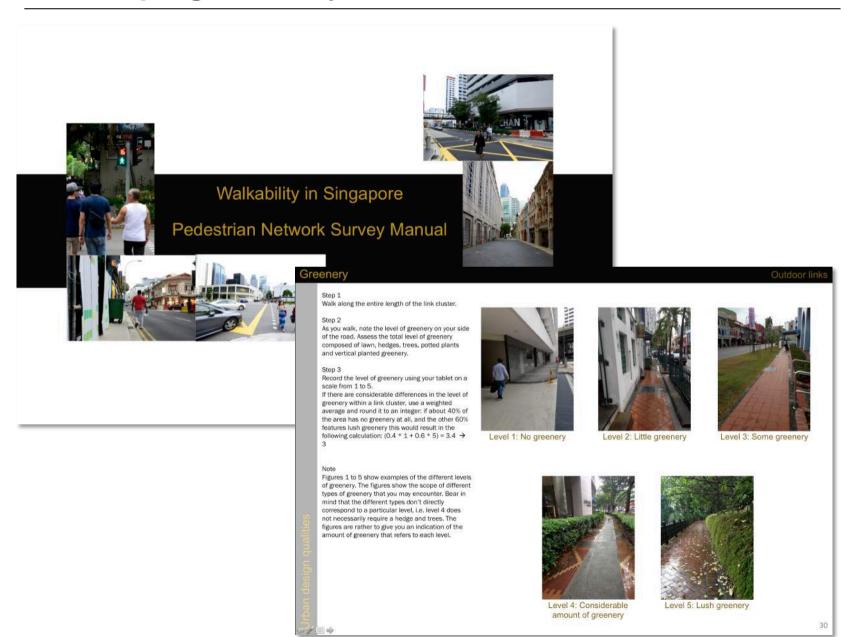
At grade network (27311 features); Each color represents a feature



Link clusters (2833 features);; Each color represents a cluster



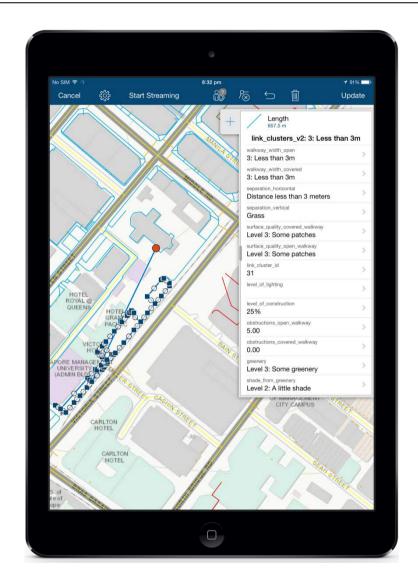
## Developing a survey manual



### **Collector for ArcGIS**

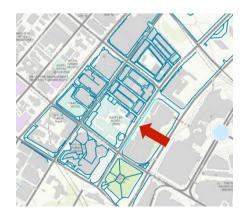
Use your smartphone or tablet to collect and update information in the field, whether connected or disconnected.

Your update can include modifying the feature's attributes and location, as well as adding and deleting photos.



#### **Beach road**





Width open walkway 1-2m Width covered walkway n.a.

Separation horizontal 1-3m

Separation vertical medium high hedge

Noise level 69db

Noise source Mainly from street

Maintenance 5/5 – no rubbish in sight

Slipperiness No, no tendency to slipperiness

Greenery 5/5 – lush greenery Shade from greenery 4/5 - clearly shaded

Obstructions 0 – no obstructions in sight

Construction 0%

Imageability 1 feature Human scale 1 feature

Enclosure 4/5 Transparency 0/100

Level of lighting 2/5 – small amount

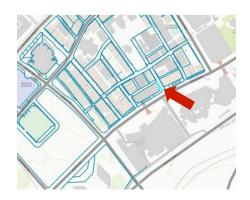
Number of persons

Wheelchair fully accessible

Date 6. July 2014

#### **Sultan Gate**





Width open walkway 2-3 mWidth covered walkway 1-2 m

Separation horizontal 1-3m Separation vertical grass

Noise level 60db

Noise source Mainly from street

Maintenance 4/5 – a little rubbish in sight Slipperiness No, no tendency to slipperiness

Greenery 3/5 – some greenery

Shade from greenery 1/5 - no shade from greenery

Obstructions 0 – no obstructions in sight

Construction 0%

Imageability 2 features Human scale 13 features

Enclosure 4/5 Transparency 40/100

Level of lighting 2/5 – small amount

Number of persons 4

Wheelchair fully accessible

Date 8. July 2014