

# Lesson 10:

# Modelling Geographic of Accessibility

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# Content

- Basic Concepts of Geography of Accessibility
- Accessibility Models
  - Stewart Potential model
  - Reilly model
  - Huff model

# What is Geography of Accessibility?

- Accessibility is the measure of **the capacity of a location to be reached from, or to be reached by, different locations**. Therefore, the capacity and the arrangement of transport infrastructure are key elements in the determination of accessibility.

# Why Model Geography of Accessibility?

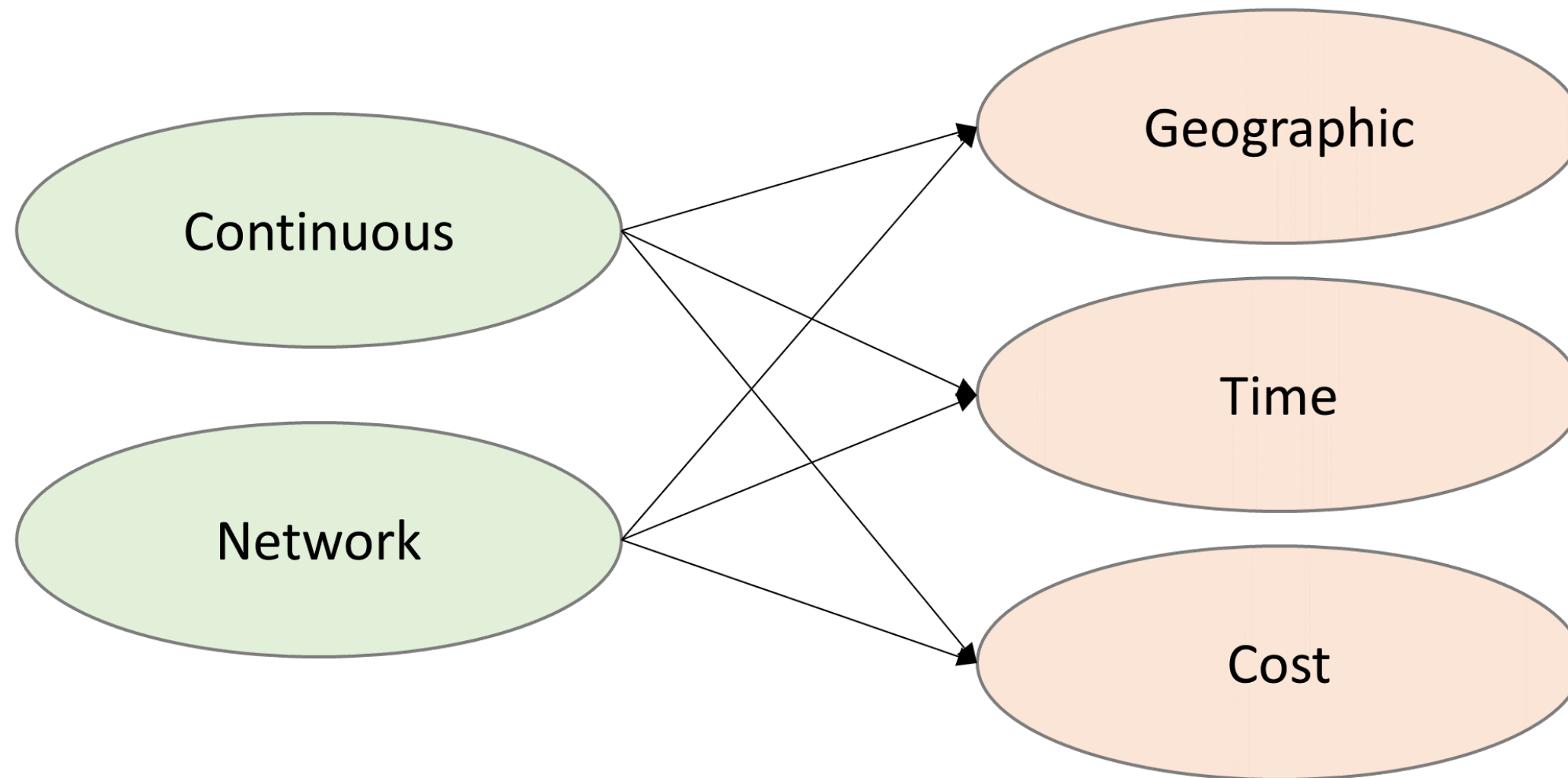
- Questions that can be answered by accessibility models:
  - Which part of the geographical areas are deprived from getting access to a social service, facility or job opportunity?
  - Which part of the geographical areas will be affected by a public policy or business decision such as merging JCs, secondary and primary schools.

# Measuring Distances

- Different spatial and distance conceptualizations that are commonly employed when measuring and modelling accessibility.

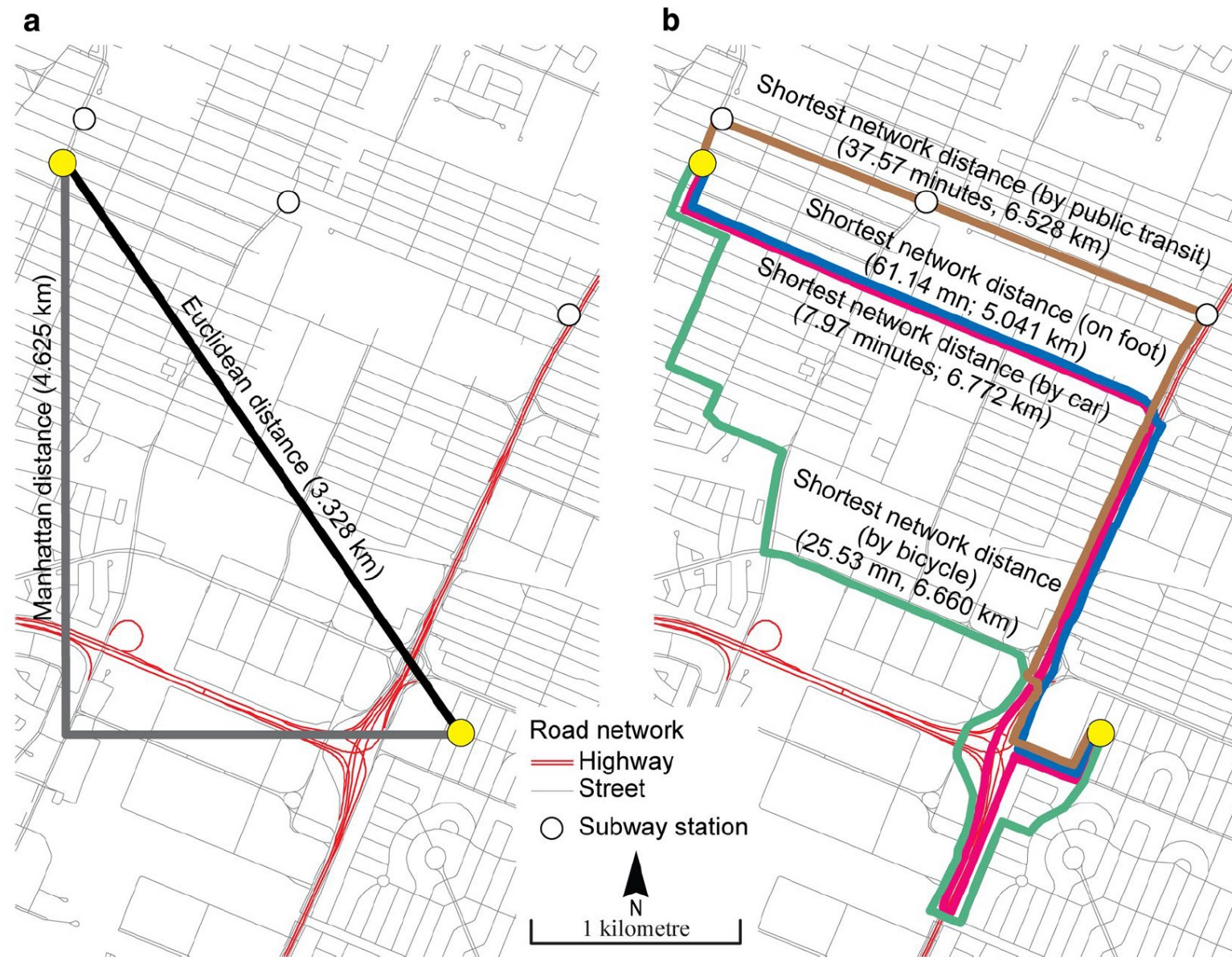
Spatial Conceptualization

Distance Conceptualization



# Distance Consideration

Cartesian distance versus Network distance.

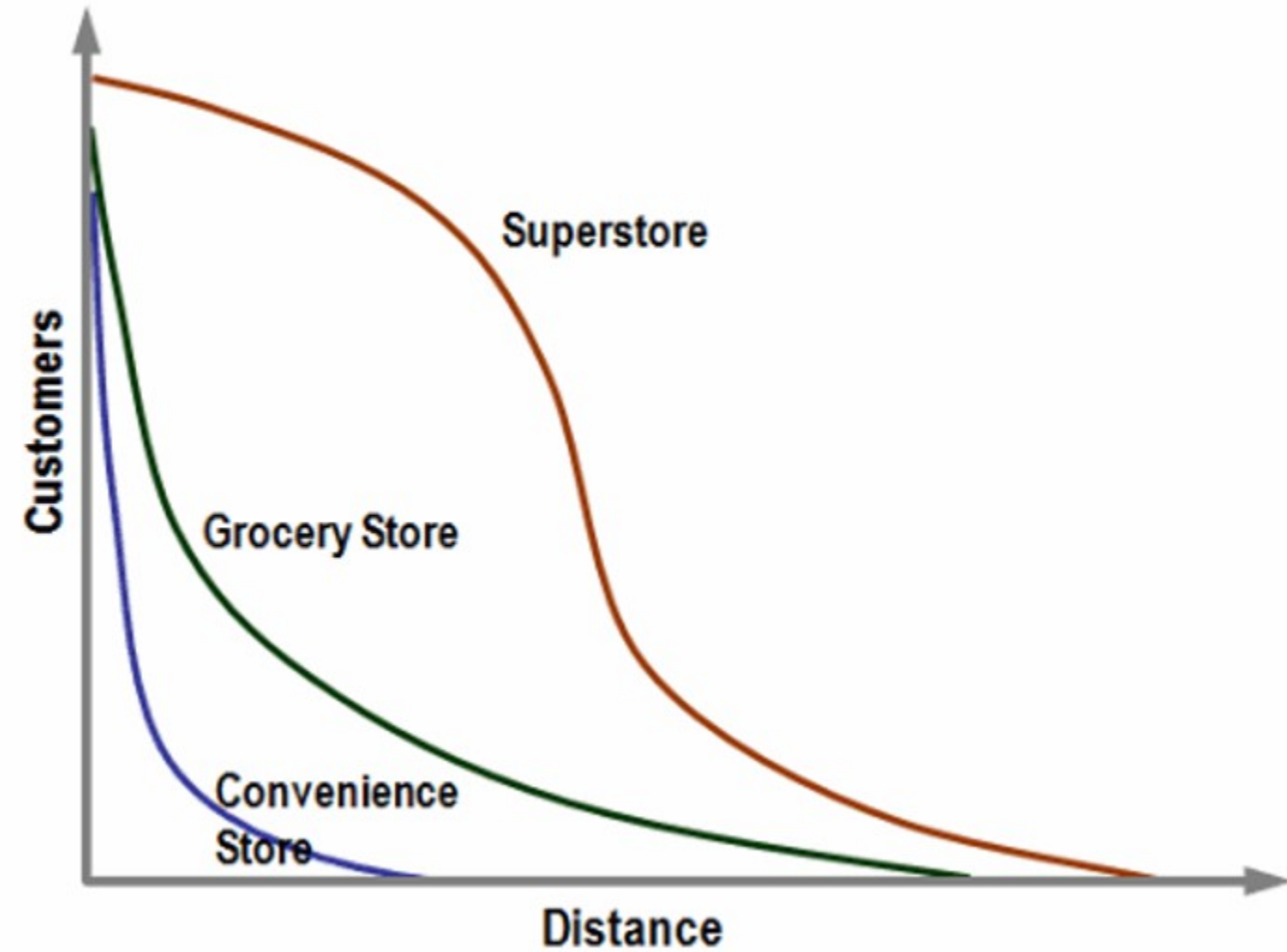


Types of distance. **a** Cartesian distances. **b** Network distances

Reference: Philippe Apparicio et. al. (2017) [“The approaches to measuring the potential spatial access to urban health services revisited: distance types and aggregation-error issues.”](#) *International Journal of Health Geographics*, pp. 16:32.

# The distance friction

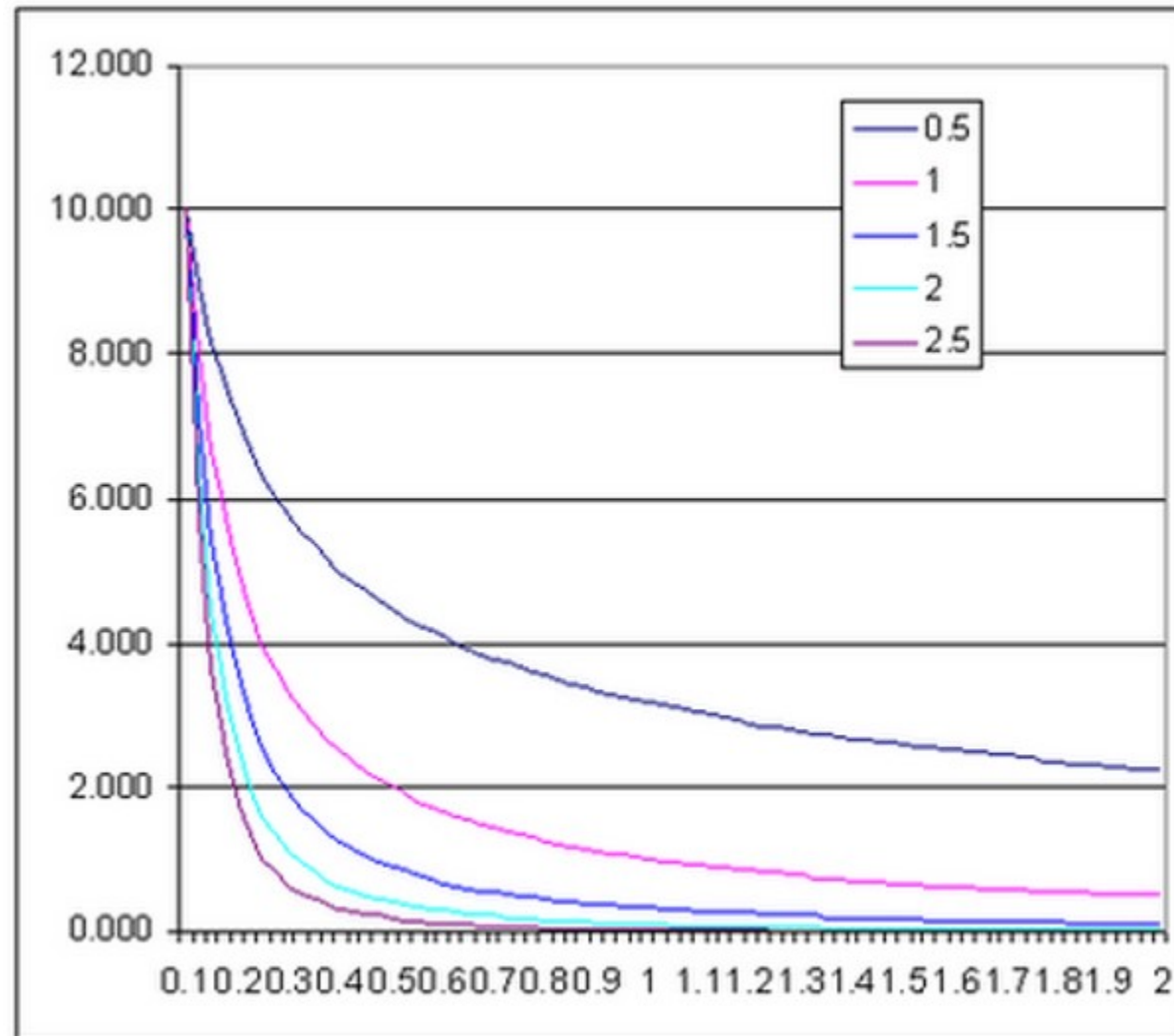
- Modeling spatial interactions implies quantifying the **distance friction** or **impedance**.
- The role of the distance can be interpreted as a disincentive to access desired destinations or opportunities (e.g. jobs, shops).



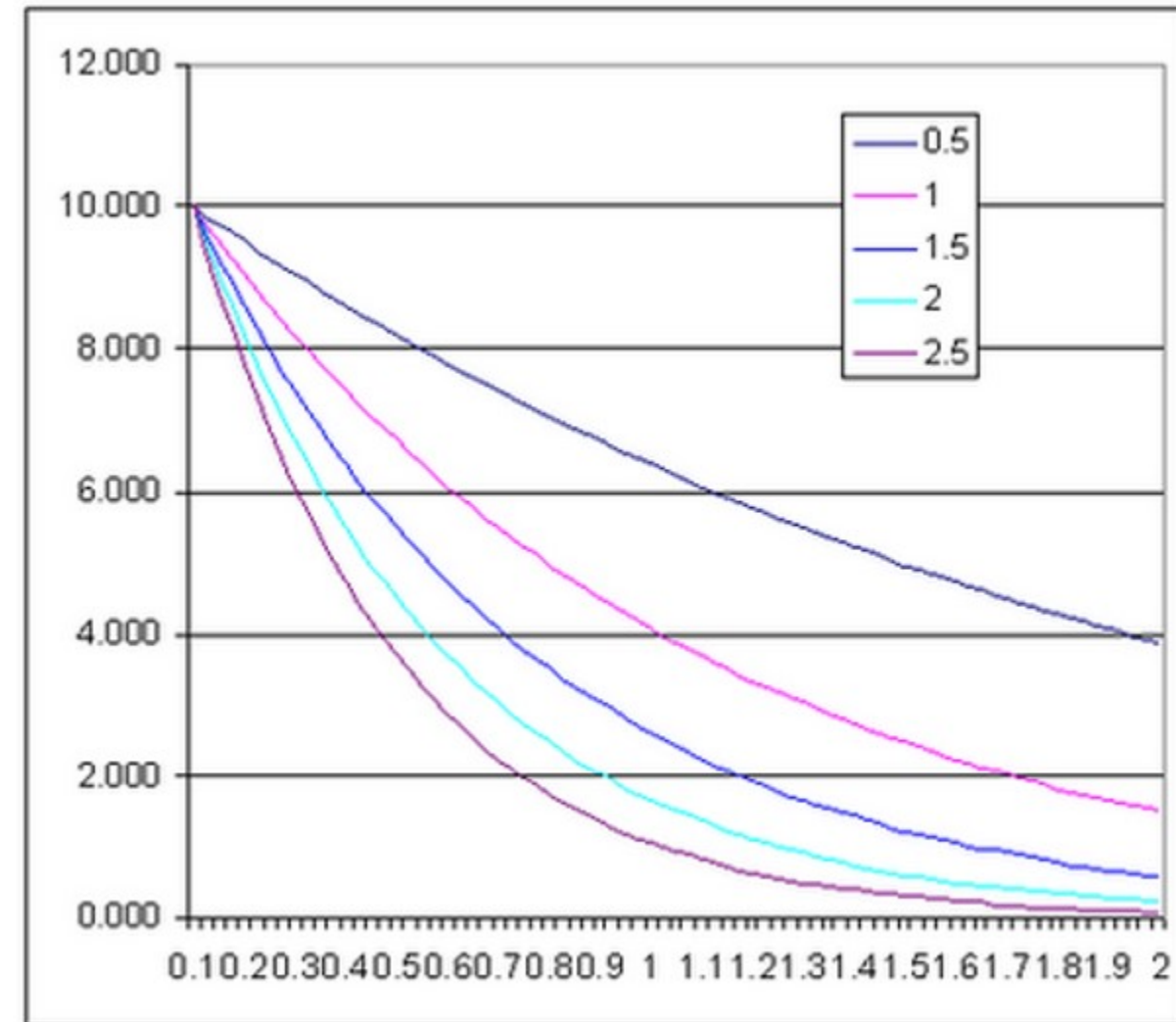


# Distance Decay function.

Inverse distance decay,  $\alpha/d_\beta$



Exponential distance decay,  $\alpha e^{-\beta d}$





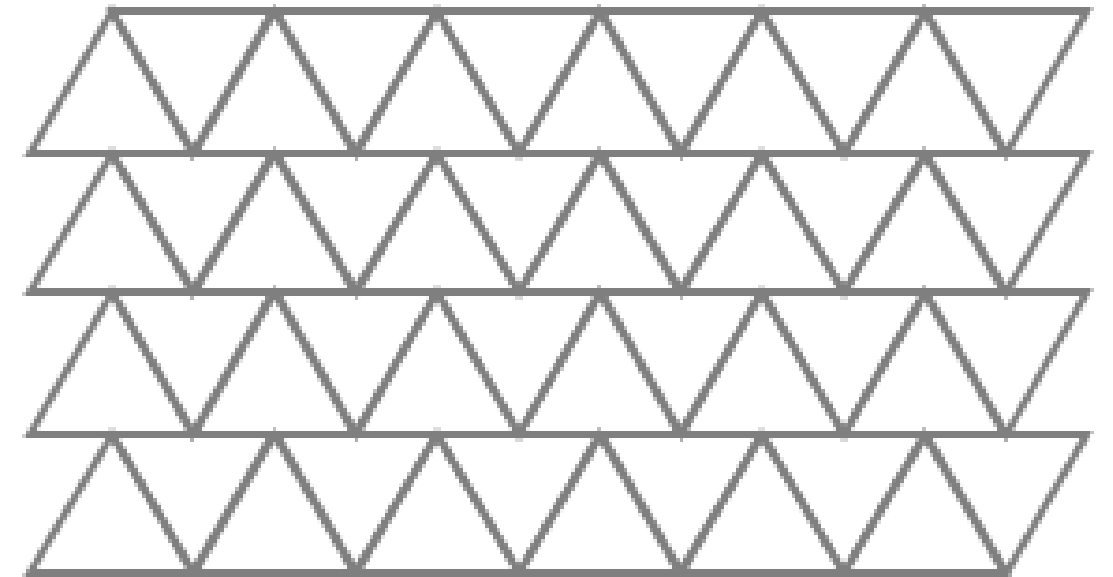
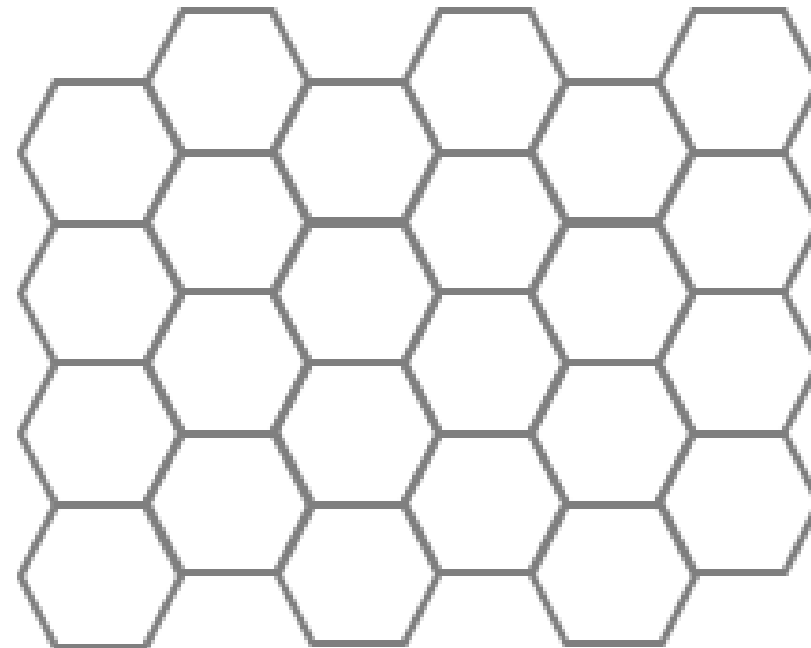
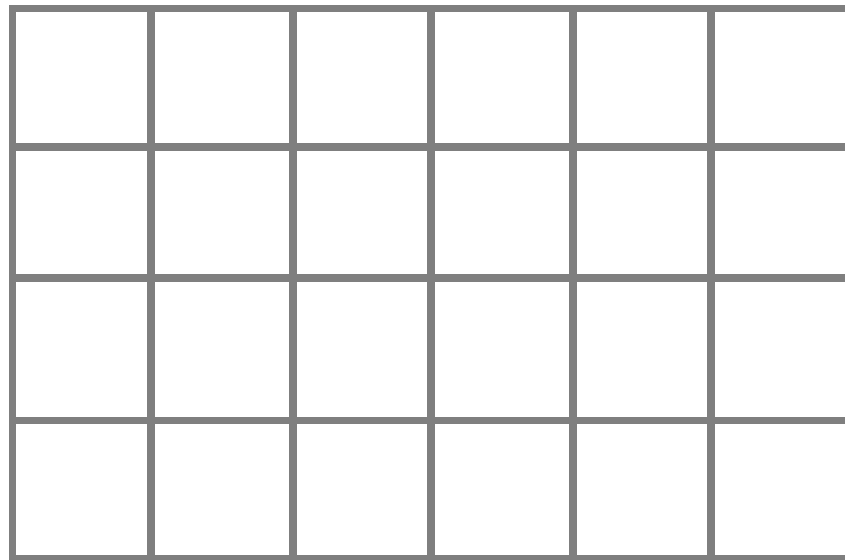
# The Geographical Unit

- This issue of irregularly shaped polygons created arbitrarily (such as county boundaries or block groups that have been created from a political process).



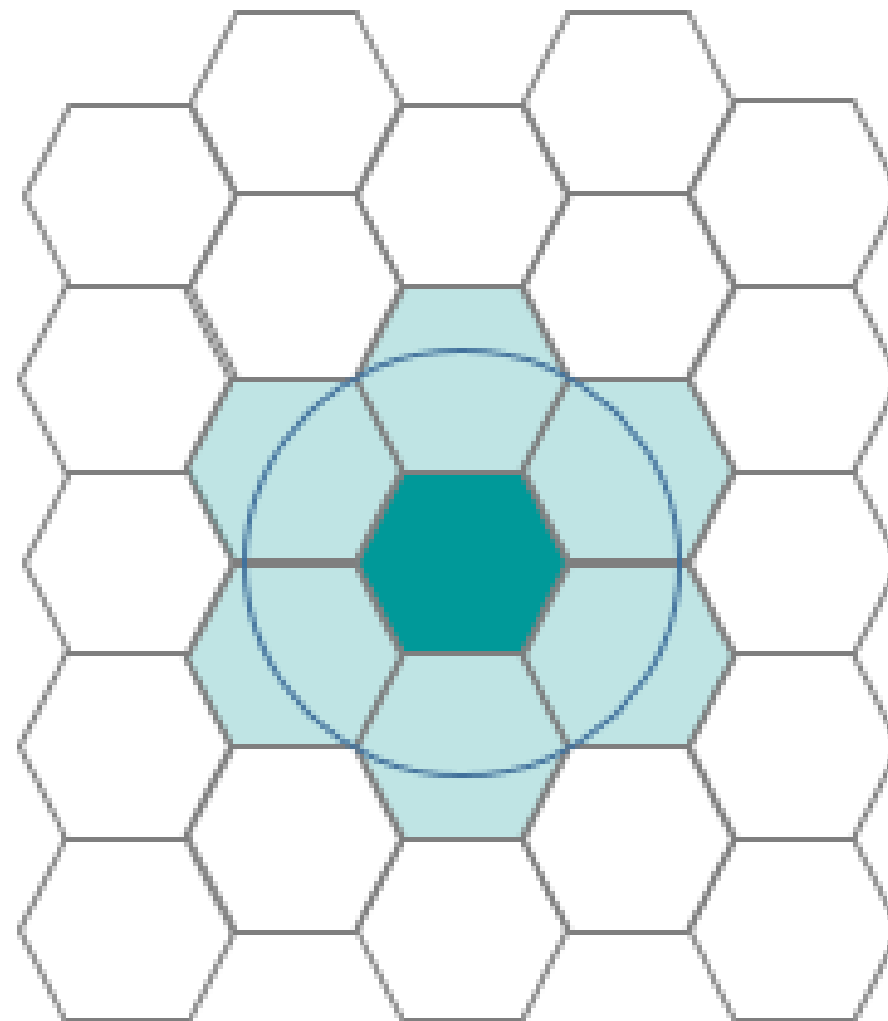
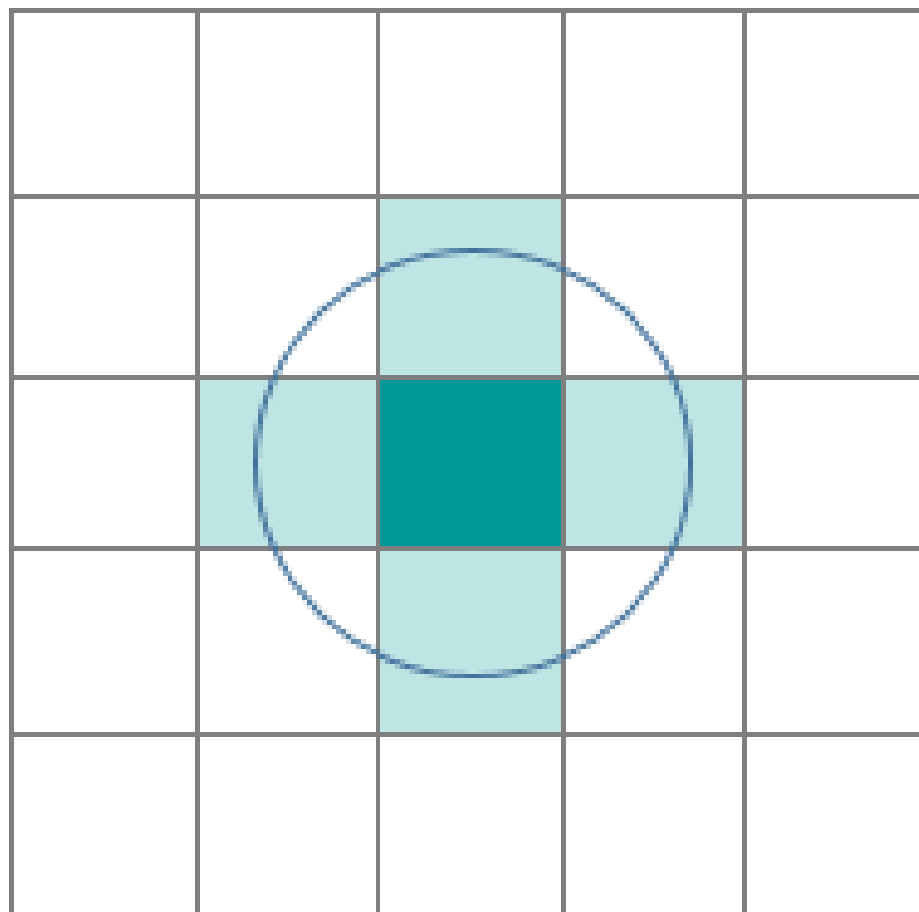
# The Geographical Unit

- Using regular shaped geometry such as square, hexagon or triangle to define geographical unit.



# The Geographical Unit

- Hexagons reduce sampling bias due to edge effects of the grid shape, this is related to the low perimeter-to-area ratio of the shape of the hexagon.
- A circle has the lowest ratio but cannot tessellate to form a continuous grid. Hexagons are the most circular-shaped polygon that can tessellate to form an evenly spaced grid.]





# The Geographical Unit

- An example of 250m radius hexagons covering Singapore main island.



# Distance to Nearest Location

The formula:

$$A_{ij} = \min(d_{ij})$$

$A_{ij}$  = Accessibility of zone i to location of type j  
 $d_{ij}$  = the distance between i and j

Limitation of the method:

- Does not consider the size/attractiveness of the closest location, thereby implicitly treating all locations as being equally attractive.
- Does not consider the cumulative effect of multiple accessible locations (e.g. is a zone that is within 1.1 km of two MRT stations inferior to one that is within 1.0 km of a single station?)

# The Potential Model

## The classic model

$$P_i = \sum_j \frac{M_j}{d_{ij}^\alpha}$$

$P_i$  = potential at point  $i$

$M_j$  = The size (attraction) of centre  $j$

$d_{ij}$  = the distance between  $i$  and  $j$

$\alpha$  = a parameter, usually between 1 and 2, reflecting the rate of increase of the friction of distance



# The Modified Potential Formula

$$P_i = \frac{\sum_j \left( \frac{M_j}{d_{ij}^{\alpha-1}} \right)}{\sum_k \left( \frac{M_k}{d_{ij}^{\alpha}} \right)}$$

$P_i$  = potential at point i

$M_j$  = The size (attraction) of centre j

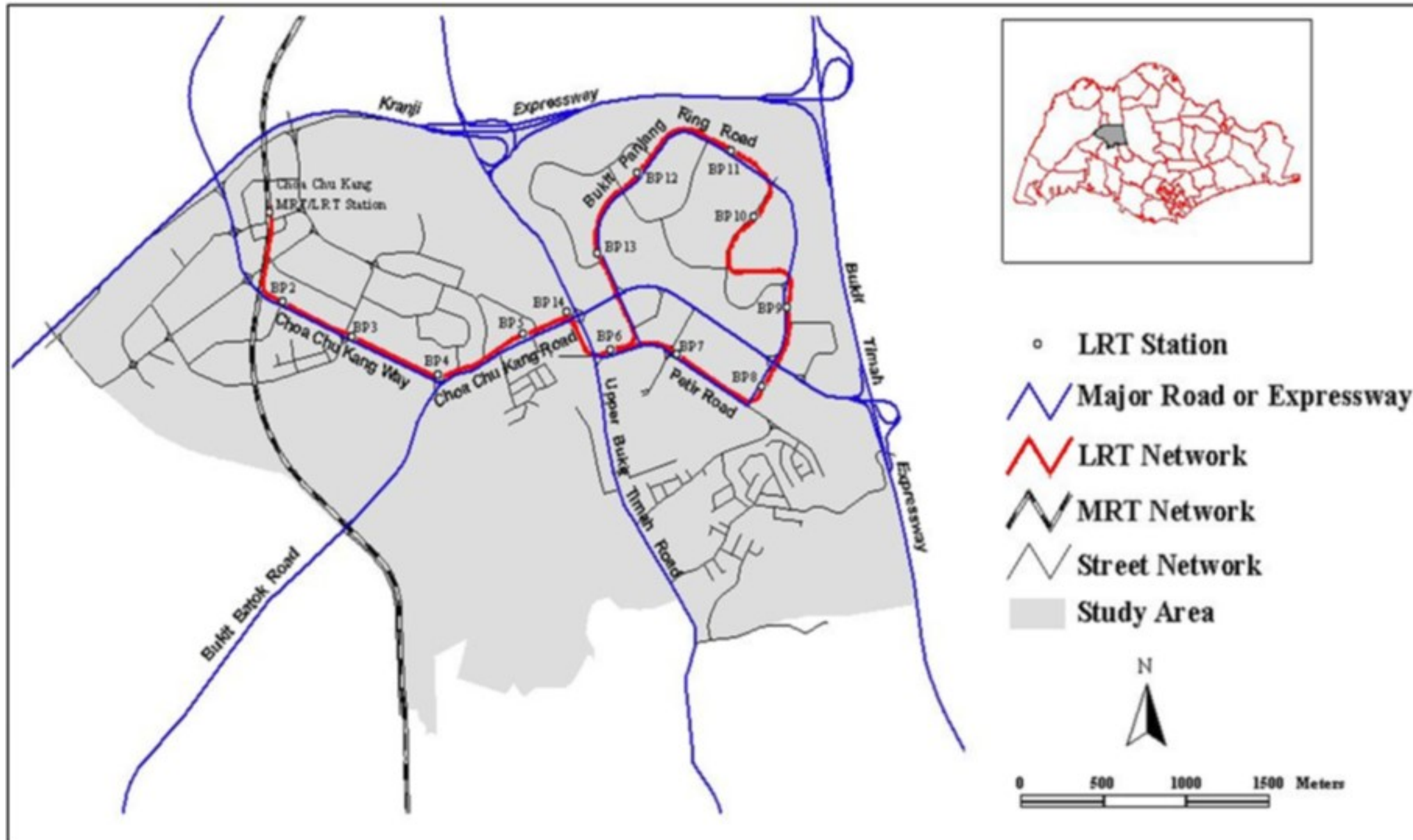
$d_{ij}$  = the distance between i and j

$\alpha$  = a parameter, usually between 1 and 2,  
reflecting the rate of increase of the friction  
of distance



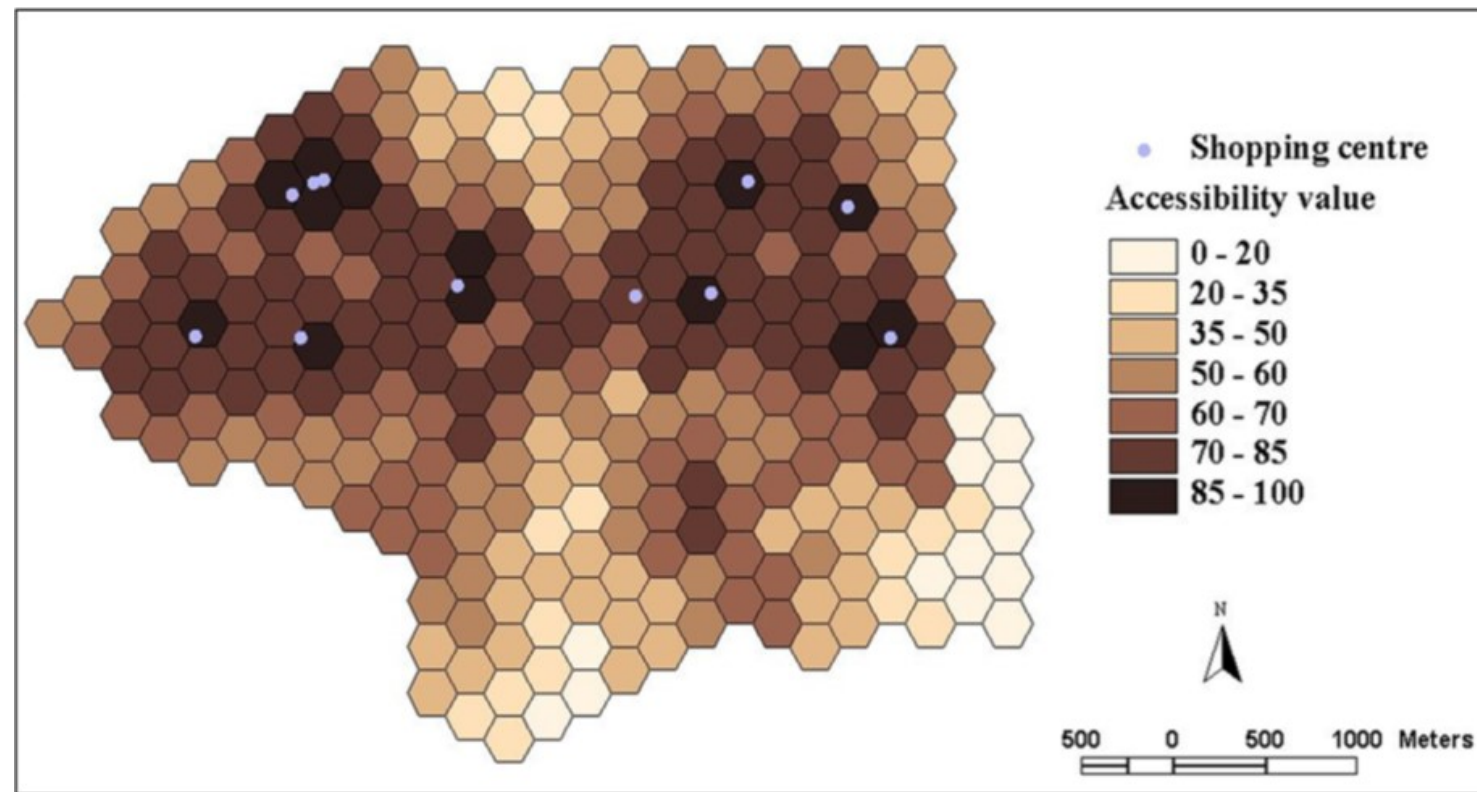
# Real world application of potential model

- Accessibility to urban functions study.

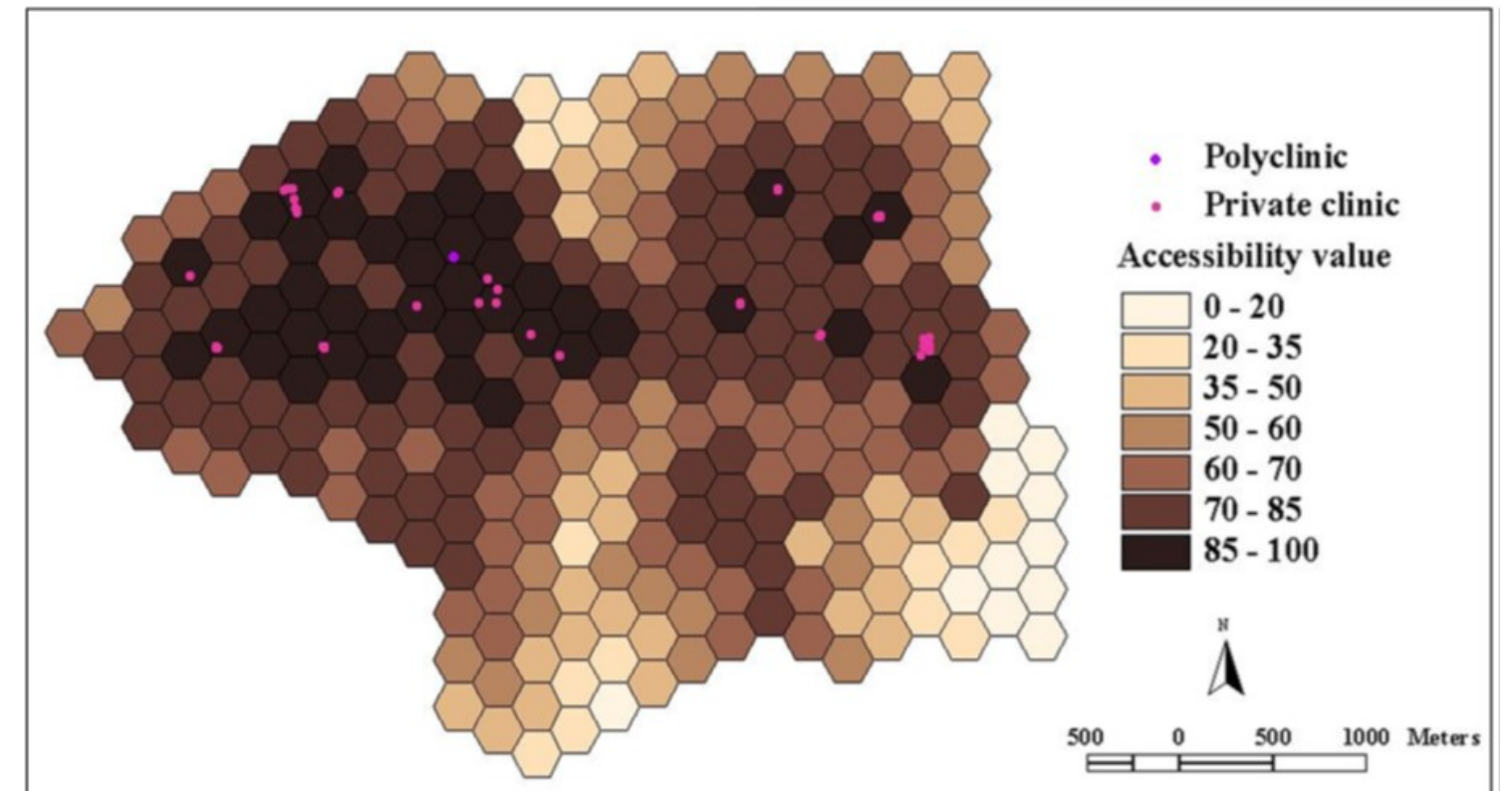


# Real world application of potential model

- Accessibility to shopping centres.

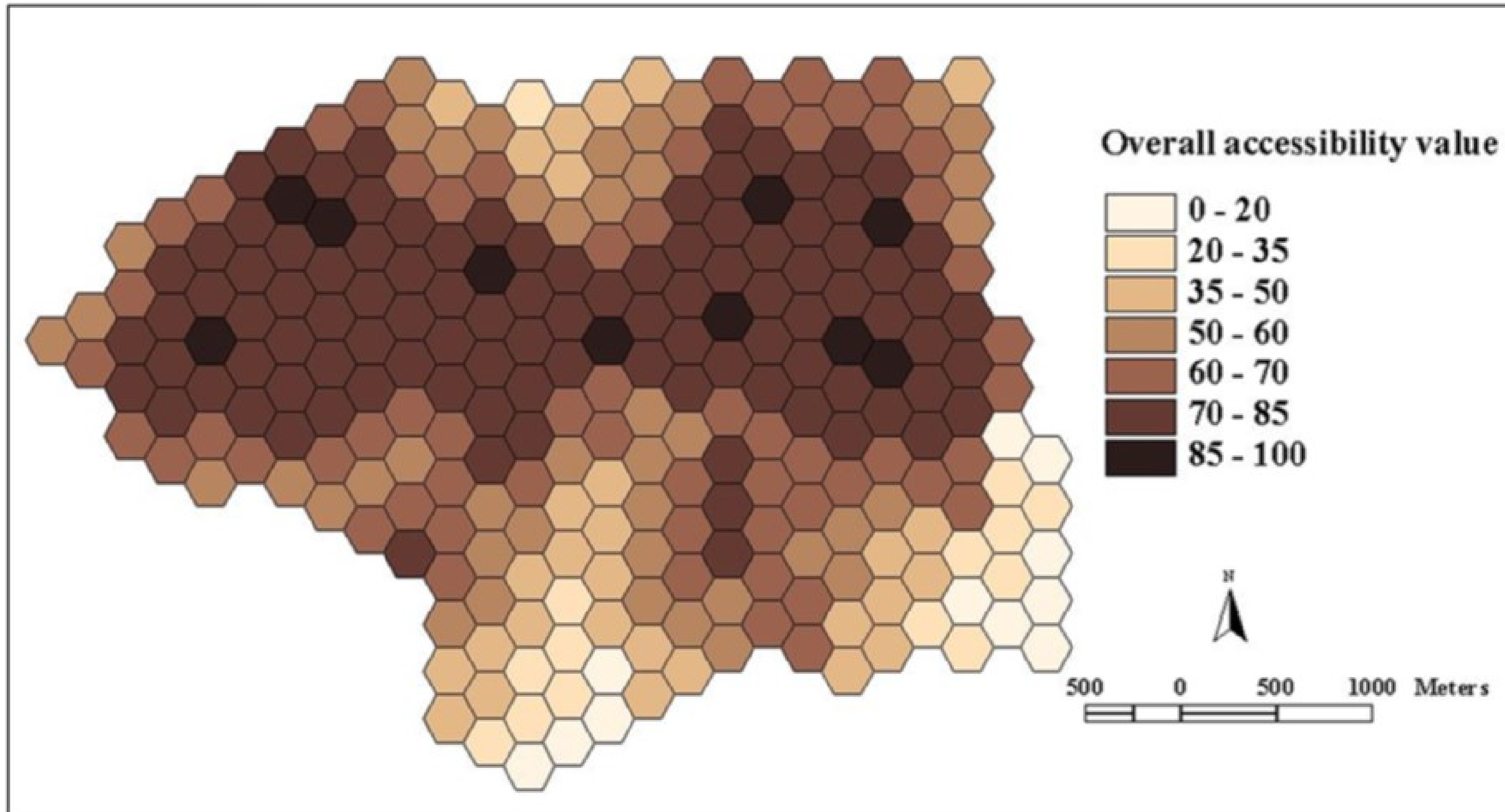


## Accessibility to health services



# Real world application of potential model

- Overall accessibility

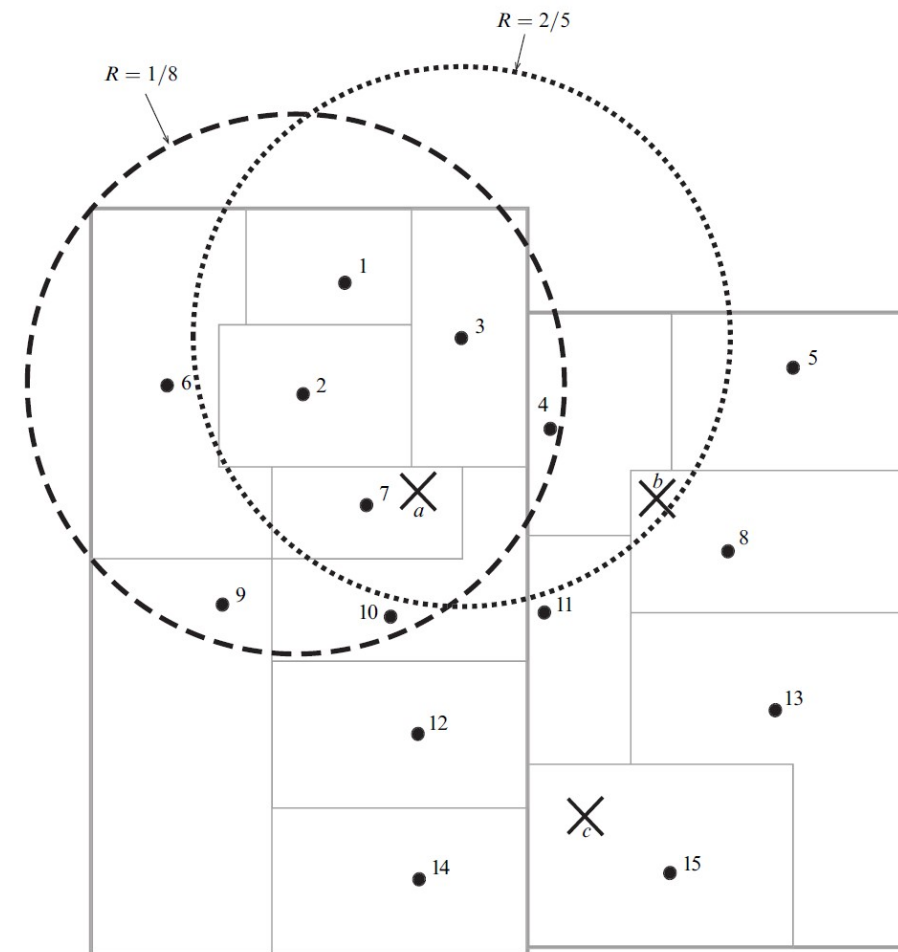


# Two-step floating catchment area method (2SFCA)

- A special case of a potential model for measuring spatial accessibility to primary social services and public facilities.
- It was inspired by the spatial decomposition idea first proposed by Radke and Mu (2000).

Reference: Luo, W.; Wang, F. (2003b). “Measures of spatial accessibility to health care in a GIS environment: synthesis and a case study in the Chicago region”. *Environment and Planning B: Planning and Design*. 30 (6): 865–884.

An earlier version of 2SFCA



- 15-mile catchment area for tract 2
- ..... 15-mile catchment area for tract 3
- <sup>1</sup> Census tract centroid and identifier
- ×<sub>a</sub> Physician location and identifier
- County boundary
- Census tract boundary

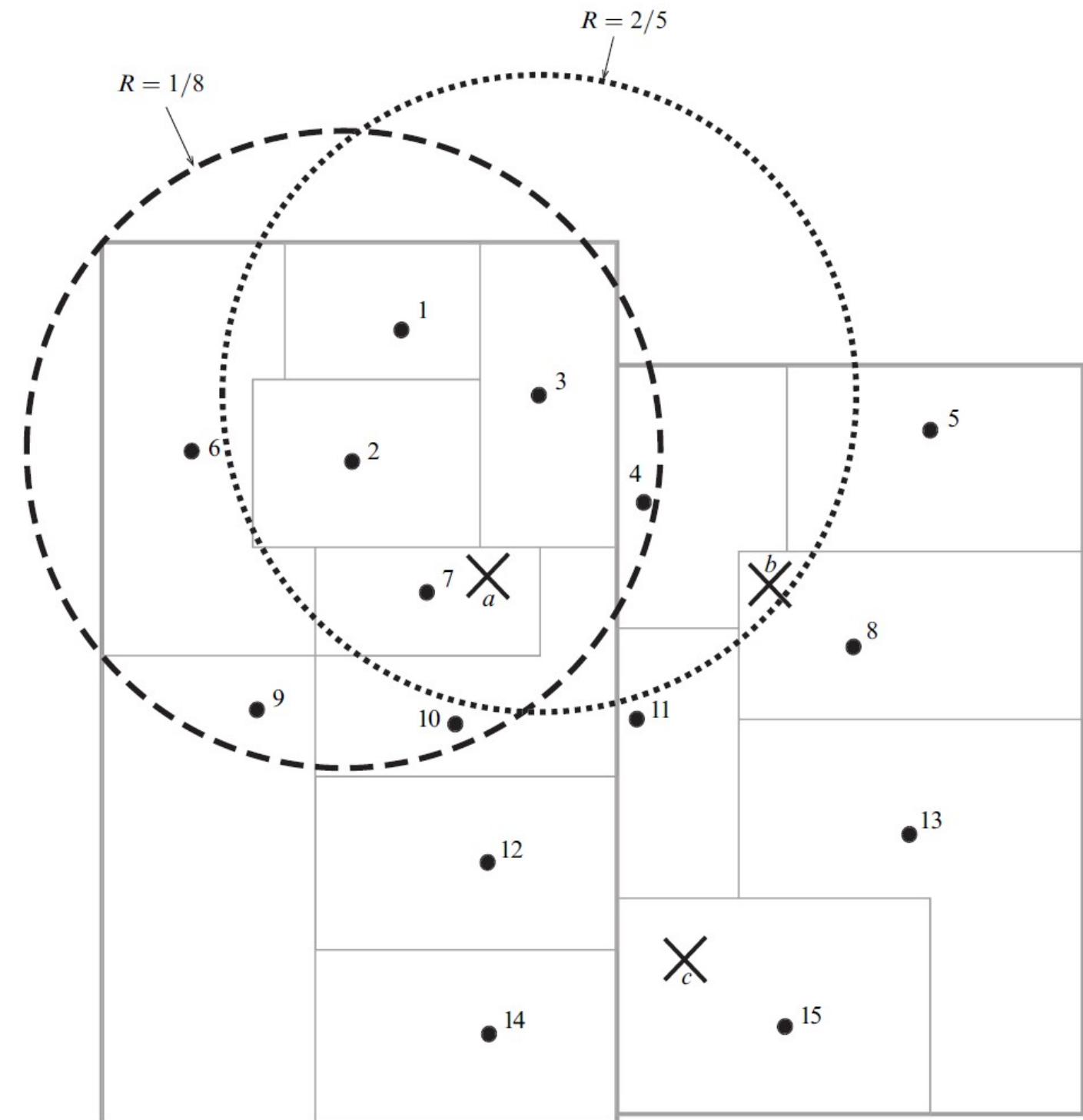


# Two-step floating catchment area method (2SFCA)

**Step 1:** For each physician location  $j$ , search all population locations ( $k$ ) that are within a threshold travel time ( $d_0$ ) from location  $j$  (that is, catchment area  $j$ ), and compute the physician-to-population ratio,  $R_j$ , within the catchment area:

$$R_j = \frac{S_j}{\sum_{k \in \{d_{kj} \leq d_0\}} P_k}$$

An earlier version of 2SFCA



--- 15-mile catchment area for tract 2

..... 15-mile catchment area for tract 3

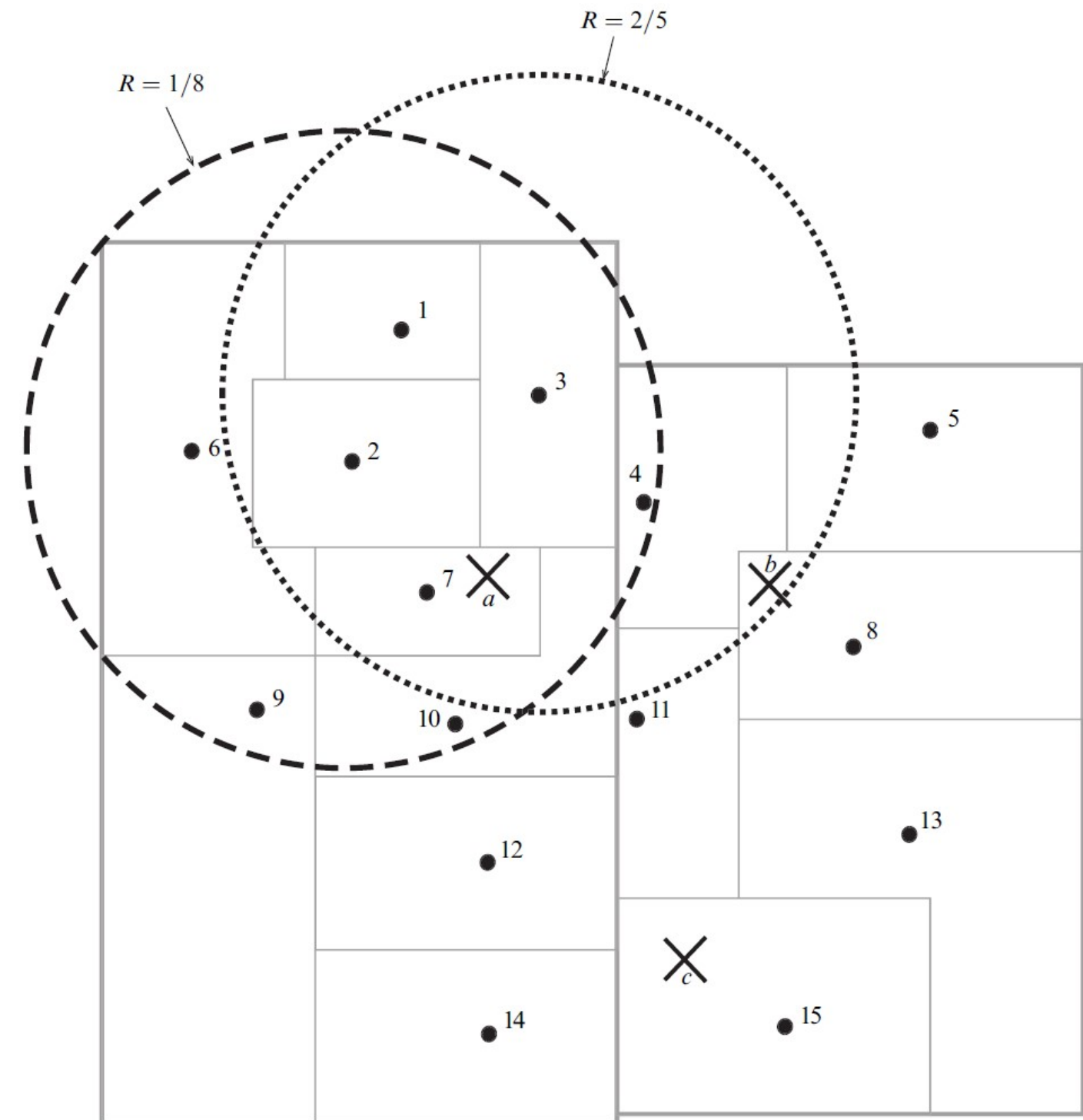
# Two-step floating catchment area method (2SFCA)



**Step 2:** For each population location  $i$ , search all physician locations ( $j$ ) that are within the threshold travel time ( $d_0$ ) from location  $i$  (that is, catchment area  $i$ ), and sum up the physician-to-population ratios,  $R_j$ , at these locations:

$$A_i^F = \sum_{j \in \{d_{ij} \leq d_0\}} R_j = \sum_{j \in \{d_{ij} \leq d_0\}} \frac{S_j}{\sum_{k \in \{d_{kj} \leq d_0\}} P_k}$$

An earlier version of 2SFCA.



--- 15-mile catchment area for tract 2

..... 15-mile catchment area for tract 3

# Enhanced Two-step Floating Catchment Area (E2SFCA)

**Step 1:** The catchment of physician location  $j$  is defined as the area within 30-min driving zone (Lee, 1991). Within each catchment, compute three travel time zones with minute breaks of 0–10, 10–20 and 20–30min (zones 1–3, respectively). Search all population locations ( $k$ ) that are within a threshold travel time zone ( $D_r$ ) from location  $j$  (this is catchment area  $j$ ), and compute the weighted physician-to-population ratio,  $R_j$ , within the catchment area as follows:

$$R_j = \frac{S_j}{\sum_{k \in \{d_{kj} \in D_r\}} P_k W_r}$$

$$= \frac{S_j}{\sum_{k \in \{d_{kj} \in D_1\}} P_k W_1 + \sum_{k \in \{d_{kj} \in D_2\}} P_k W_2 + \sum_{k \in \{d_{kj} \in D_3\}} P_k W_3}$$

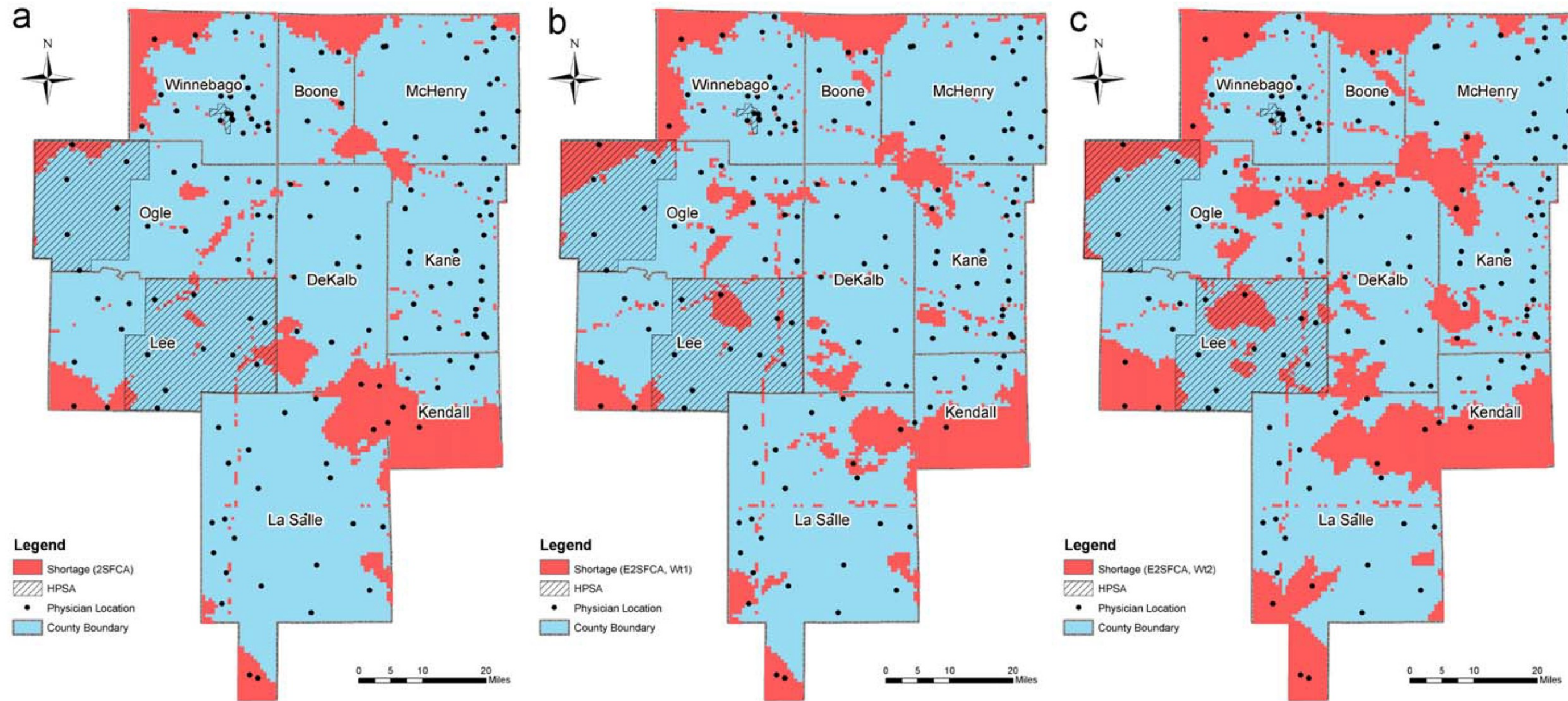
**Step 2:** For each population location  $i$ , search all physician locations ( $j$ ) that are within the 30min travel time zone from location  $i$  (that is, catchment area  $i$ ), and sum up the physician-to-population ratios (calculated in step 1),  $R_j$ , at these locations as follows:

$$A_i^F = \sum_{j \in \{d_{ij} \in D_r\}} R_j W_r$$

$$= \sum_{j \in \{d_{ij} \in D_1\}} R_j W_1 + \sum_{j \in \{d_{ij} \in D_2\}} R_j W_2 + \sum_{j \in \{d_{ij} \in D_3\}} R_j W_3$$



# Comparing 2SFCA and E2SFCA



**Fig. 6.** Spatial distribution of shortage areas identified with 2SFCA (a), E2SFCA with weight1 (b), and weight 2 (c), along with published HPSA of 2000 by DHHS.

Reference: Luo, Wei., Qi, Yi. (2009) "An enhanced two-step floating catchment area (E2SFCA) method for measuring spatial accessibility to primary care physicians", *Health & Place*, 2009, Vol.15 (4), p.1100-1107.

# Spatial Accessibility Measure (SAM)

The formula:

$$A_{ai} = 1/p_i \sum_j \frac{n_j}{p_i * d_{ij}^2}$$

where

- $A_{ai}$  is the accessibility in ED  $i$ ,
- $n_j$  is the capacity of the target facility  $j$ .
- $p_i$  is the demand of this ED, and
- $d_{ij}$  is the network distance between the  $ED_i$  and each facility  $j$ .

Reference: Stamatis Kalogirou & Ronan Foley (2006) “[Health, place and Hanly: Modelling accessibility to hospitals in Ireland](#)”, *Irish Geography*, Volume 39(1), 2006, 52-68.

