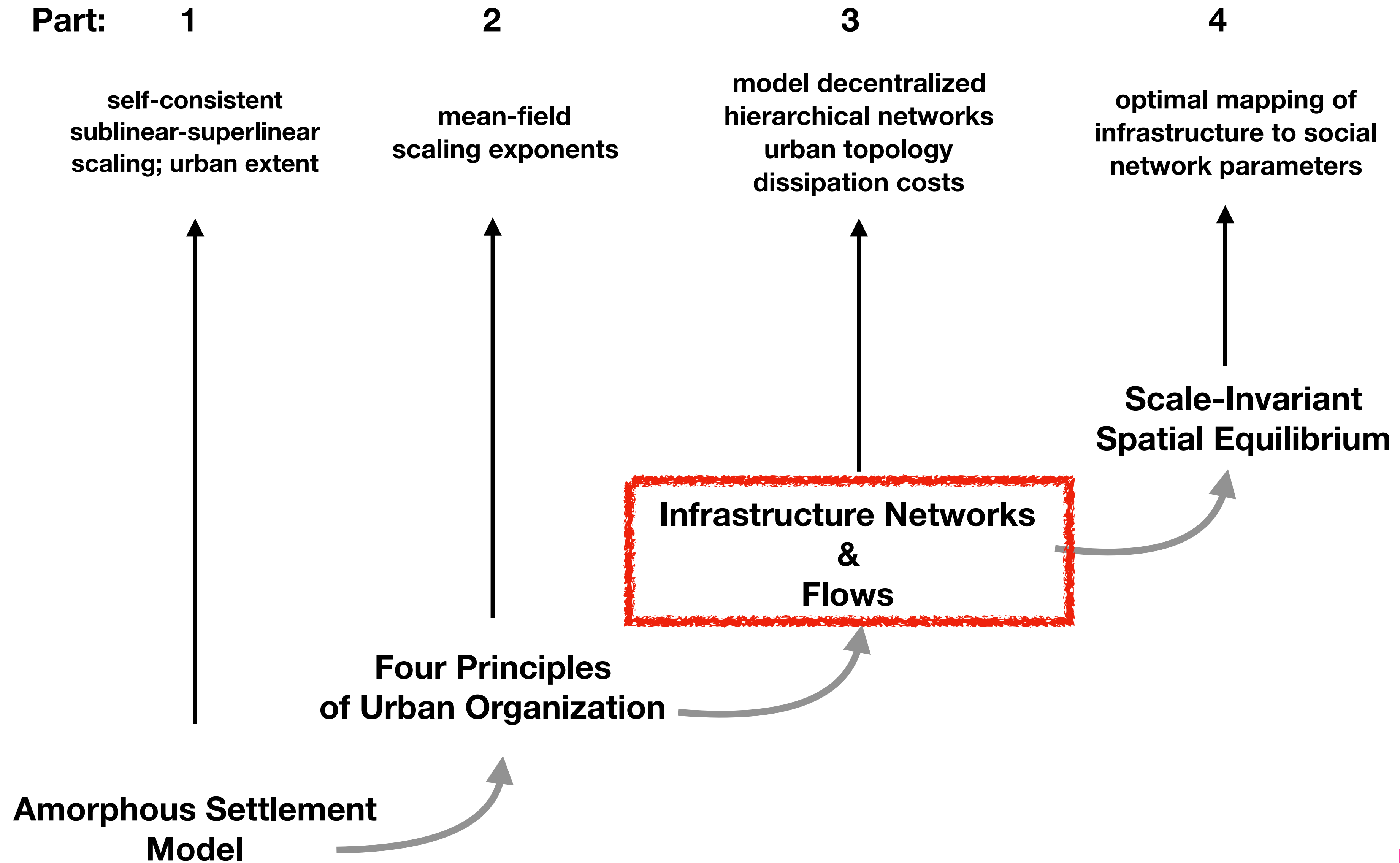


# **Lecture 7**

## **Network Models of Cities**

### **7.3 Urban Infrastructure, Energy Costs of Movement, Spatial Equilibrium**

# Urban Scaling Theory



**To get closer to the right answer need:**

**To understand fundamental constraints on human interactions**

**To understand the general characteristics of urban spaces**

**A better model of social interactions over built space**

**To better compute costs of transportation and land rents**



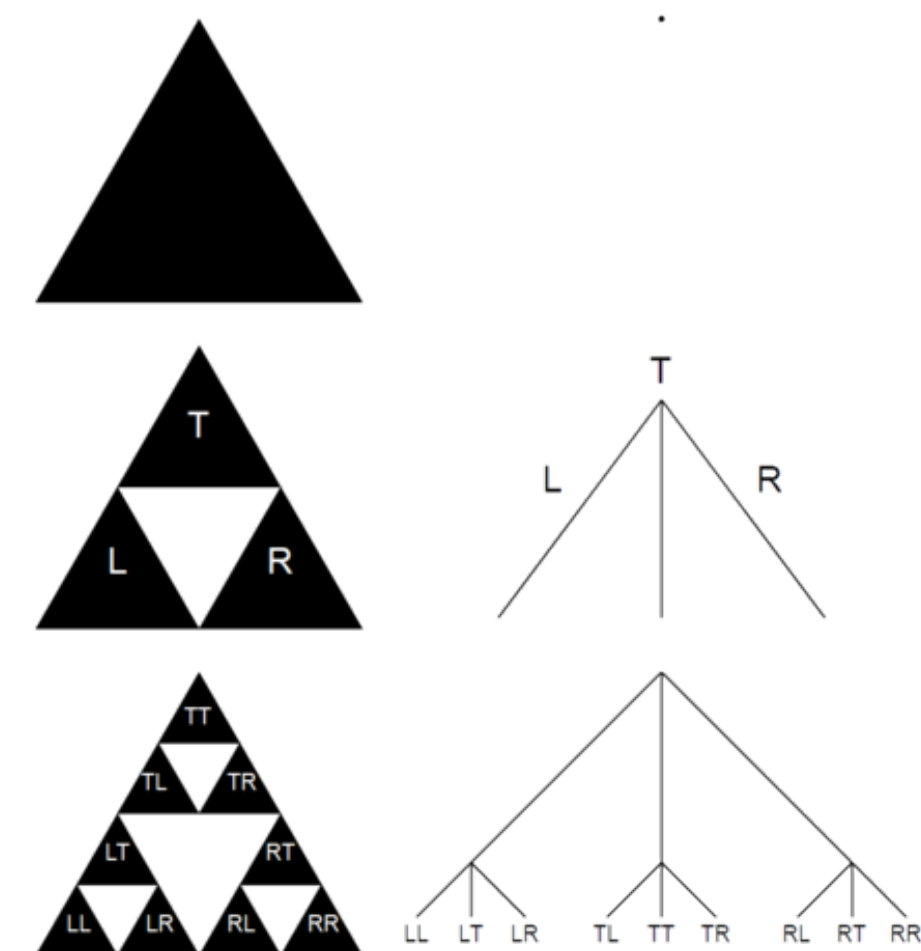
# The Scale-Independence of City Size

in the presence of increasing returns and transportation costs

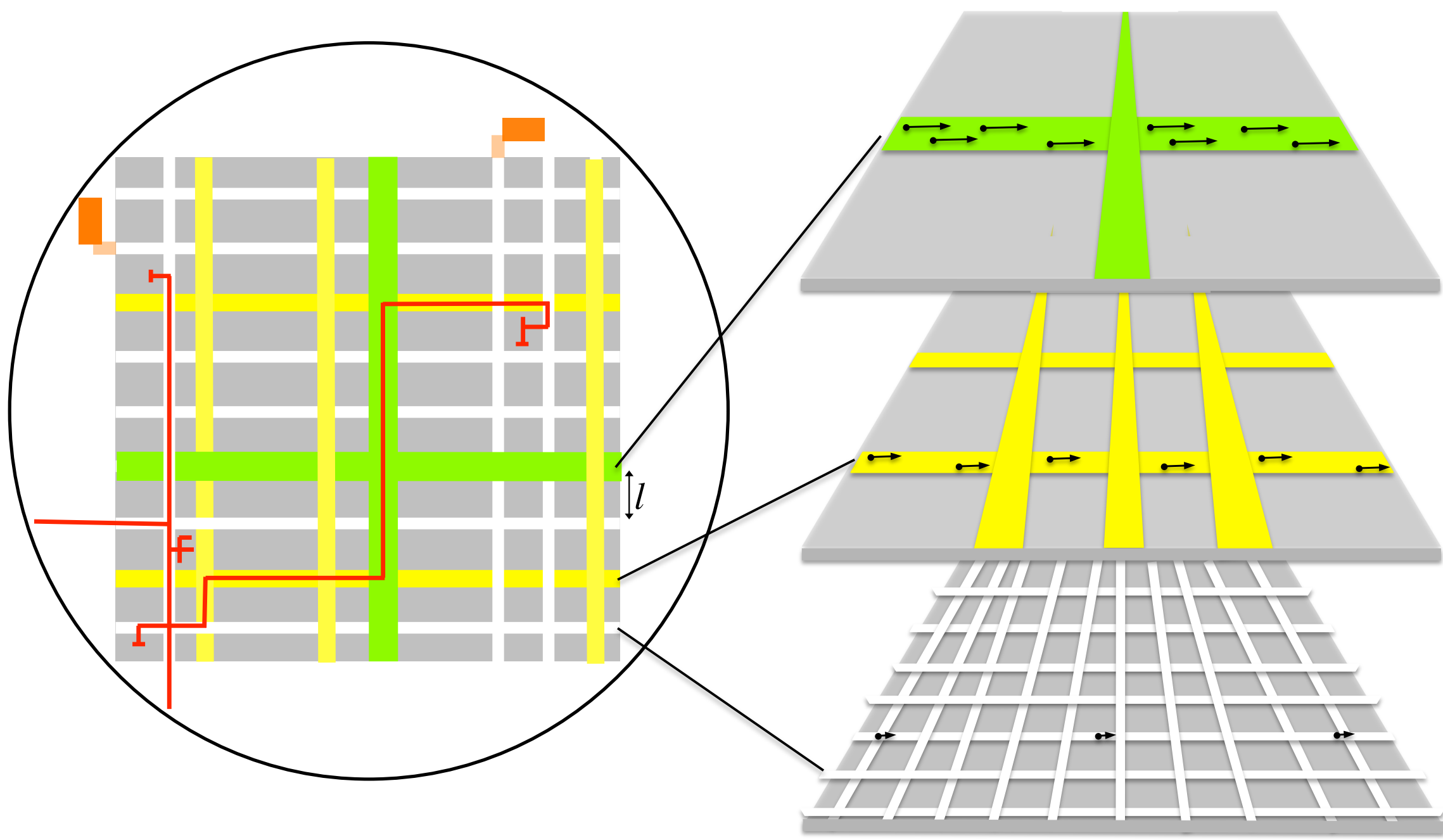
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1. Detailed Model of **Urban Infrastructure**
2. General Model of **Cost of Transportation in Cities**
3. The Properties of **Scale-Independent Equilibrium**

Infrastructure Networks in the City have a Hierarchy



remember?



$i = 0$  Highways: wider + faster

units of infrastructure at level  $i$   $N_i = b^i$  Main Roads

infrastructure hierarchy levels  $i = h$   $h = \frac{\ln N}{\ln b}$   $N = b^h$  Local Roads

$s_i = s_* b^{(1-\delta)(h-i)}$  width segments

$s_0 = s_* b^{(1-\delta)h} \gg s_h = s_*$

width highways

width doorways

keeps increasing with city size (and individual flows)

same everywhere

$a_i = ab^{(\alpha-1)i}$  land area segments

$a_h = ab^{(\alpha-1)h} = aN^{\alpha-1}$  land area per person

$l_i = \frac{a_i}{l}$  infrastructure length segments

$l_h = \frac{a}{l} N^{\alpha-1}$  minimal distance between people

# We will need this math trick to sum over levels of hierarchies:

Sum of geometric series:

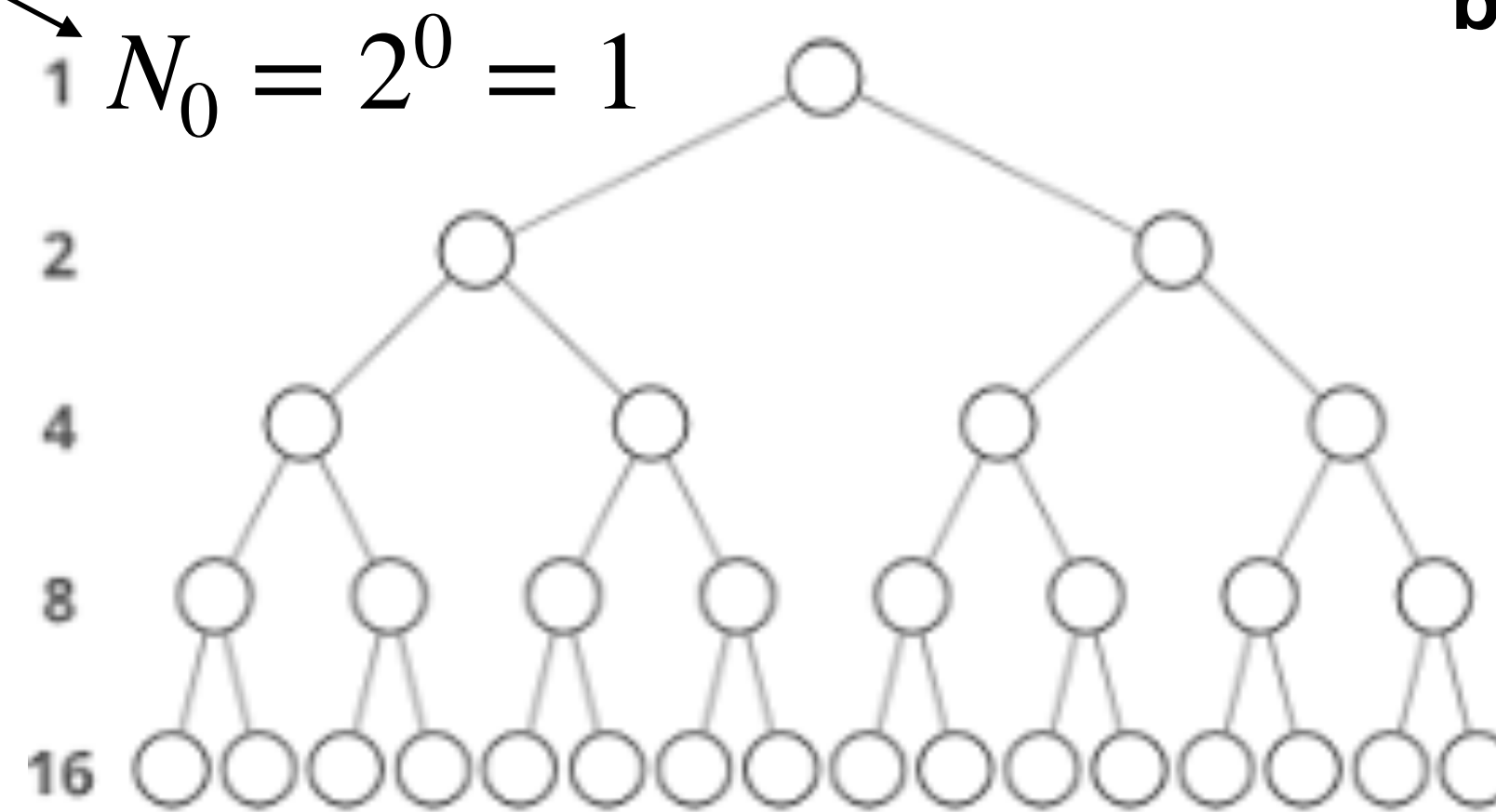
$$a + ar + ar^2 + ar^3 + \dots + ar^{n-1} = \sum_{k=0}^{n-1} ar^k = a \left( \frac{1 - r^n}{1 - r} \right),$$

number of nodes at level 0 (root)

hierarchical networks  
(exponentials)

branching ratio:  $b=2$

$i=0$   
 $i=1$   
 $i=2$   
 $i=3$   
 $i=h=4$



This is a form of self-similarity (~fractals)

$N_h = b^h = 2^4 = 16$

number of nodes at level h (leaves)

## Sum of geometric series

$$a + ar + ar^2 + ar^3 + \dots + ar^{n-1} = \sum_{k=0}^{n-1} ar^k = a \left( \frac{1 - r^n}{1 - r} \right),$$

## Total Length and Area of Infrastructure Networks

$$L_n = \sum_{i=0}^h l_i N_i = \frac{a}{l} \sum_{i=0}^h b^{\alpha i} = \frac{a}{l} \frac{b^{\alpha(h+1)} - 1}{b^{\alpha} - 1} \simeq L_0 N^{\alpha}, \quad L_0 = a/l,$$

Length is area filling  
 $L \sim A$

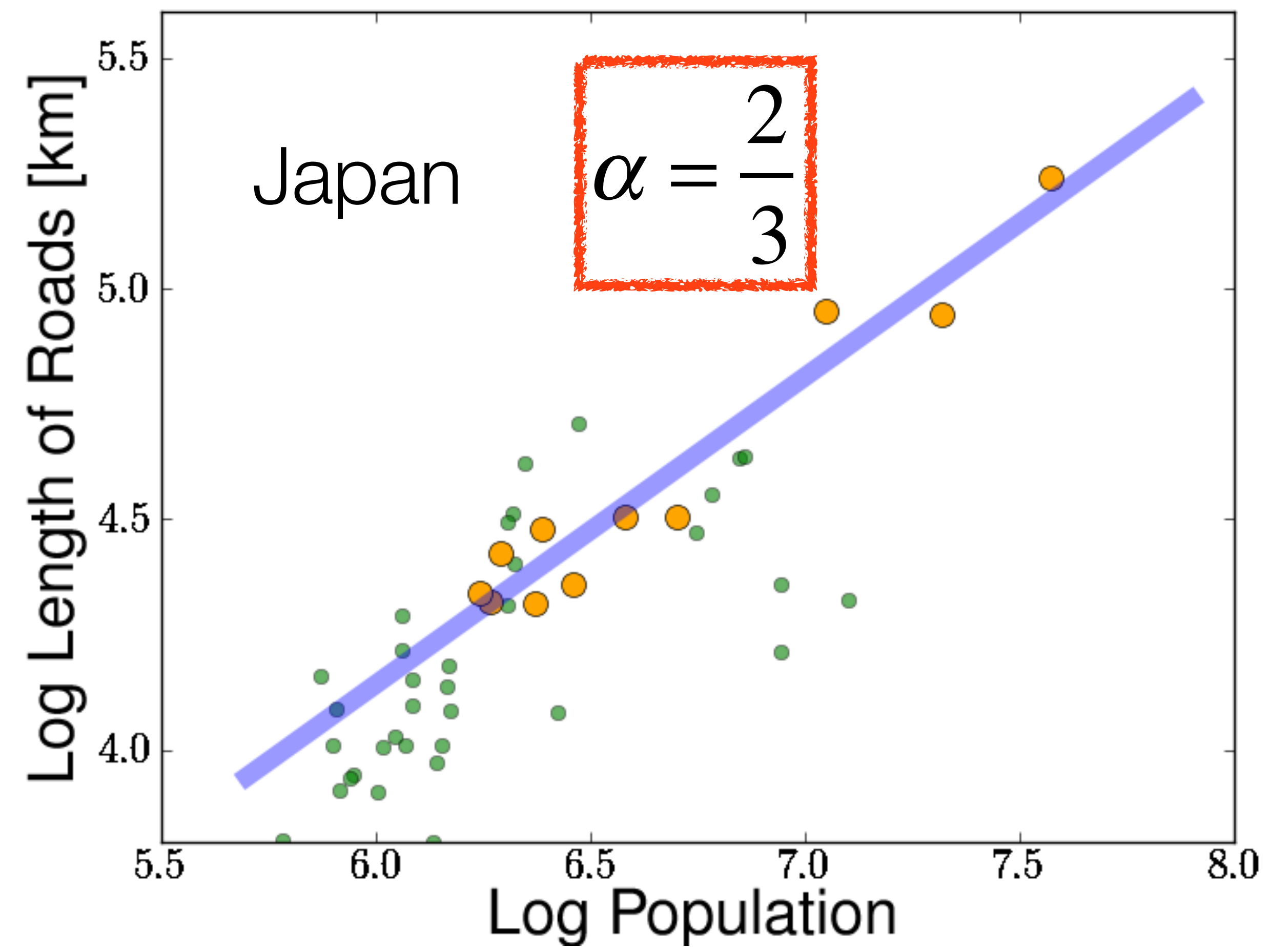
$$A_n = \sum_{i=0}^h s_i l_i N_i = s_* \frac{a}{l} b^{(1-\delta)h} \sum_{i=0}^h b^{(\alpha+\delta-1)i} \simeq A_0 N^{1-\delta}, \quad A_0 = \frac{s_* a}{l(1 - b^{\alpha+\delta-1})},$$

width of network

This gives us back our empirical observations with

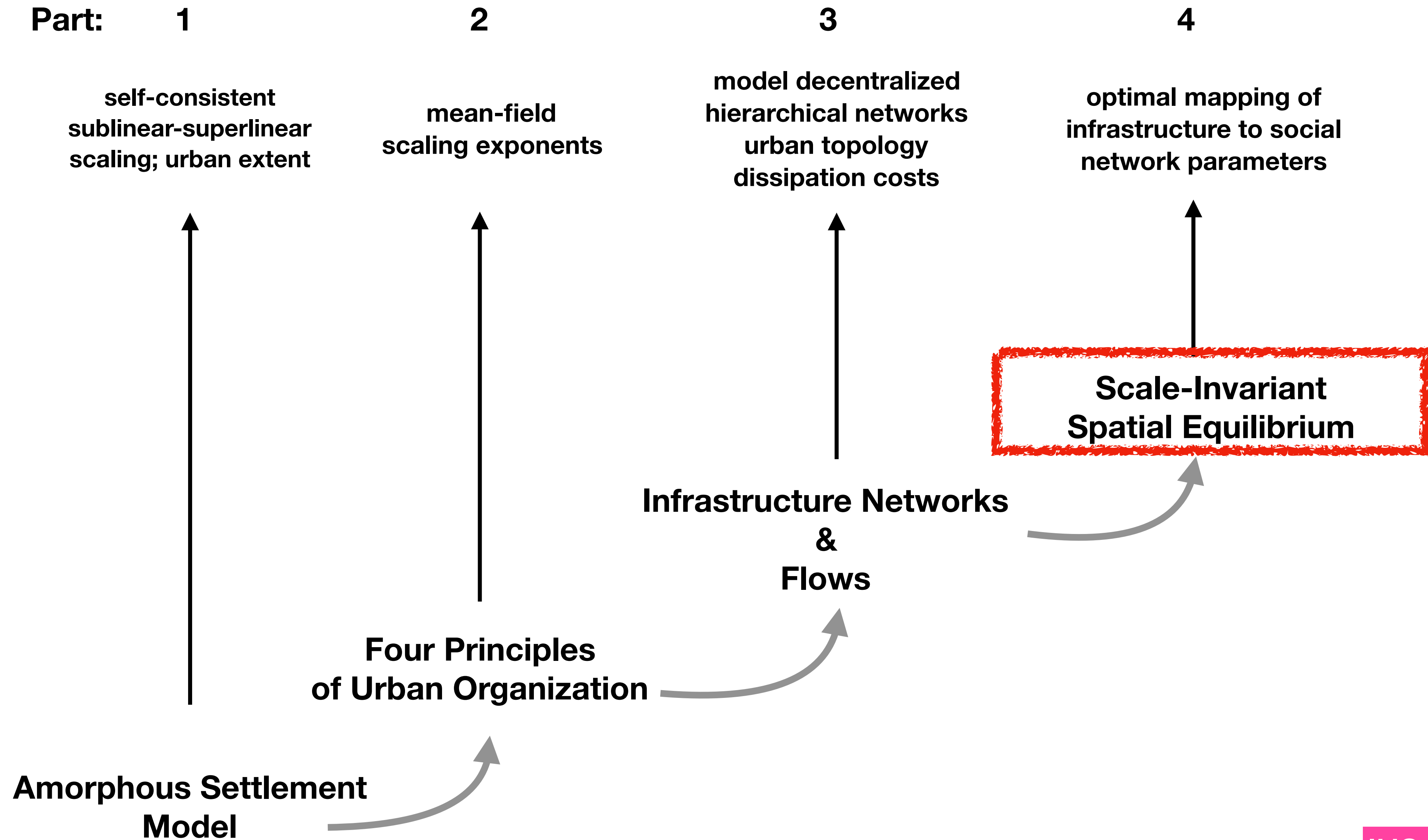
but now also gives us a theory of the entire infrastructure of cities

$$\alpha = \frac{2}{3}; \quad \delta = \frac{1}{6}$$





# Urban Scaling Theory



# The Cost of Socializing in the City

## Conservation of Current across infrastructural levels

$$J_i = s_i \rho_i v_i N_i = s_{i-1} \rho_{i-1} v_{i-1} N_{i-1} = J_{i-1}$$

$$\rho_0 v_0 \gg \rho_h v_h$$

$$\rho_i v_i = b^{\delta(h-i)} \rho_* v_*$$

flow per unit area

**highways**

faster and more densely packed

**doorways**

the same everywhere

$$J_i = J = J_0 N, \text{ with } J_0 = s_* \rho_* v_*$$

**Resistance** accounts for Cost of Movement:

$$r_i = r \frac{l_i}{s_i} \quad R_i = \frac{r_i}{N_i} = \frac{ar}{ls_*} b^{-(1-\alpha+\delta)i-(1-\delta)h}$$

Parallel resistance because flow can take alternate routes (decentralized networks)

$$W = J^2 \sum_{i=1}^h R_i = J^2 \frac{ar}{ls_*} b^{-(1-\delta)h} \frac{1 - b^{-(1-\alpha+\delta)(h+1)}}{1 - b^{-1+\alpha-\delta}} \simeq W_0 N^{1+\delta}, \quad W_0 = \frac{arJ_0^2}{ls_*(1 - b^{-1+\alpha-\delta})}$$

Cost of Transportation scales super linearly  
like Social Benefits -> Spatial Equilibrium independent of City population size

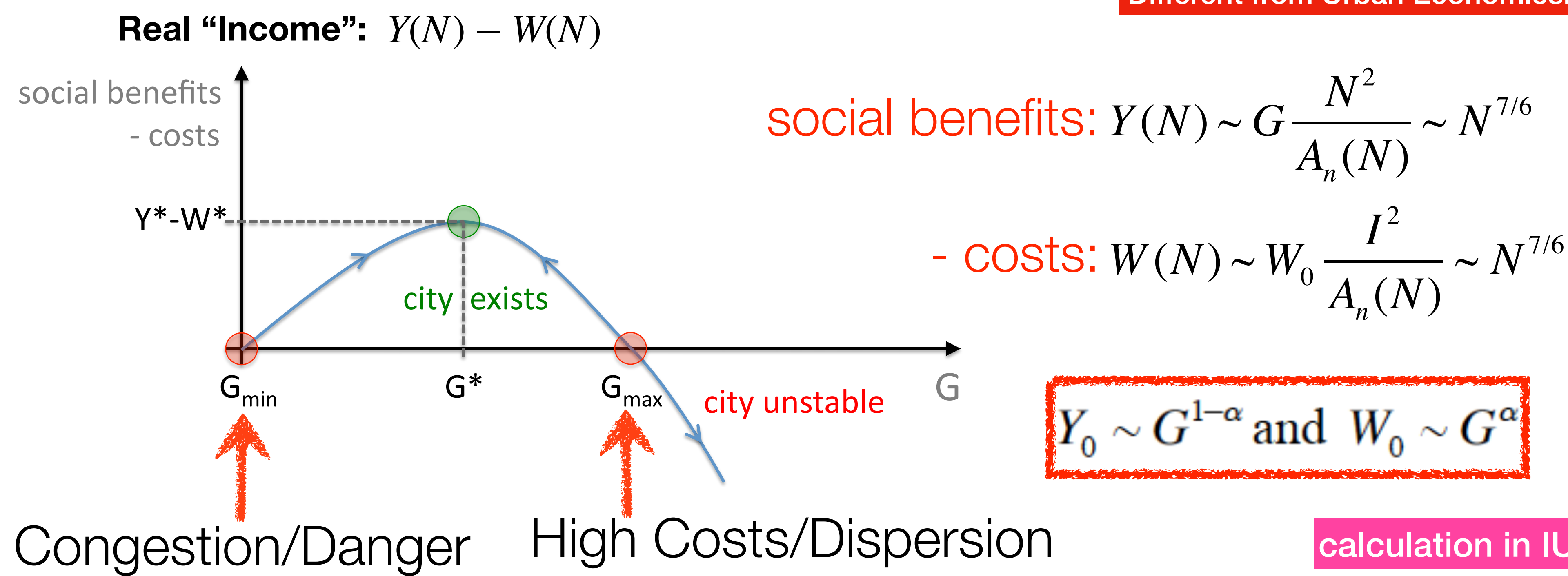
**New (scale-invariant) Spatial Equilibrium**



# Spatial equilibrium between networked social benefits and costs

Scale invariance: cities can exist at “any” population size

Different from Urban Economics: V Henderson



~Lagos



Poor, congested, intense, dangerous



~"Florida"

Diffuse, sprawling, uneventful

# Human Effort is conserved: **Estimating G**

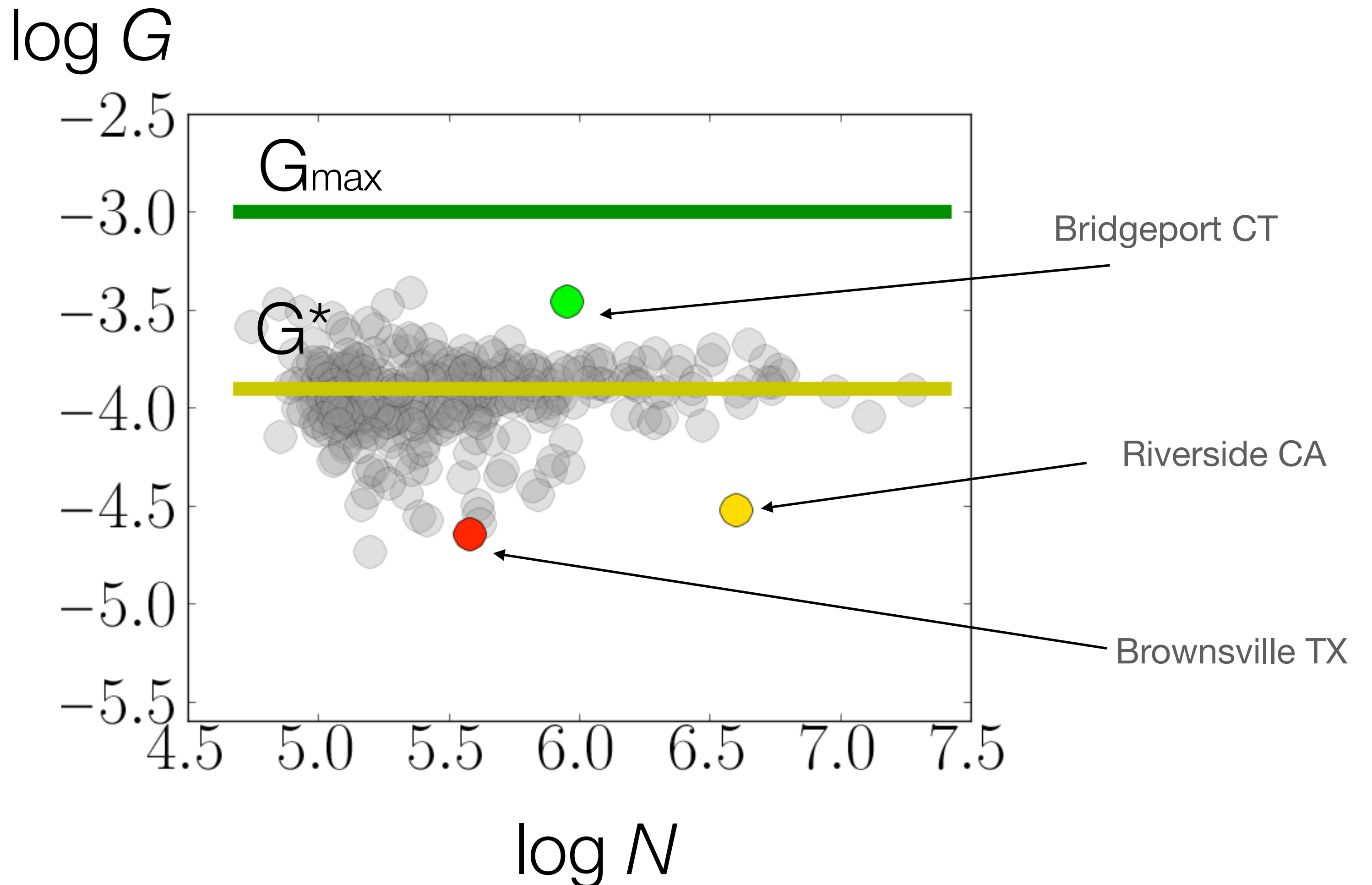
The parameter  $G$  measures the strength of social interactions over a life path.

For a city it is:

$$G = \left( \frac{Y}{N} \right) \left( \frac{A_n}{N} \right) = a_0 \ell \bar{g}$$

average income x average area per capita

Total “freedom” = social x spatial freedom



**Tradeoff between more Social Space versus more Physical Space**



## Many quantitative predictions + general consequences

Urban scaling relation	Exponent prediction $D = 2, H_m = 1$	Exponent prediction General $D, H_m$
Land area $A = aN^\alpha$	$\alpha = 2/3$	$\alpha = \frac{D}{D + H_m}$
Network volume $A_n = A_0 N^\nu$	$\nu = 5/6$	$\nu = 1 - \delta$
Network Length $L_n = L_0 N^\lambda$	$\lambda = 2/3$	$\lambda = \alpha$
Interactions/capita $k = k_0 N^\delta$	$\delta = 1/6$	$\delta = \frac{H}{D(D + H_m)}$
Social outputs $Y = Y_0 N^\beta$	$\beta = 7/6$	$\beta = 1 + \delta$
Power dissipation $W = W_0 N^\omega$	$\omega = 7/6$	$\omega = 1 + \delta$
Land rents (\$/m <sup>2</sup> ) $P_L = P_0 N^{\beta_L}$	$\beta_L = 4/3$	$\beta_L = 1 + 2\delta$

Summary of Urban Scaling relations and exponent predictions for various important quantities. Note that agglomeration effects vanish when  $H_m \rightarrow 0$  because then people remain spatially separated social networks fail to emerge (we will look at internet quantities later).