

# **Lecture 10**

**The differences between cities, inequality and generating processes**

## **10.1 Statistical Distributions of Urban Quantities, Inequality, stochastic processes**

IUS 4.2

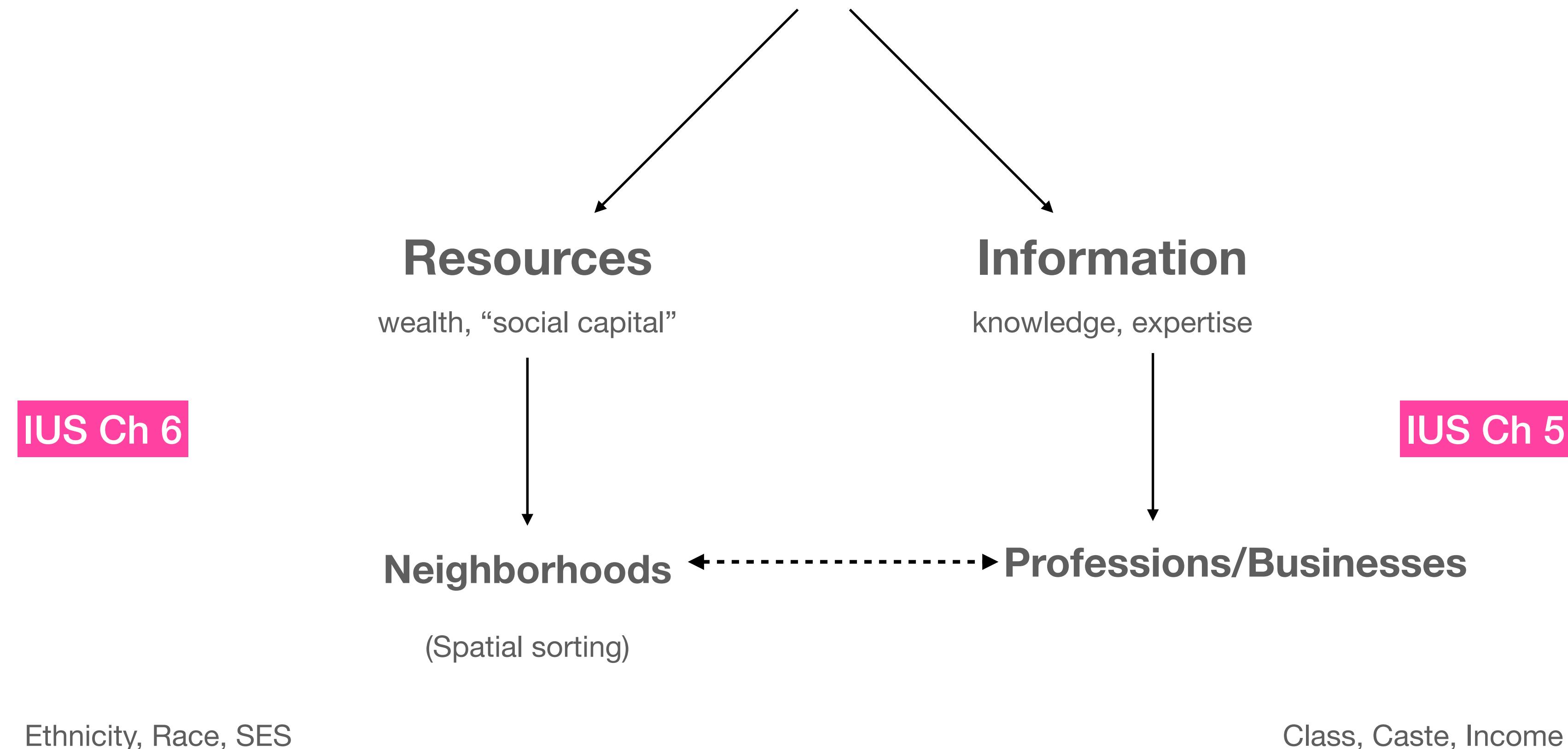
We want to explain why **deviations from scaling** for each city

have the **observed distribution (lognormal)**

This is connected to how they **use resources and information** at the individual and firm levels

and brings in the problems of **growth and inequality**

## Inequality and statistics of variation in cities



# CAPITAL

*in the Twenty-First Century*

## THOMAS PIKETTY

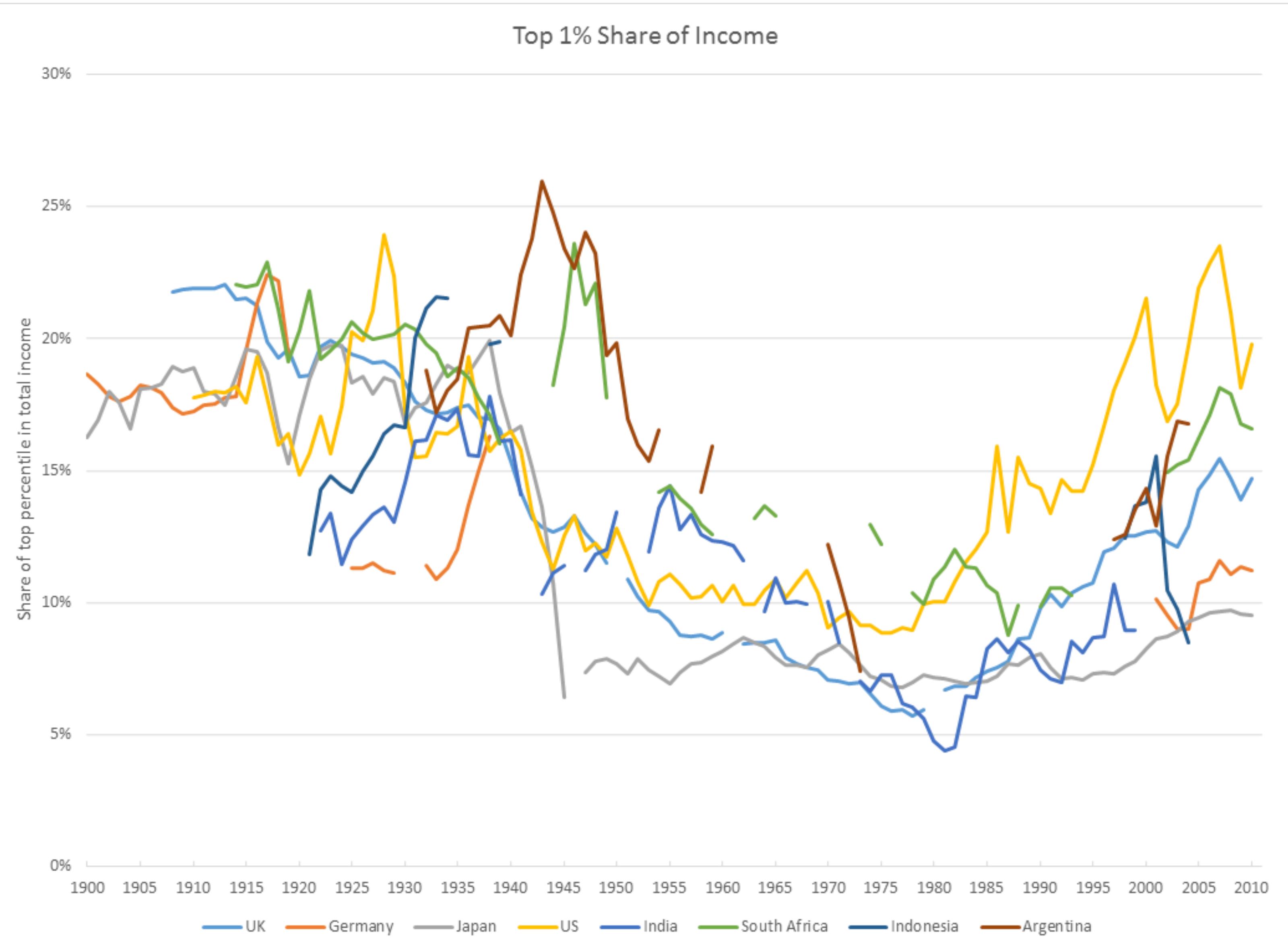
TRANSLATED BY ARTHUR GOLDHAMMER

2013

## The Classic Approach to Economic Inequality

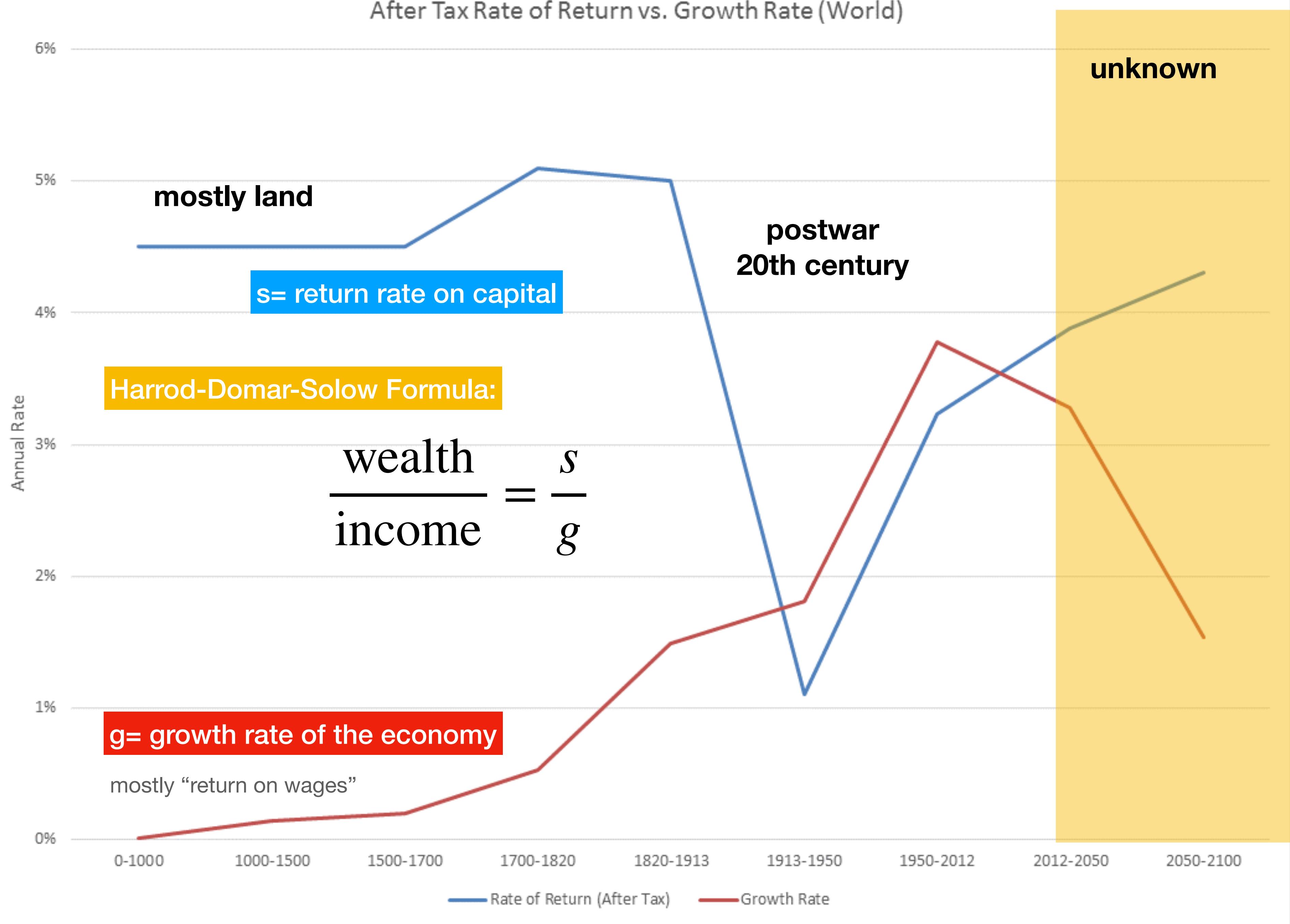
nations

Top 1% Share of Income



Thomas Piketty

## After Tax Rate of Return vs. Growth Rate (World)



**But many sources and forms of inequality...**

# The American Economy Is Rigged

And what we can do about it

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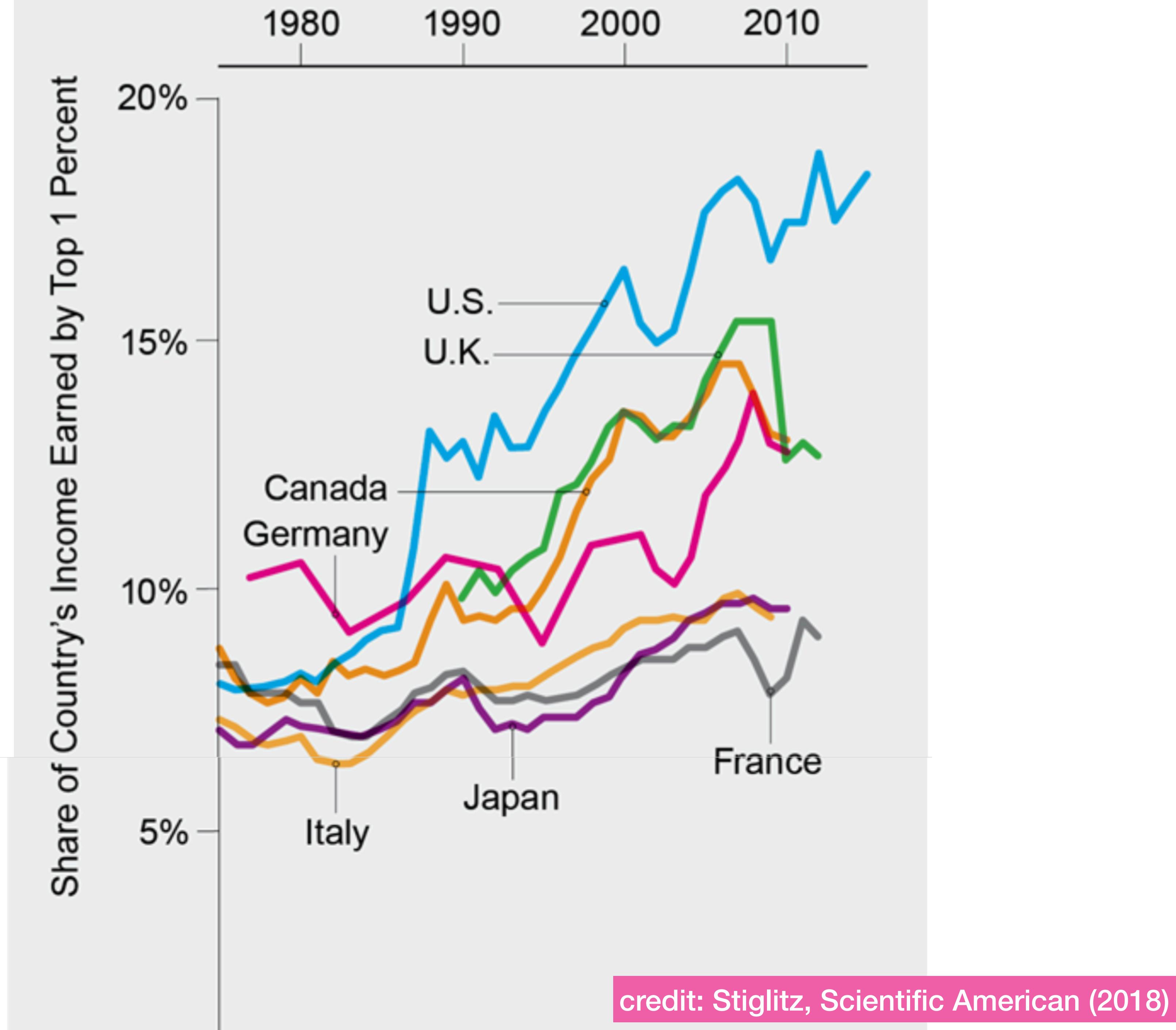
By Joseph E. Stiglitz | Scientific American November 2018 Issue

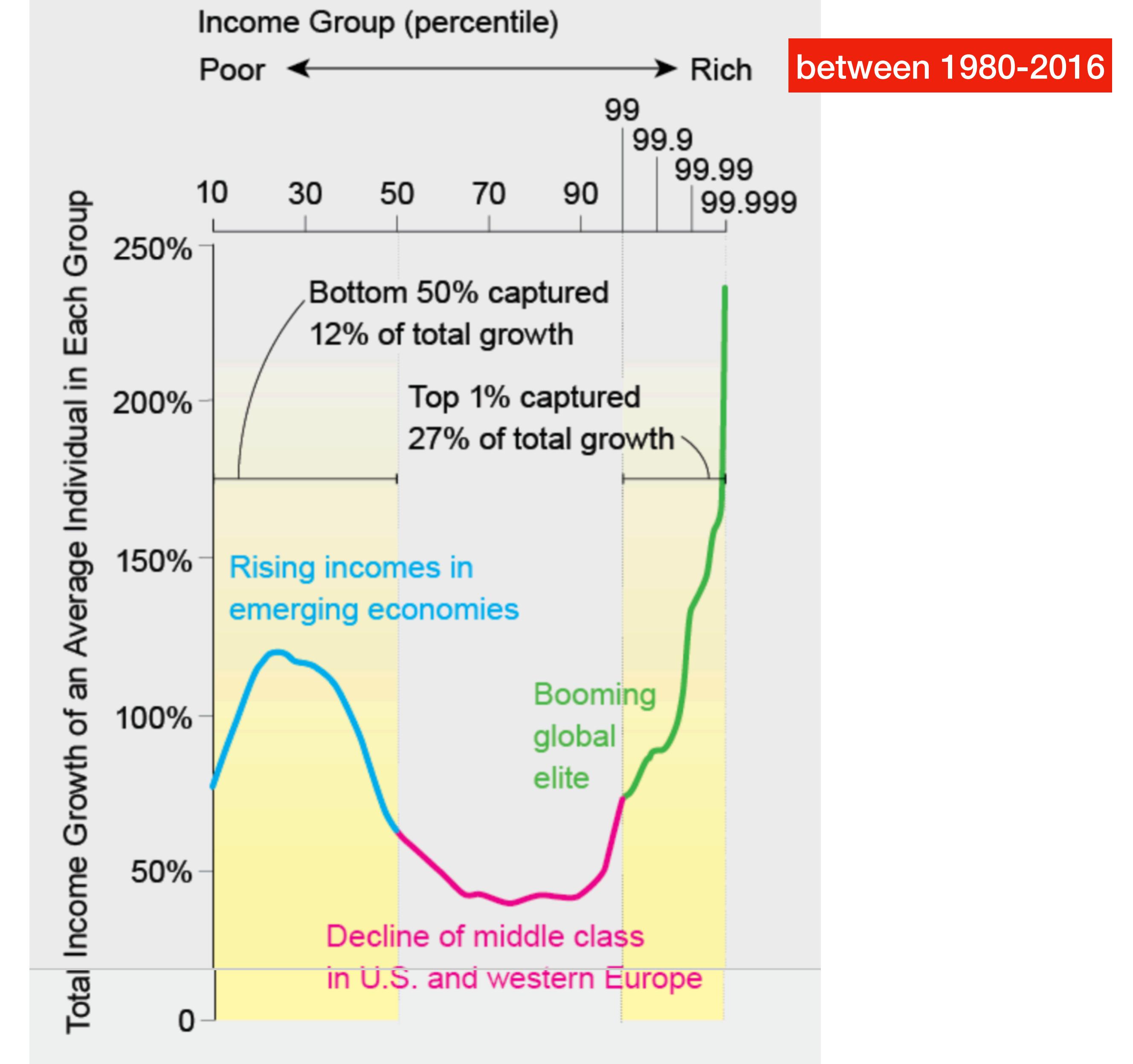


**Joseph E. Stiglitz**

Joseph E. Stiglitz is a University Professor at Columbia University and Chief Economist at the Roosevelt Institute. He received the Nobel prize in economics in 2001. Stiglitz chaired the Council of Economic Advisers from 1995–1997, during the Clinton administration, and served as the chief economist and senior vice president of the World Bank from 1997–2000. He chaired the United Nations commission on reforms of the international financial system in 2008–2009. His latest authored book is *Globalization and Its Discontents Revisited* (2017).

*Credit: Nick Higgins*





income = wages + capital rents

credit: Stiglitz, Scientific American (2018)

## 1. Wage Inequality

Over the last 30 years, wage inequality in the United States has increased substantially, with the overall level of inequality now approaching the extreme level that prevailed prior to the Great Depression. This general characterization of the inequality trend oversimplifies, though, the actual pattern of change: The chart below shows that the trend at the top of the income distribution (the "upper tail") is not exactly the same as the trend at the bottom of the distribution (the "lower tail"). "Lower-tail" inequality is measured here by taking the ratio of wages at the middle of the income distribution (i.e., the 50th percentile) to those near the bottom of the distribution (i.e., the 10th percentile); "upper-tail" inequality is measured by taking the ratio of wages near the top of the distribution (i.e., the 90th percentile) to those at the middle of the distribution (i.e., the 50th percentile of workers). We find that lower-tail inequality rose sharply in the 1980s and contracted somewhat thereafter, while upper-tail inequality has increased steadily since 1980.

### Men's wage inequality

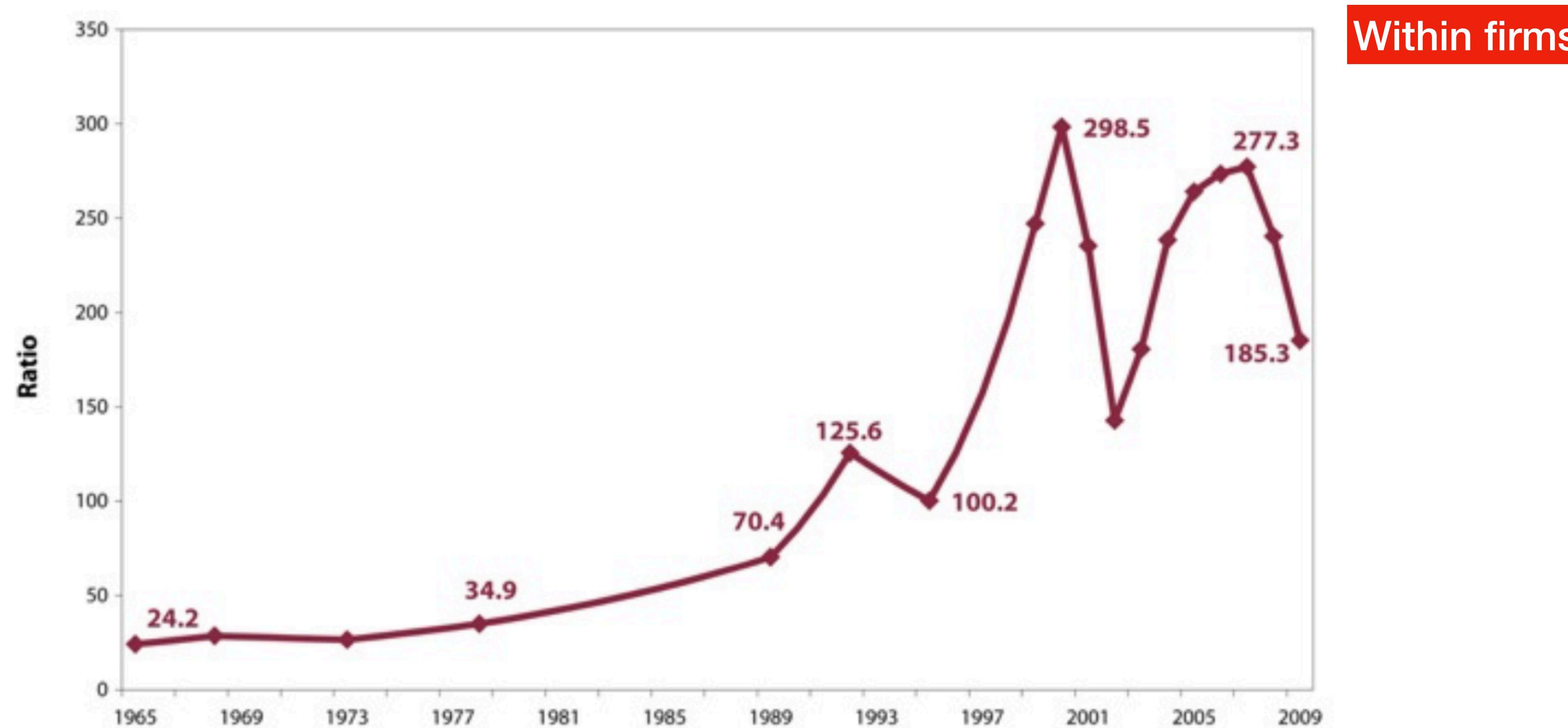


Source: Economic Policy Institute. 2011. "Upper Tail" inequality growing steadily: Men's wage inequality, 1973-2009. Washington, D.C.: Economic Policy Institute. May 11, 2011. <<http://www.stateofworkingamerica.org/charts/view/192>>

## 2. CEO pay

Recent decades have seen a clear increase in the difference between CEO compensation and that of the average worker in manufacturing ("production." CEOs in 1965 made 24 times more than the average production worker, whereas in 2009 they made 185 times more. This chart shows how this ratio between the compensation of CEOs and production workers took off in the 1980s.

### U.S. CEO pay in relation to the average production worker's compensation

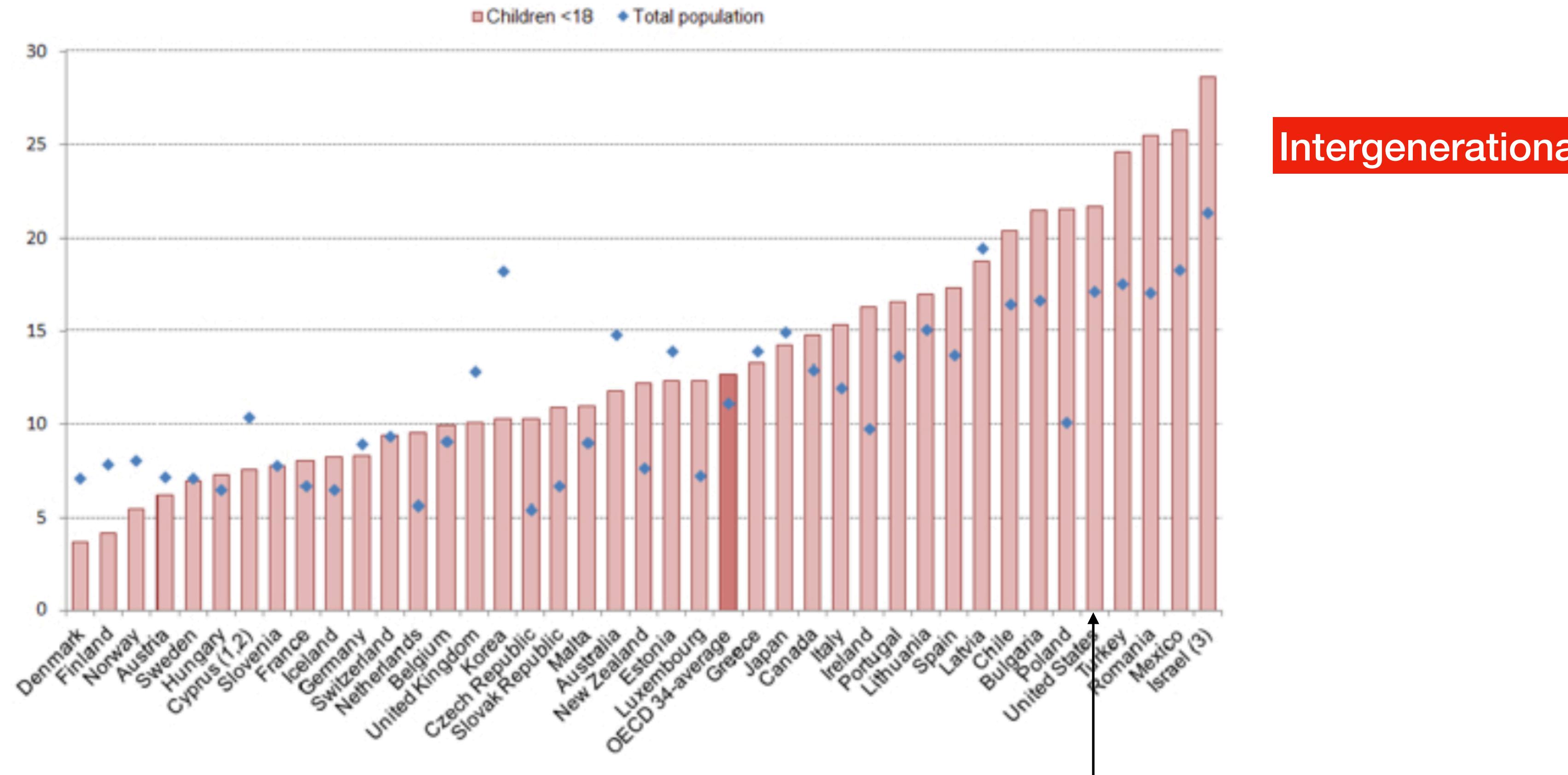


Source: Economic Policy Institute. 2011. More compensation heading to the very top: Ratio of average CEO total direct compensation to average production worker compensation, 1965-2009. Washington, D.C.: Economic Policy Institute. May 16, 2011.  
<<http://www.stateofworkingamerica.org/charts/view/17>>.

## 9. Child Poverty

In the United States, 21 percent of all children are in poverty, a poverty rate higher than what prevails in virtually all other rich nations.

### Relative Poverty Rates in Forty Nations in the Mid-to-Late 2000s



Source: *OECD Income Distribution questionnaire, February 2011*. Data refer to 2008 for Germany, Israel, Italy, Korea, Mexico, Netherlands, New Zealand, Norway, Sweden and the United States; 2007 for Canada, Denmark and Hungary; 2006 for Chile, Estonia, Japan and Slovenia; 2005 for France, Ireland, Switzerland and the United Kingdom; 2004 for Australia, Austria, Belgium, Czech Republic, Finland, Greece, Iceland, Luxembourg, Poland, Portugal, the Slovak Republic, Spain and Turkey.

If you are interested in the general moral philosophy of inequality, I recommend:

In 1998, Sen received the Prize in Economic Sciences in Memory of Alfred Nobel for his theoretical, field, and ethics work in welfare economics and for his research advancing the understanding of social-choice theory, poverty, and the measurement of welfare. Jun 3, 2021



# *Equality of What?*

*AMARTYA SEN*

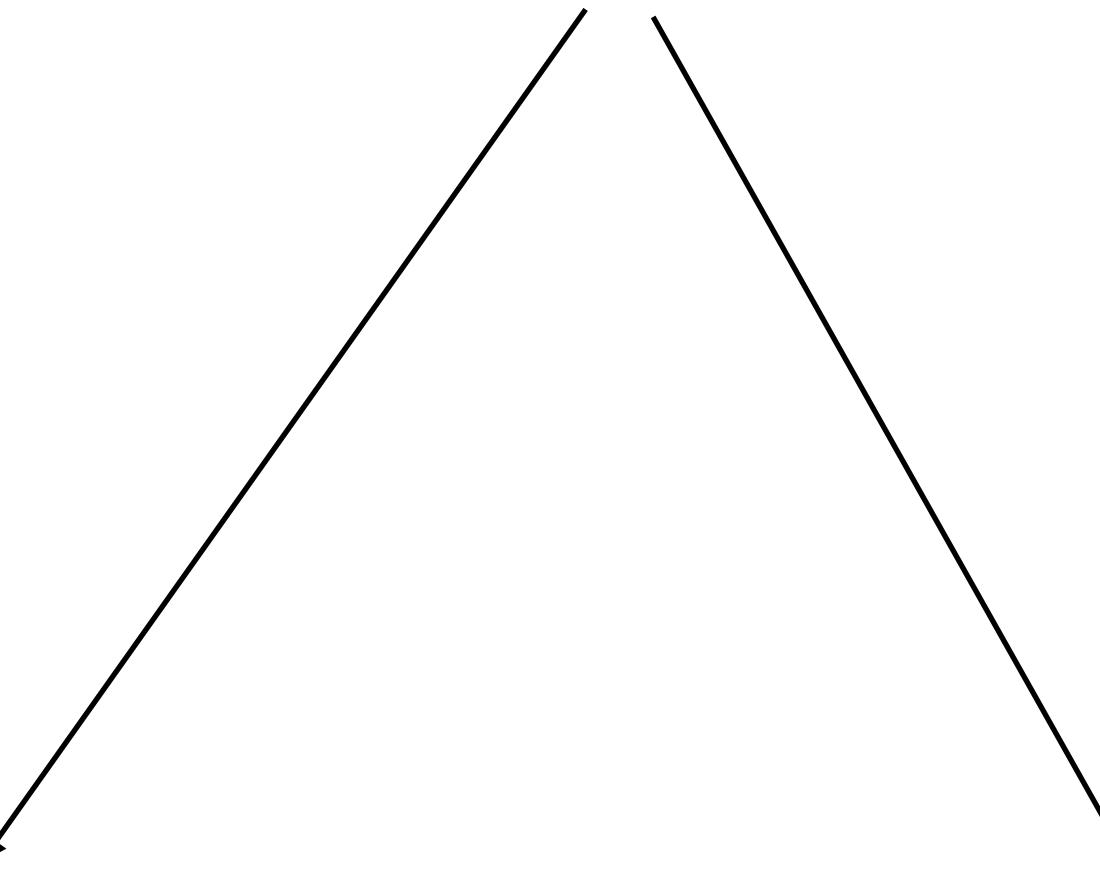
THE TANNER LECTURE ON HUMAN VALUES

## Origins of wealth inequality

### Two Different Issues:

**Piketty, Bowles,...**

**Marx, Stieglitz, ...**



**Transmission of wealth over time**

**Allocation of production returns as Income**

**wealth “dynamics”**

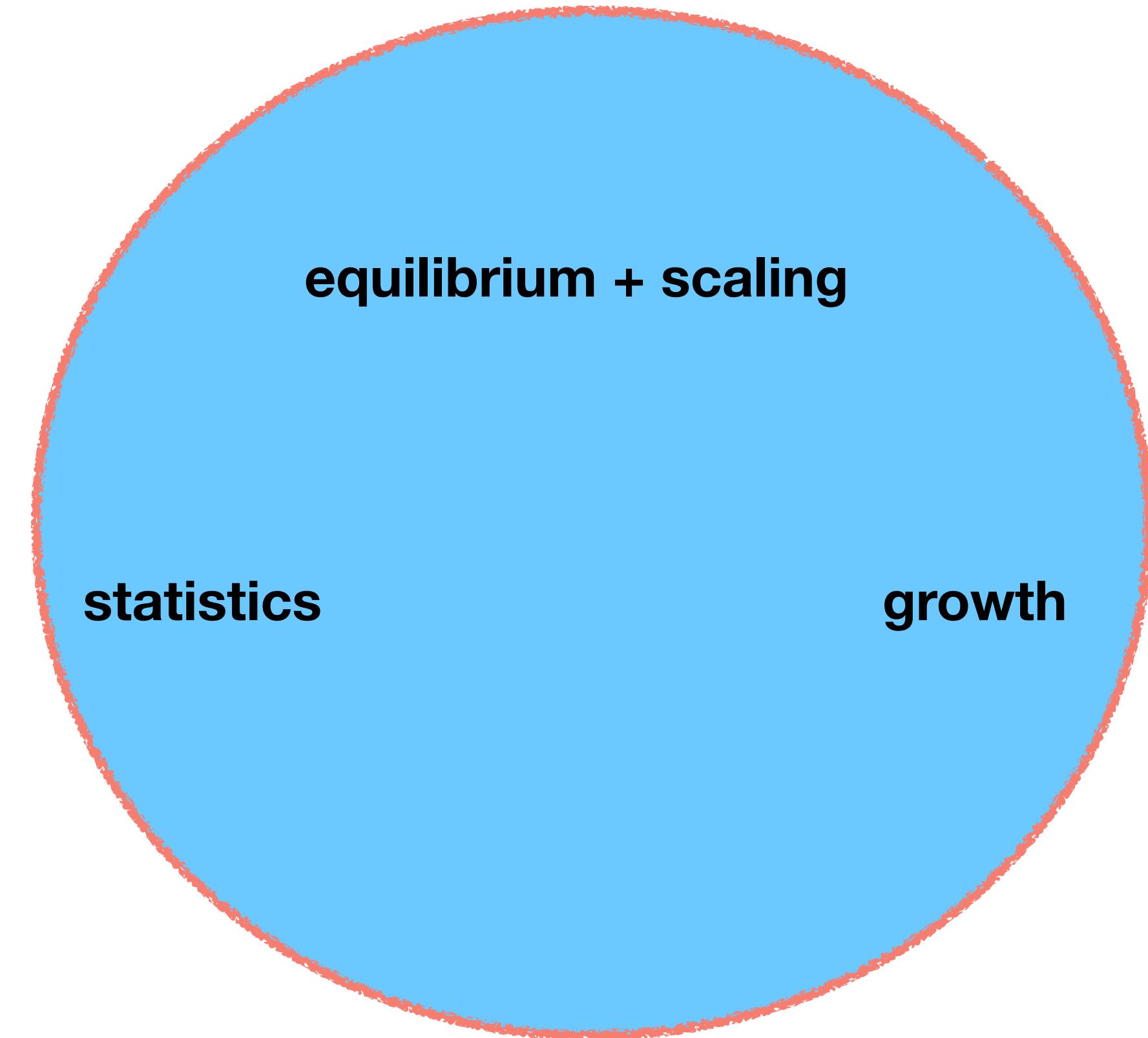
**income: labor vs capital**

**Policy solutions :**

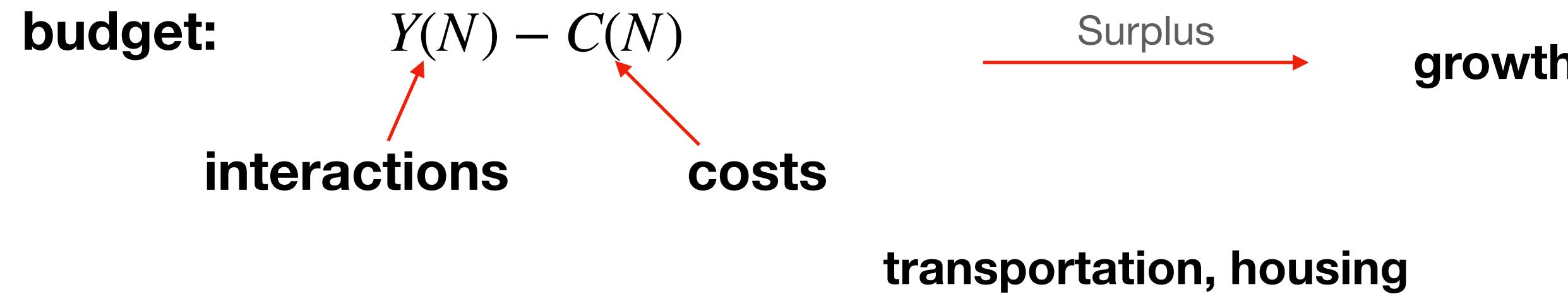
**depreciation, expropriation  
government: inheritance taxes**

**firms  
government: redistribution, social services**

## Where does this all fit with Cities?



# Economic Growth and Cities: Surplus from spatial “equilibrium”



## 1. The Problem of Statistics

**diversity, inequality: broad distributions of wealth**

## 2. The Problem of Growth

**cities are not static: they grow at a few percent a year!! good or bad?**

Recall:

# Economic Growth

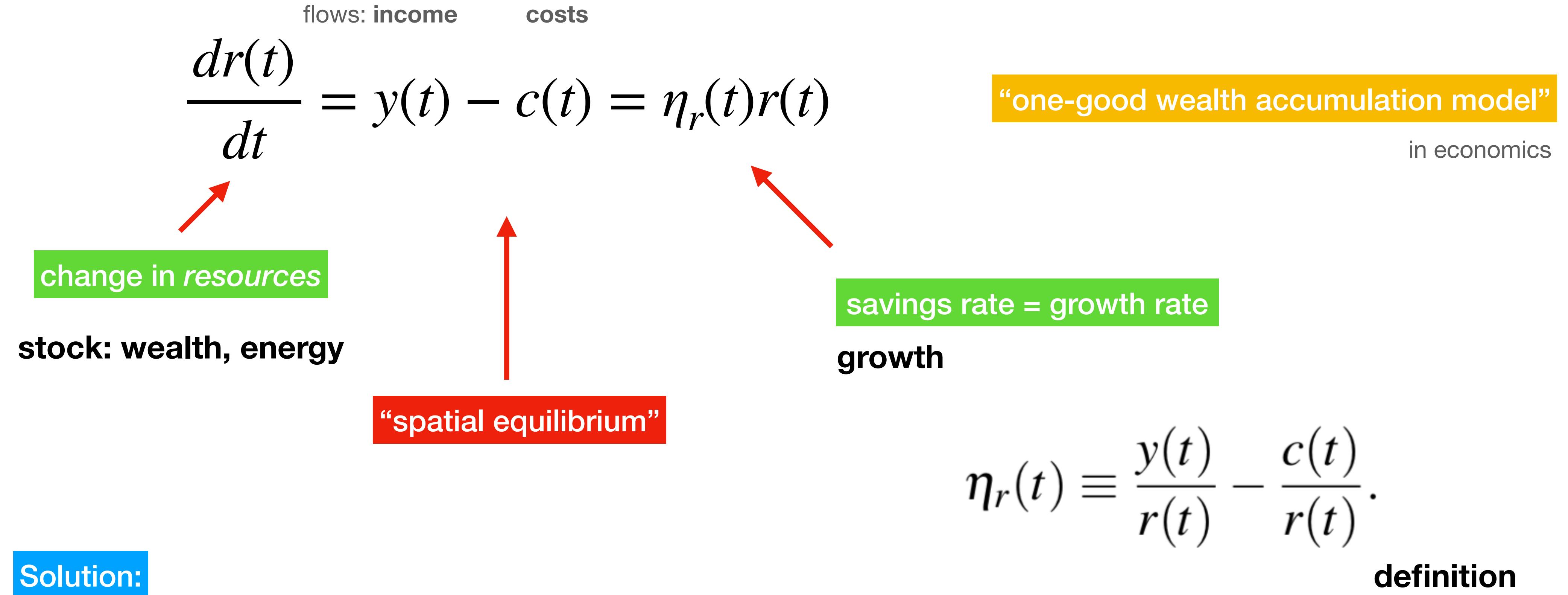
where do economic growth rates come from?

$$\frac{dY}{dt} = \eta Y$$

Exponential Growth: 2-3% a year for USA

noisy, scale dependent, variable  
↑  
inequality

## A Simple Model of Resource Dynamics



$$\ln \frac{r(t)}{r(0)} = \left( \bar{\eta}_r - \frac{\sigma_r^2}{2} \right) t + \Theta(t),$$

**noise:**  $\Theta(t) = \sum_{l=1}^t \varepsilon_r(t_l)$ ,  $\rightarrow$  **Normal “bell curve”**

because of the central limit theorem

# The counter intuitive consequences of stochastic geometric growth

Consequences:

zero average, standard deviation:  $\sigma_\Theta = \sigma_r \sqrt{t}$

1.

$$\ln \frac{r(t)}{r(0)} = \left( \bar{\eta}_r - \frac{\sigma_r^2}{2} \right) t + \Theta(t),$$

$$\Theta(t) = \sum_{l=1}^t \varepsilon_r(t_l) \sim \sigma_r \sqrt{t}$$

Central Limit Theorem -> Gaussian

lognormal statistics !!

2.

$$\frac{1}{t} \ln \frac{r(t)}{r(0)} = \gamma_r + \frac{\Theta(t)}{t} \rightarrow \gamma_r,$$

The average growth rate over long times becomes a simple number

ergodicity

3.

$$t_* = \frac{\sigma_r^2}{\left( \bar{\eta}_r - \frac{\sigma_r^2}{2} \right)^2},$$

There is a minimum time to see through the “fog” of short term fluctuations.

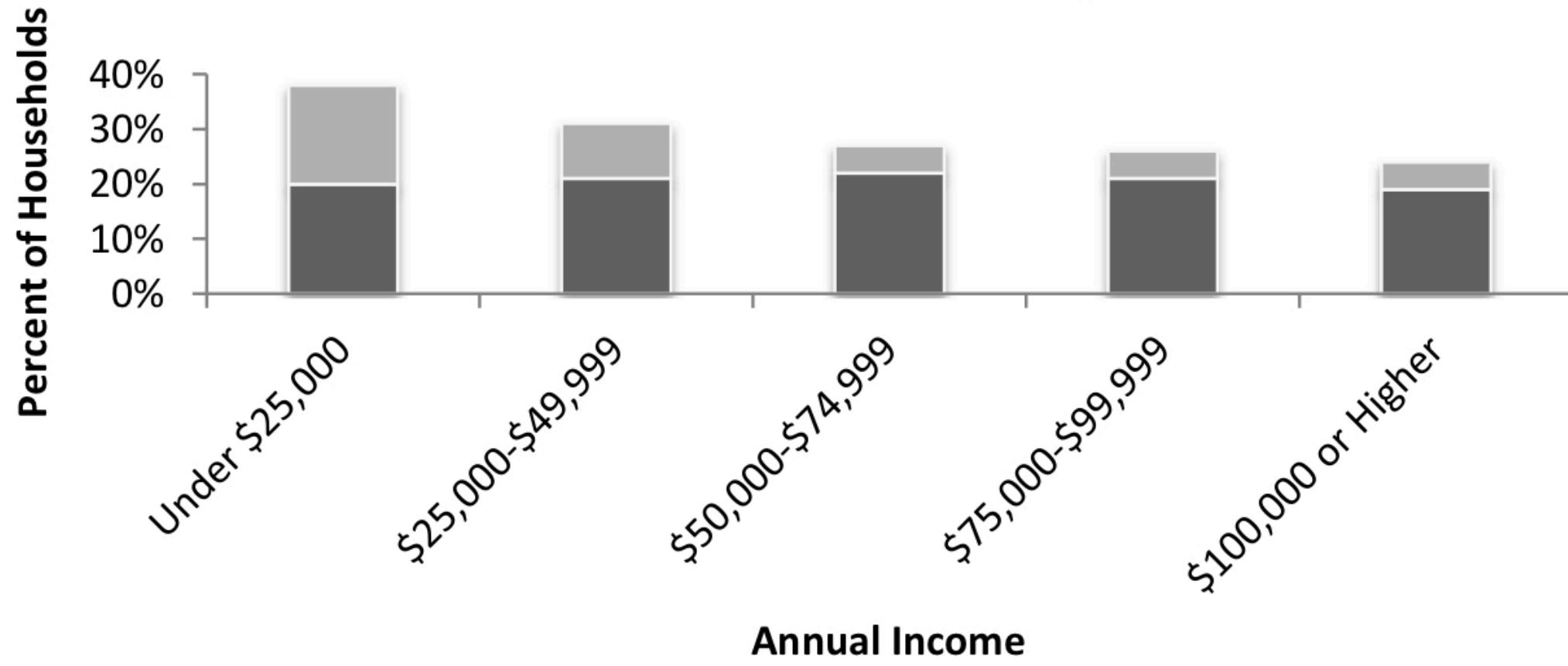
proportional to the uncertainty (volatility, std) between relative income and costs

people with a lot of uncertainty do not see growth as a possibility

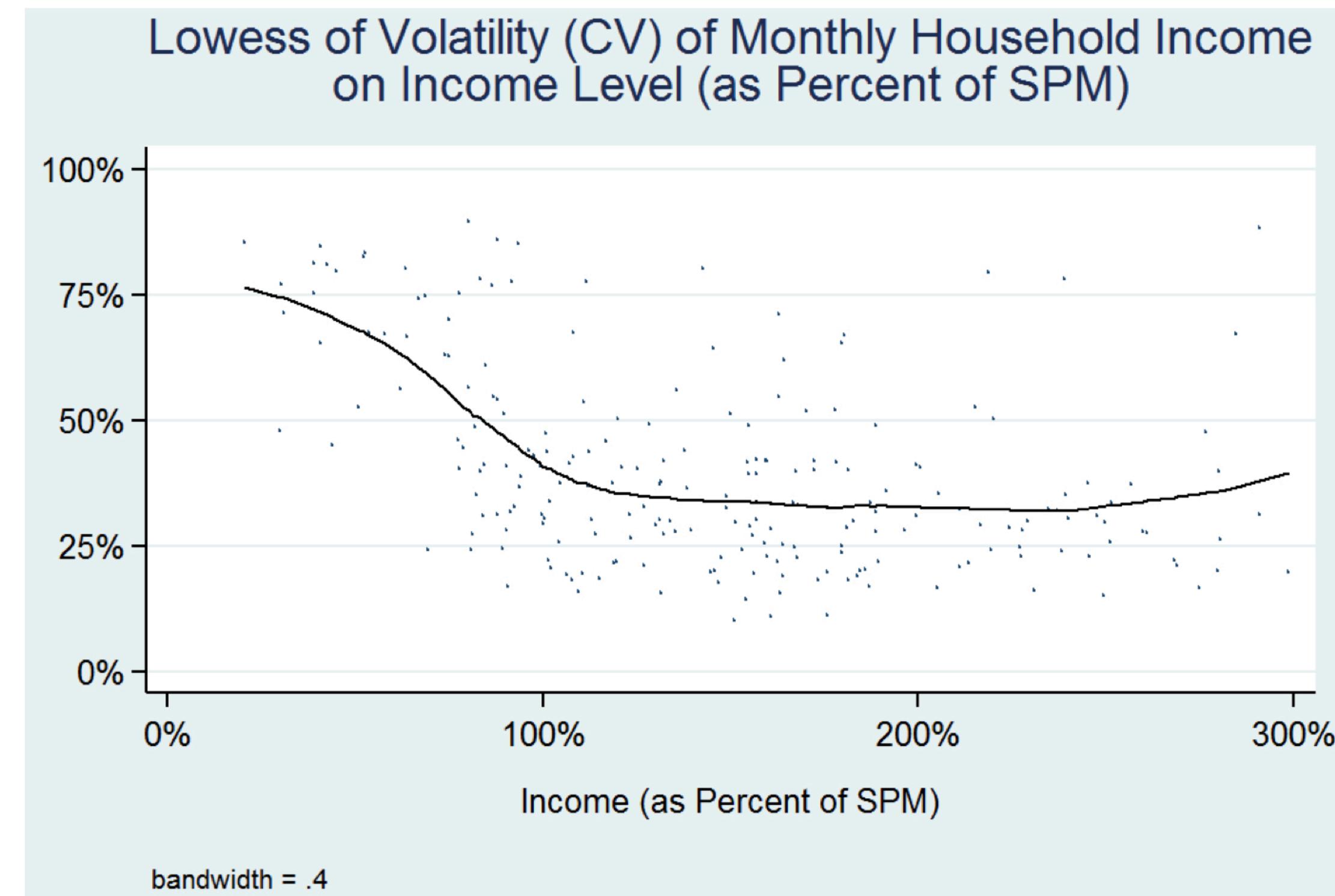
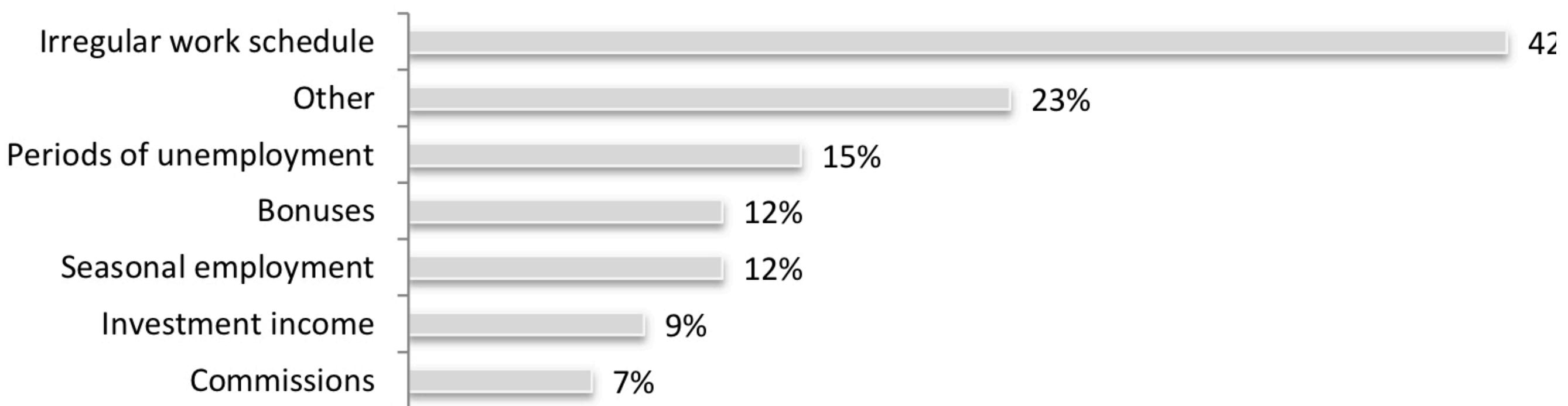
## The working poor experience much more volatility

lower effective growth rates, unclear horizons

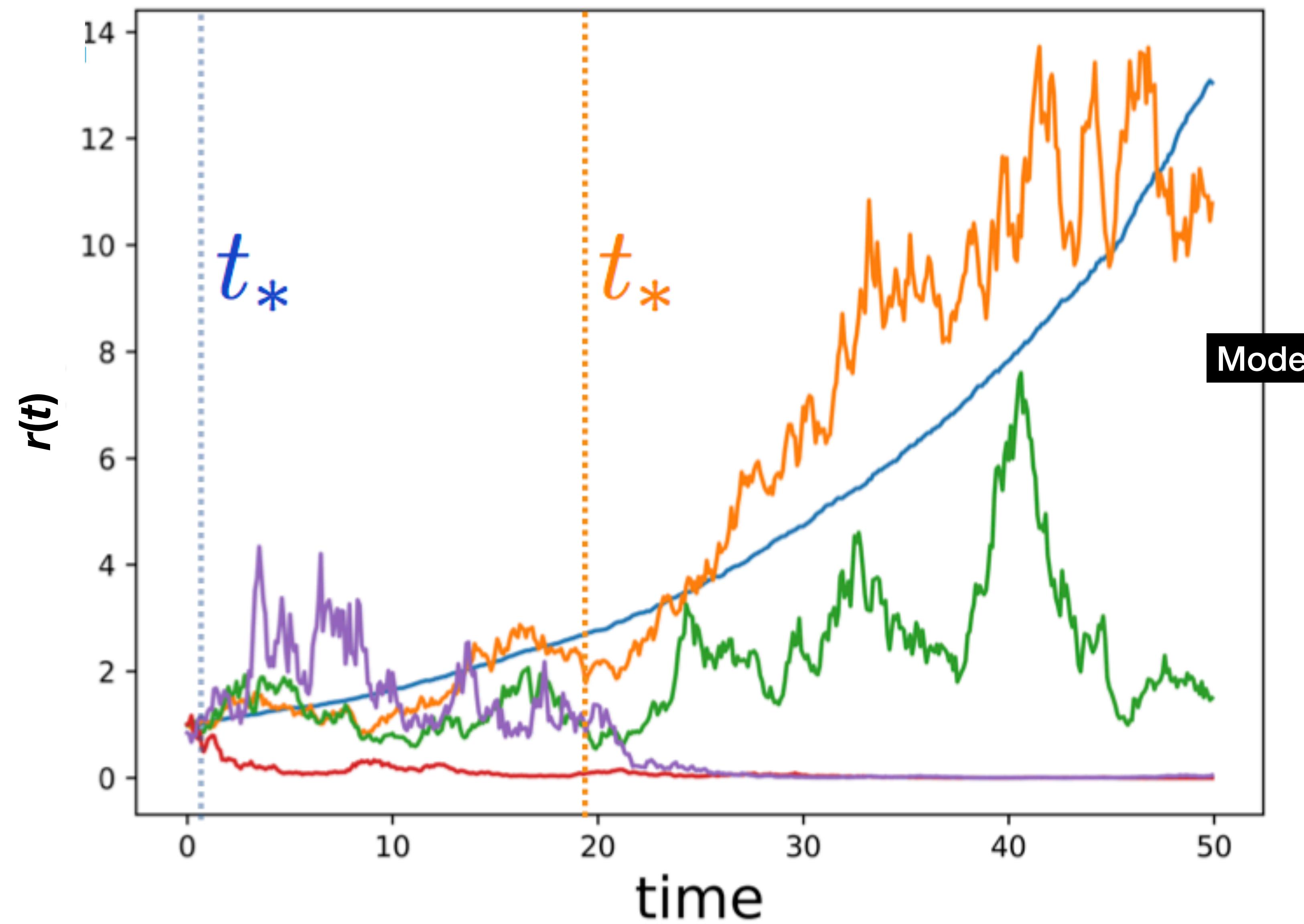
Income Variability is More Prevalent in the Lower-Income Groups  
Federal Reserve SHED Survey 2013



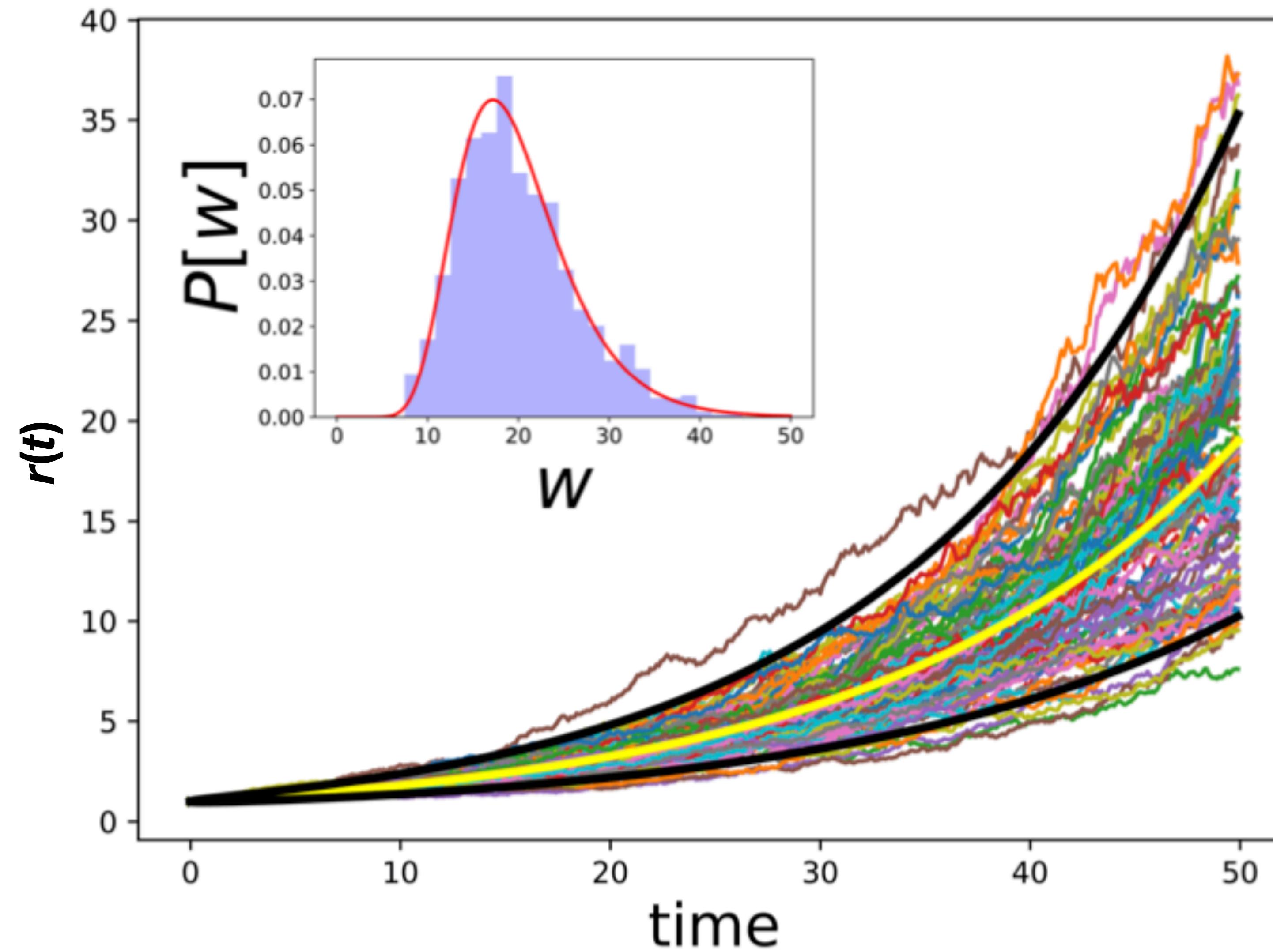
Why does your income change from month to month?  
Federal Reserve SHED Survey 2013



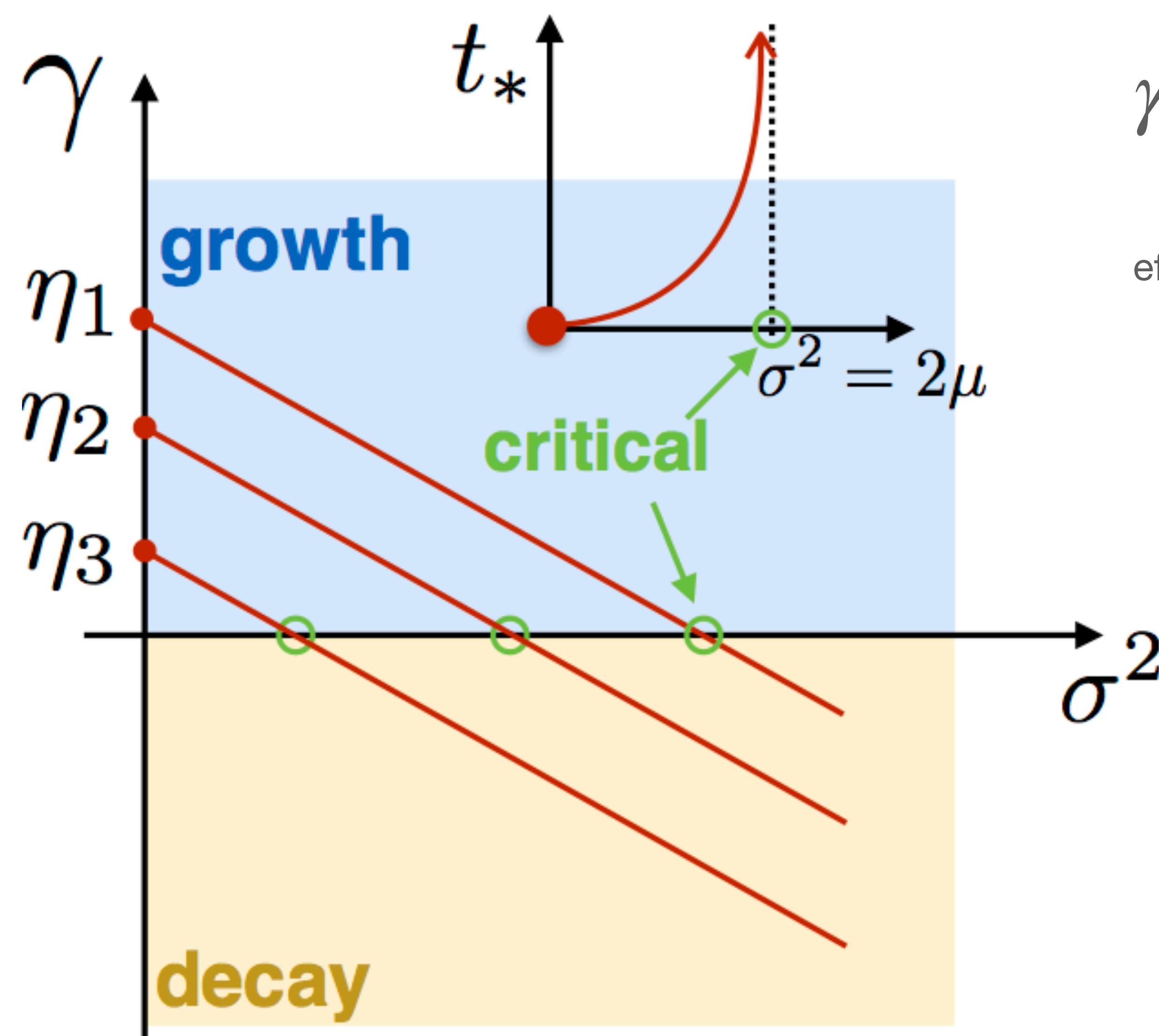
Model Solutions look like this



## Log normal statistics



## Net Growth Requires Low Fluctuations



$$\gamma = \eta - \frac{\sigma^2}{2}$$

effective growth rate

Want low fluctuations:

$$\eta_r(t) \equiv \frac{y(t)}{r(t)} - \frac{c(t)}{r(t)} = b(t) - a(t) = \bar{\eta} + u(t) - v(t) = \bar{\eta} + \epsilon(t)$$

The diagram illustrates the decomposition of consumption residuals. It starts with the equation  $\eta_r(t) = b(t) - a(t) = \bar{\eta} + u(t) - v(t) = \bar{\eta} + \epsilon(t)$ . Two red curved arrows point from the terms  $b(t) - a(t)$  and  $u(t) - v(t)$  to the labels "definition" below them. A black arrow points from  $u(t) - v(t)$  to the label "income fluctuations". Another black arrow points from  $u(t) - v(t)$  to the label "choice expenditures".

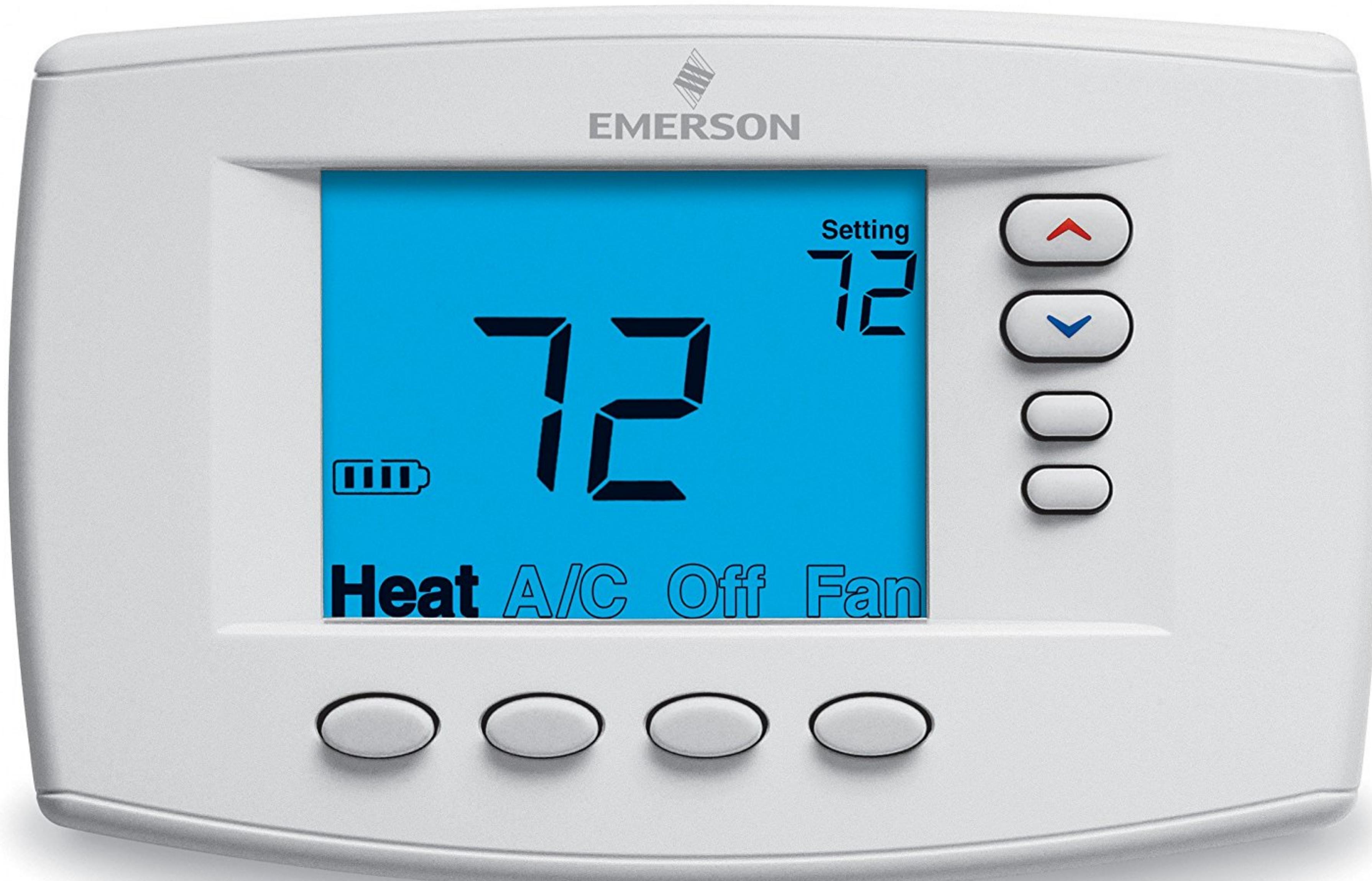
when I have more money can spend more and vice-versa

Consumption Smoothing

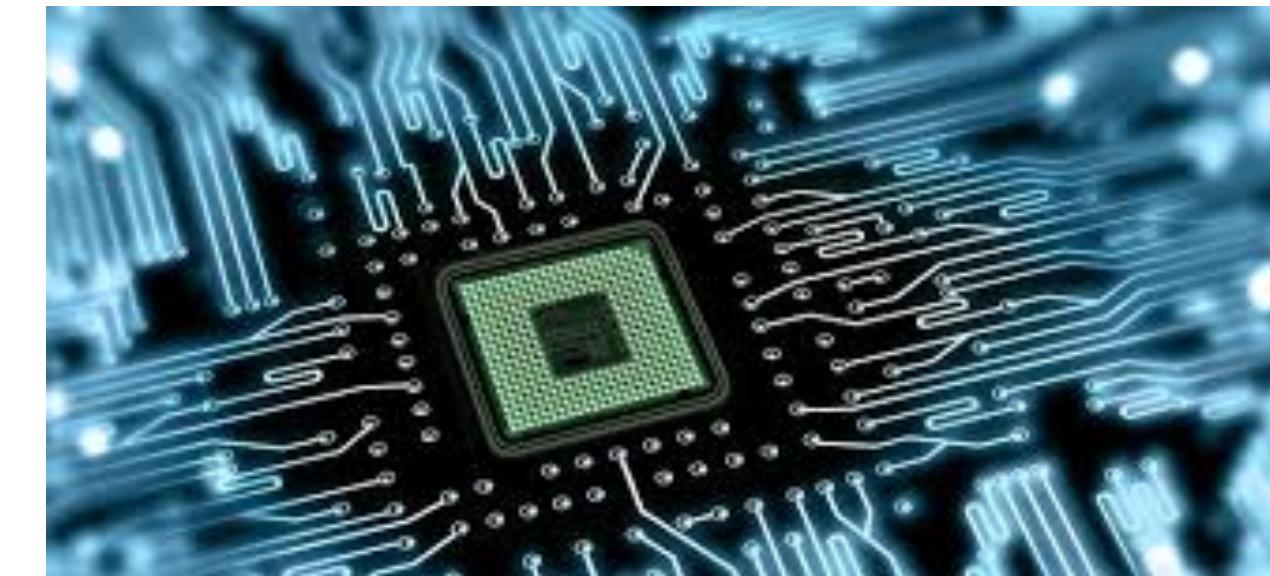
need to average (smoothen) expenditures and incomes over some time  
month, season, year

feedback control theory

Feedback Control is a big part of your life



## Feedback Control is a big part of your life



## How Control theory works:

### PID Controller

$$u(t) = k_P \varepsilon_r(t) + k_I \int_0^t \varepsilon_r(t') dt' + k_D \frac{d\varepsilon_r}{dt}, \quad \text{Time costs to track income fluctuations}$$

This gives a simple dynamics for errors

$$\cancel{\frac{d^2 \varepsilon_r}{dt^2}} + 2\zeta \omega \frac{d\varepsilon_r}{dt} + \omega^2 \varepsilon_r = F/m, \quad m = k_D, \omega = \sqrt{k_I/k_D} \text{ and } \zeta = \frac{k_P+1}{2\sqrt{k_D k_I}},$$

### noisy spring

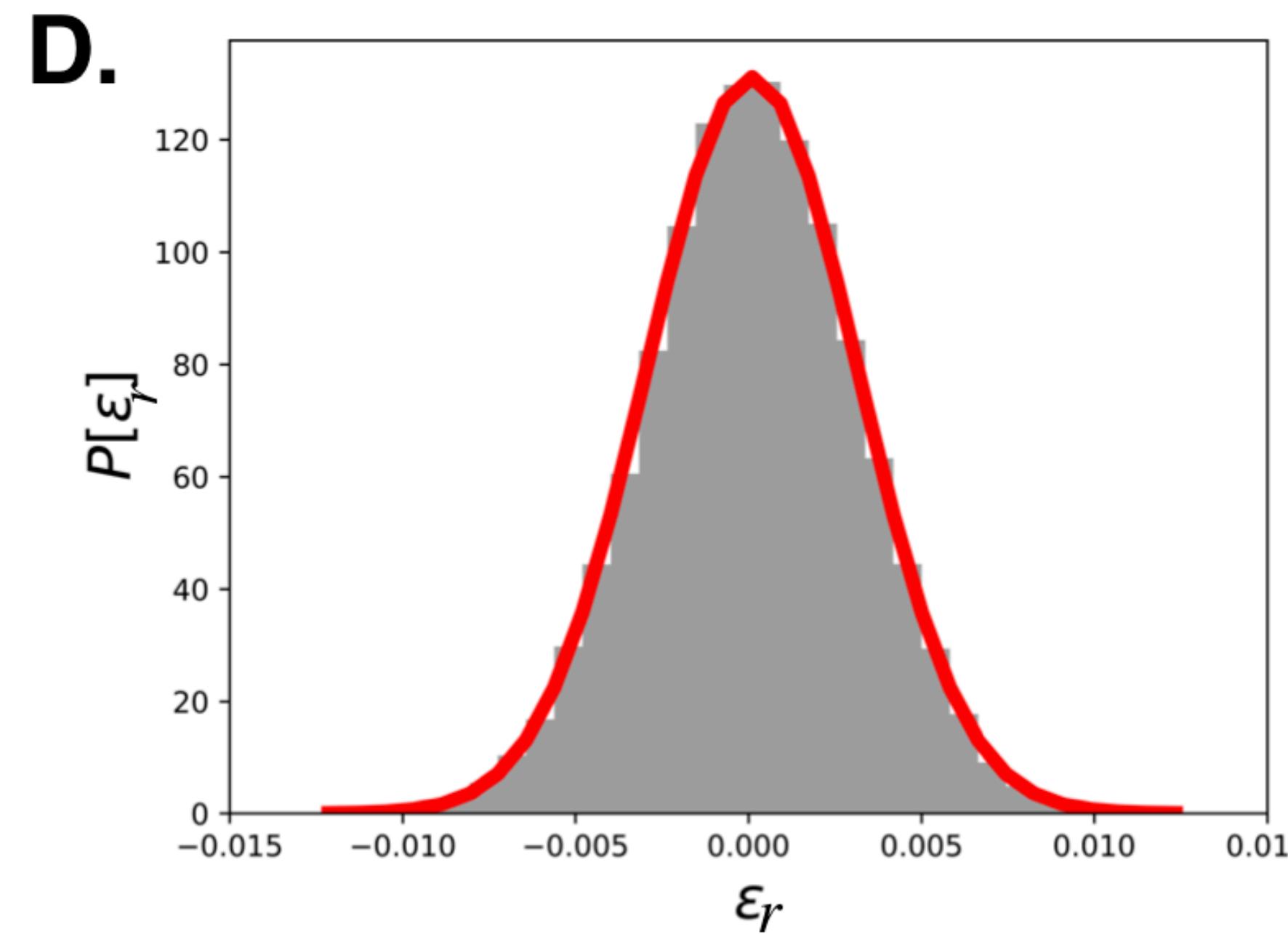
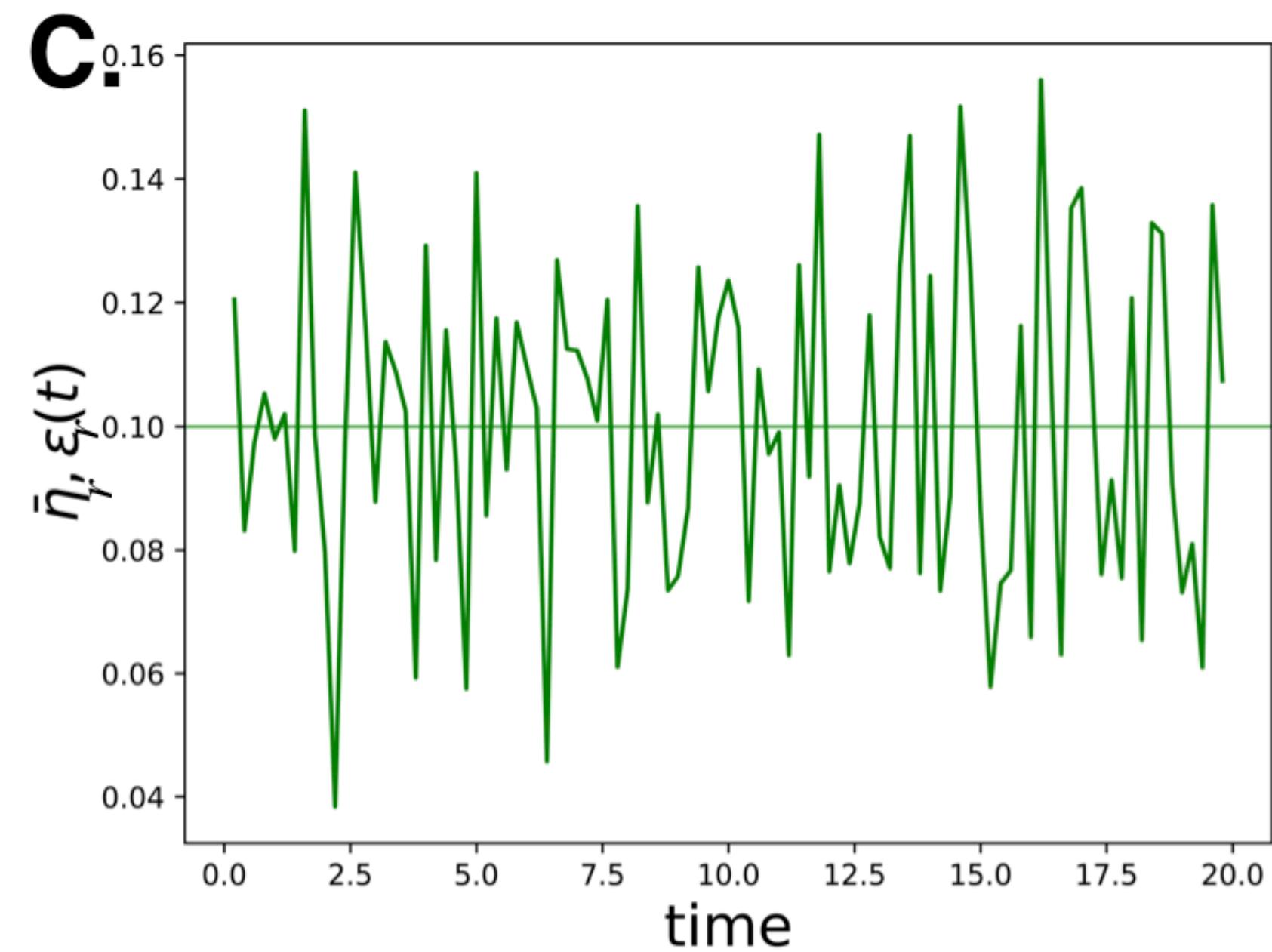
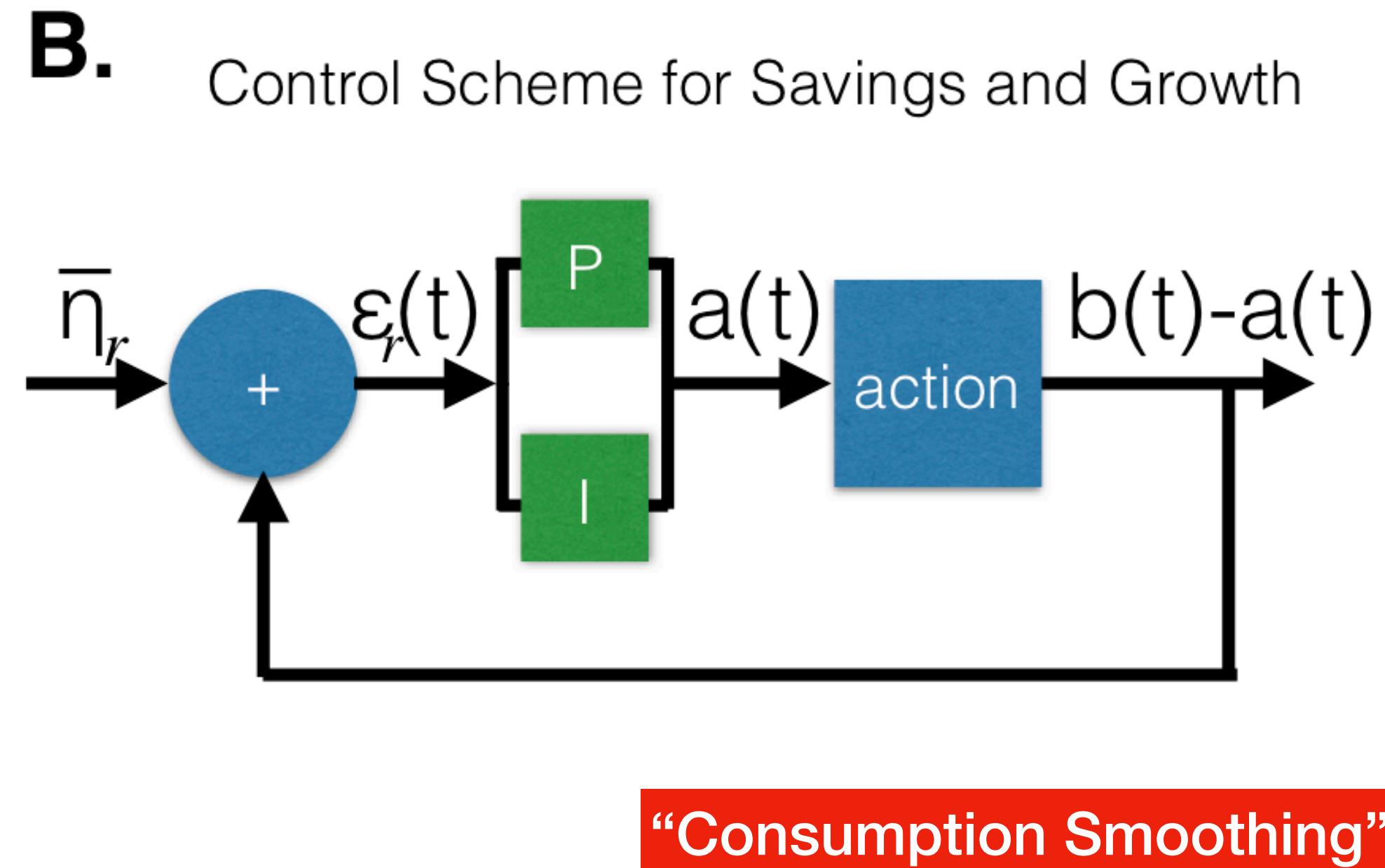
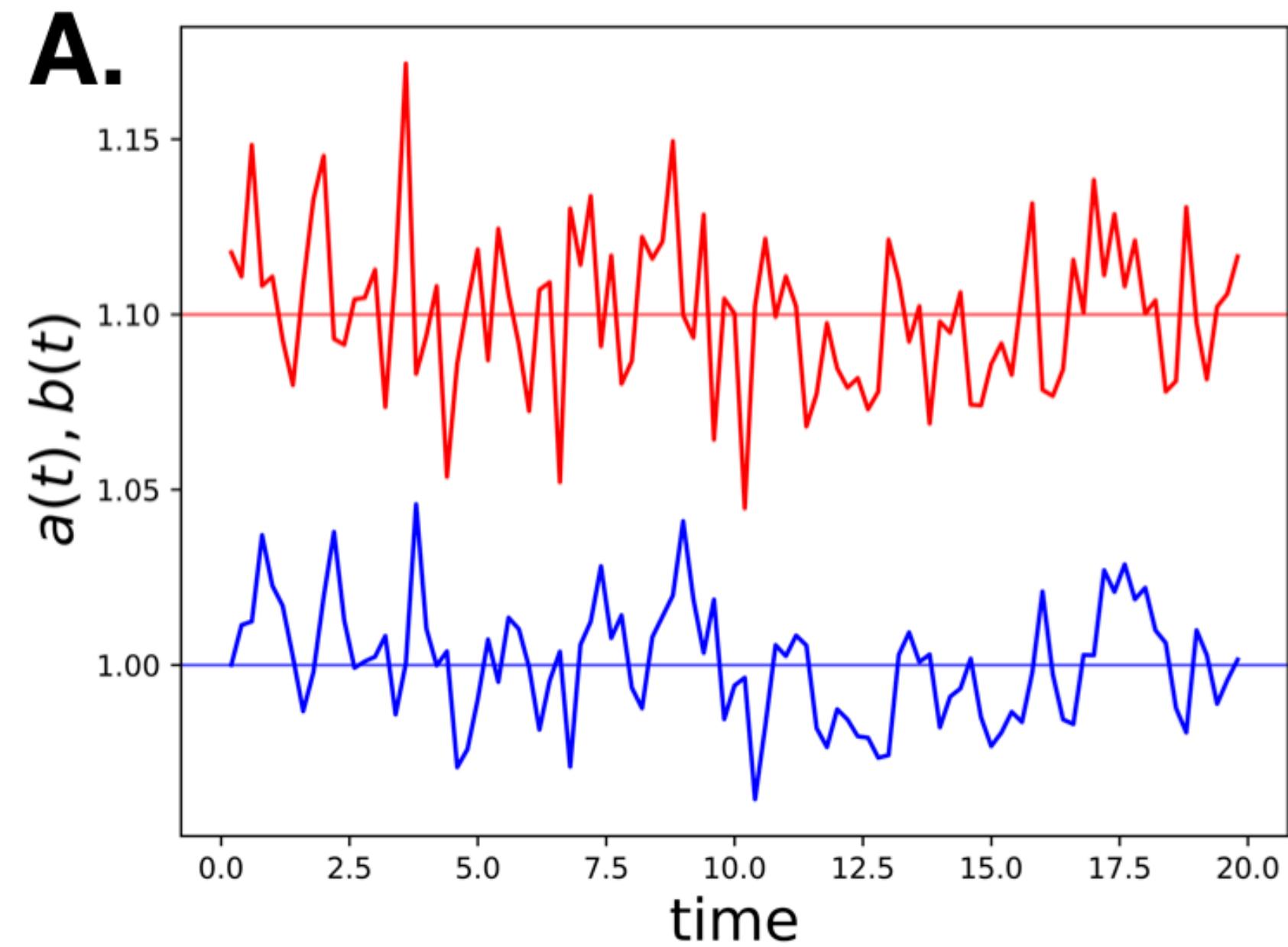
$$d\varepsilon_r = -\frac{M}{2} \varepsilon dt + \Omega dW(t).$$

error wants to vanish                                      noise

$$M = \omega/\zeta = k_I/[2(k_P + 1)]$$

Statistics of error is “under control”:

$$P[\varepsilon_r, t | \varepsilon_0] = \sqrt{\frac{M}{2\pi\Omega^2(1-e^{-Mt})}} e^{-\frac{M}{2\Omega^2} \left[ \frac{(\varepsilon_r - \varepsilon_0 e^{-M/2} t)^2}{1-e^{-Mt}} \right]} \rightarrow \sqrt{\frac{M}{2\pi\Omega^2}} e^{-\frac{M}{2\Omega^2} \varepsilon_r^2},$$



## Growth rates for individuals and for cities

Is the growth rate for a city the average of the growth rates for individuals?

Not in general:

$$r_G = \frac{1}{G} \sum_{j=1}^G r_j \quad \text{average resources}$$

$$\frac{dr_G}{dt} = y_G - c_G = \underline{(\eta r)}_G, \quad \text{growth of resources per capita in a population}$$

average of product

$$(\eta r)_G = \frac{1}{G} \sum_{j=1}^G \eta_j w_j = \eta_G r_G + \text{covar}_G(\eta, r) = [\eta_G + \text{covar}_G(\eta, r/r_G)] r_G.$$

average rate

“selection”

## Consequences:

$$(\eta r)_G = \frac{1}{G} \sum_{j=1}^G \eta_j w_j = \eta_G r_G + \text{covar}_G(\eta, r) = [\eta_G + \text{covar}_G(\eta, r/r_G)] r_G.$$

**positive: richer people get higher growth rates**

**correlation between resources and rates**

**negative: richer people get lower growth rates**

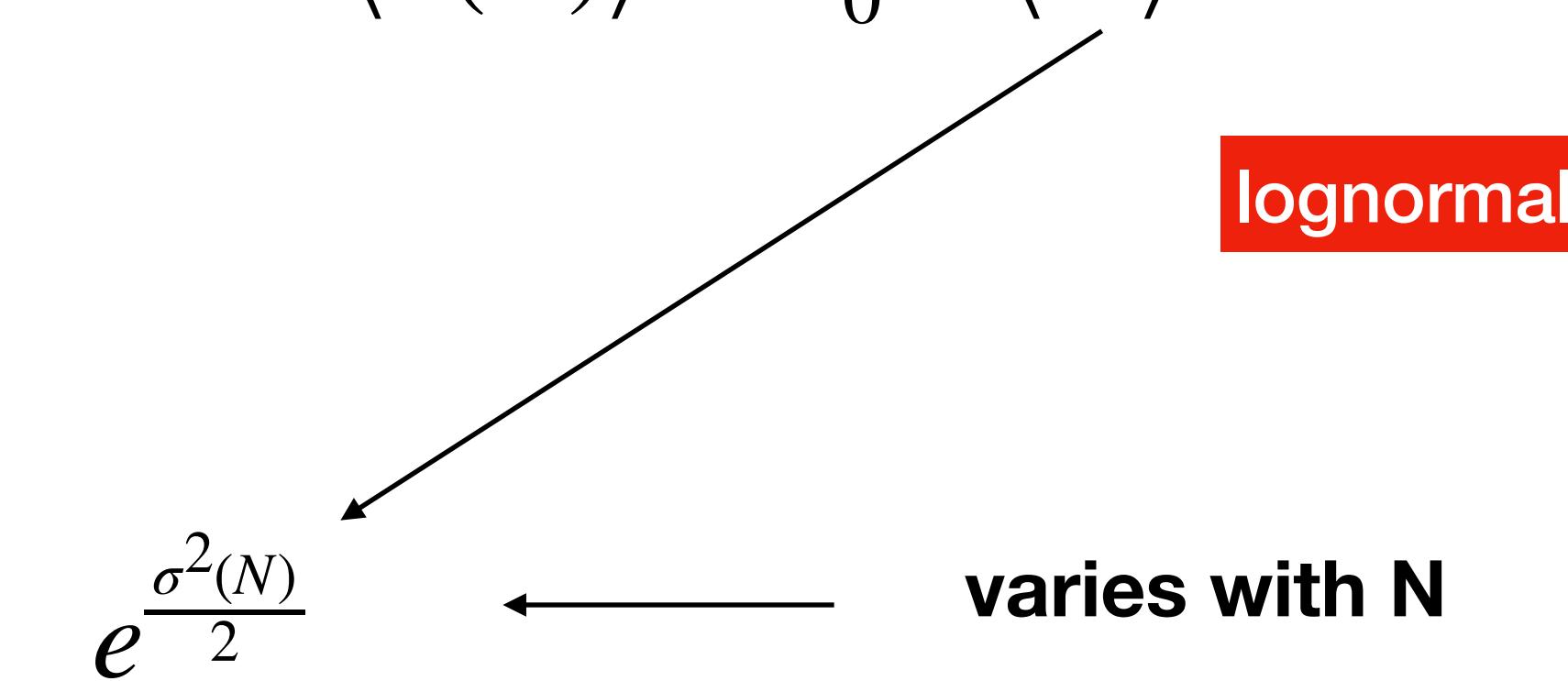
**anti-correlation between resources and rates**

**What situation gives the highest overall growth rates?**

**What situation gives the lowest inequality?**

## Corrections to scaling exponents

$$Y(N) = Y_0 N^\beta e^\xi \rightarrow \langle Y(N) \rangle = Y_0 N^\beta \langle e^\xi \rangle$$

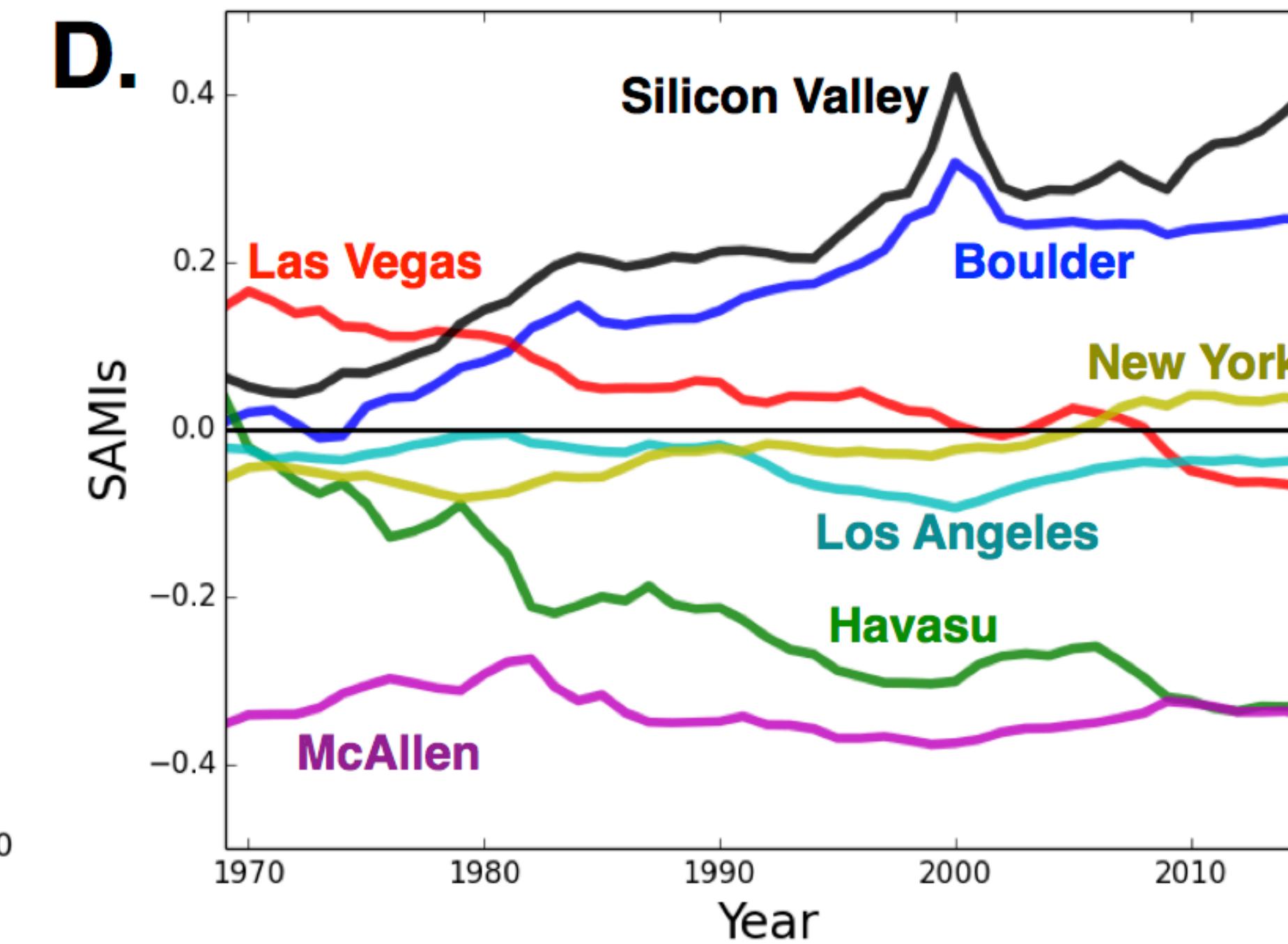
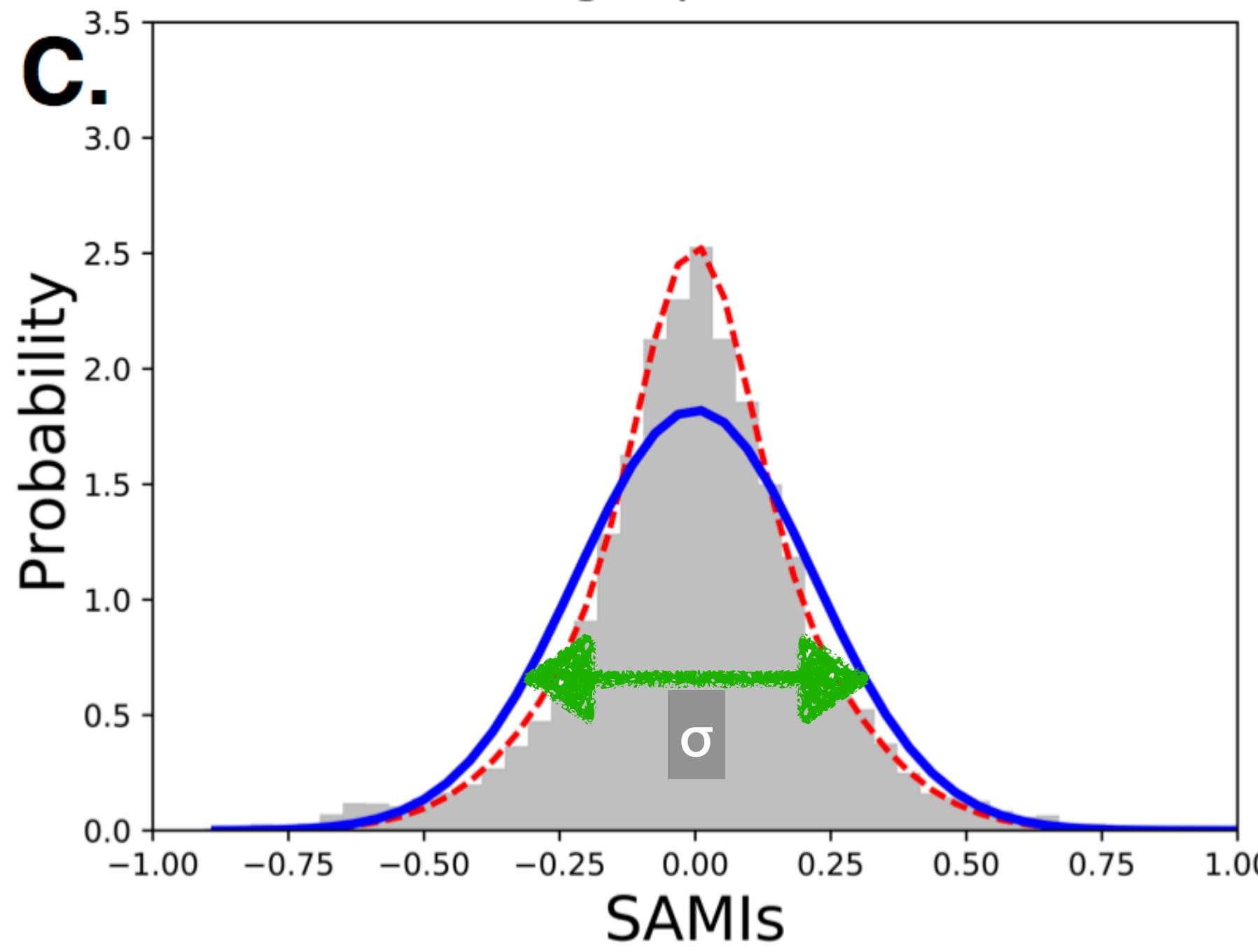
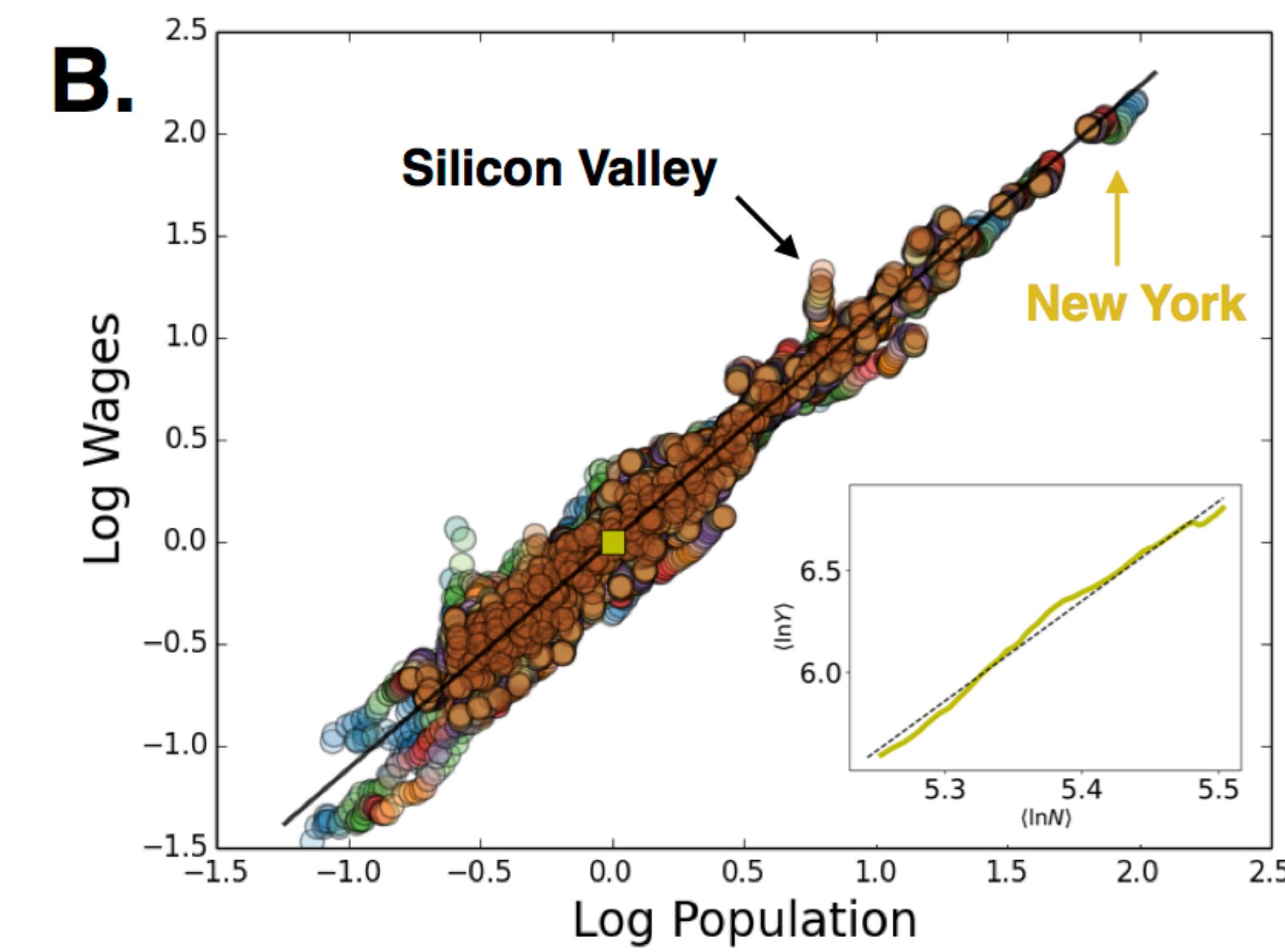
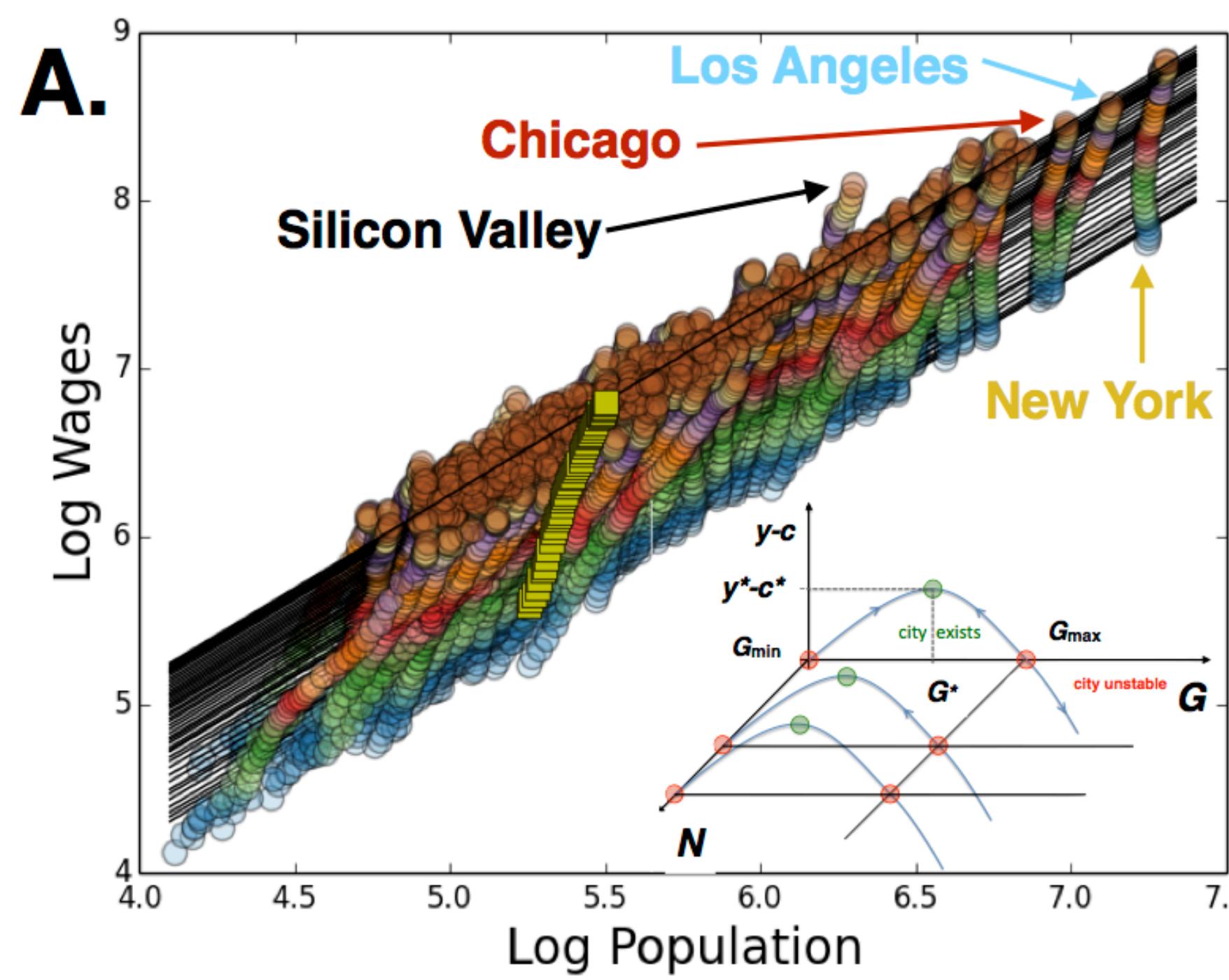


**scaling exponents become scale dependent**

**loss of scale invariance**

**requires a theory for the variances**

**more complicated statistics**



## How Long does it take Cities to Catch Up with Others?

**In the US, very small randomness**

**The typical square displacement of**

$$\xi^2(t) = \sigma^2 t \simeq 0.054$$

**in 50 years !!**

**Observe:**

$$\langle \xi^2(1969) \rangle = 0.043$$

**could have been ~ 0**

**40 years before: in the 1920s**

**How long does it take to create an equitable society?**

**About a Generation ~ 20-50 years**

slower with slow economic and demographic growth rates