

Elements of a coarse-grained quantitative theory of society

macroscopic regularities and emerging principles



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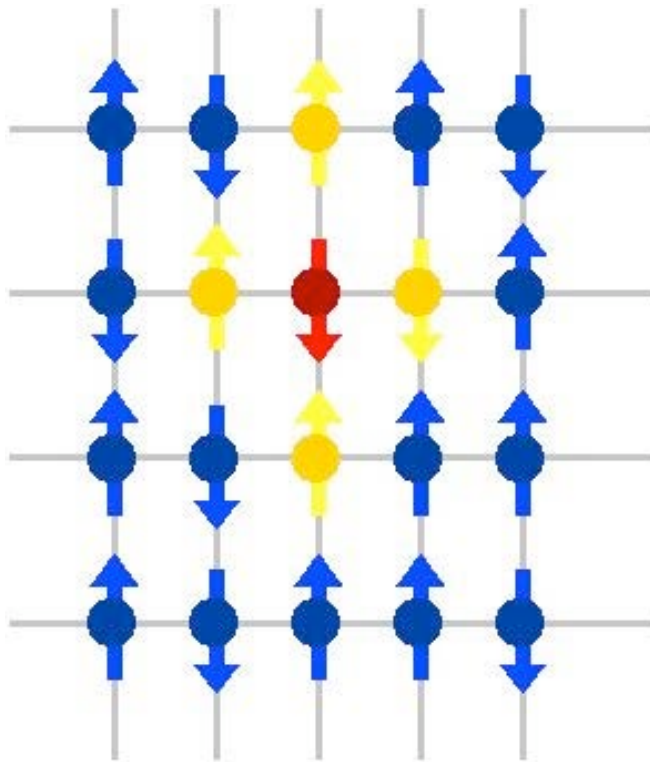
Is there a physics of human society?

Physics

Human and Social

Elements	(elementary) particles	people
Interactions	4 elementary forces	many forms of interaction
Locality in time	yes	no, people have long memory
Locality in space	yes	no, space may not be fundamental
Stationarity	yes	no, most of the time
Universality	sometimes	maybe, we don't know
Conservation Laws:	yes	usually no
Adaptability	no	yes, people adapt and innovate permanently

From macroscopic properties to
idealized microscopic models
that capture the essence of phenomena



Ising model



Predictable **Macroscopic** behavior
vs. Temperature and Magnetic Field

Macroscopic
empirical regularities

Principles
abstractions

Theory
prediction/falsification

← scientific method →

Astronomical regularities

inertia, force, gravity

Classical Mechanics

Temperature, Pressure

thermodynamics

Statistical Mechanics

flow of liquids, gases
turbulence

conservation laws
matter, energy, momentum

Hydrodynamics

Superconductors
Superfluids

hydrodynamics, quantum phases
bosons, fermions

Quantum Fluids
& Condensates

Magnets

scaling, universality, RG

Critical Phenomena

Cosmological Backgrounds

Big Bang, GR

Modern Cosmology

Atoms, nuclei

relativity, quantum mechanics
symmetry

Quantum Field Theory

time

time

Macroscopic regularities and emerging principles

non-stationarity, multiple interactions modes,
non-locality innovation, adaptation, self-similarity

Urban self similarity and growth

Bettencourt, Lobo, Kuehnert, Helbing, West PNAS 2007

Discovery and development of science and technology

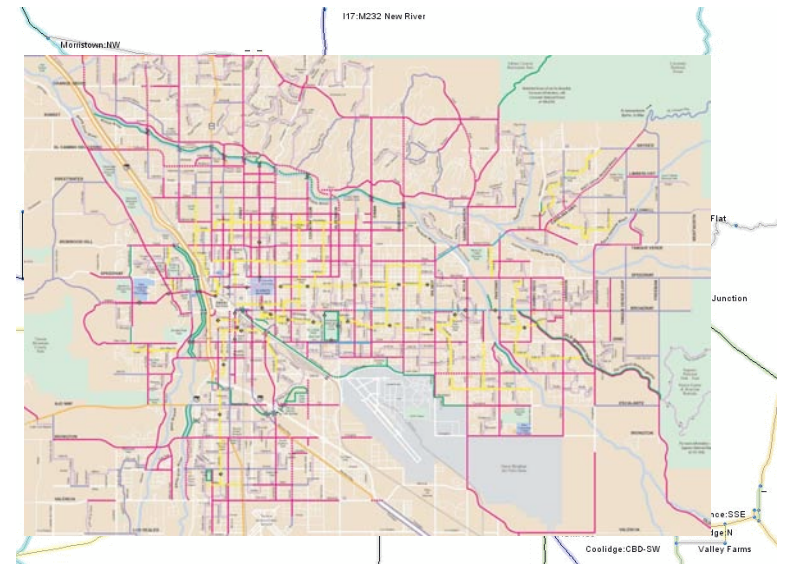
Bettencourt, Kaiser, Kaur 2007

Bettencourt, Kaur 2008

Is there are analogue between *biological* and *social* scaling?

- Metabolic Rates $\sim N^{d/(d+1)}$
Energy/resource consumption
- Rates decrease $\sim N^{-1/(d+1)}$
- Times increase $\sim N^{1/(d+1)}$

Is $3 > d \sim 2$?



We set forth to search for data and estimate power laws:

$$Y(N) = Y_0 N^\beta \text{ solution to equation: } Y(aN) = a^\beta Y(N)$$

Urban self similarity and growth

Scaling study of **urban indicators** in

USA, China and EU countries

~330, ~295 ~100 cities

Economic definition of cities [commute to work]:

Metropolitan Statistical Areas (MSAs)

Indicators:

Social and Economic quantities $\beta > 1 \sim 1.15$

GMP, wages, income, crime, patents, AIDS incidence, walking speed

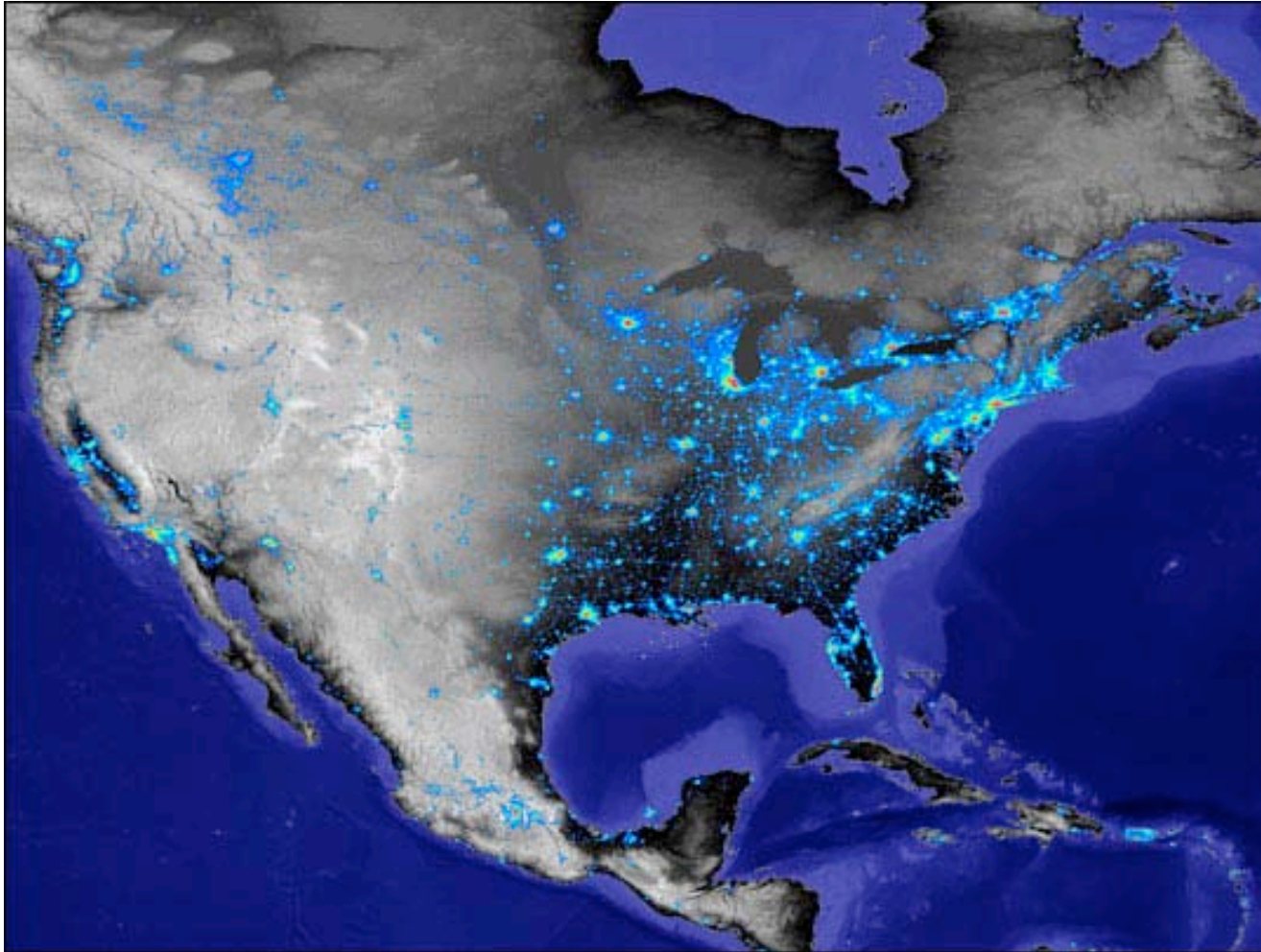
Individual need and use $\beta = 1$

Establishments, employment, housing, household consumption

Material Infrastructure $\beta < 1 \sim 0.8$

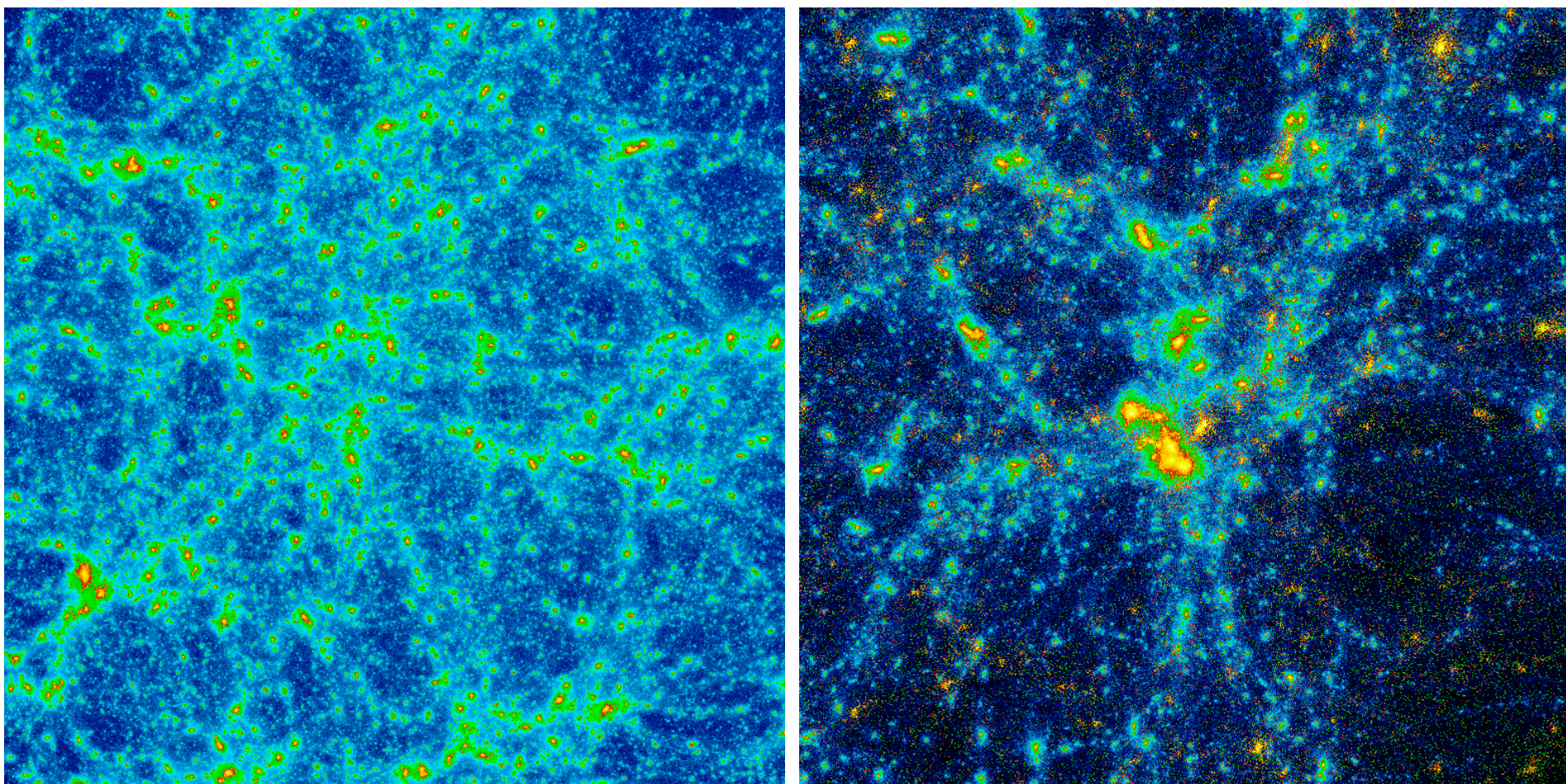
Road surface, electrical cables, gasoline sales

**Urbanization is a ubiquitous,
spontaneous social phenomenon**



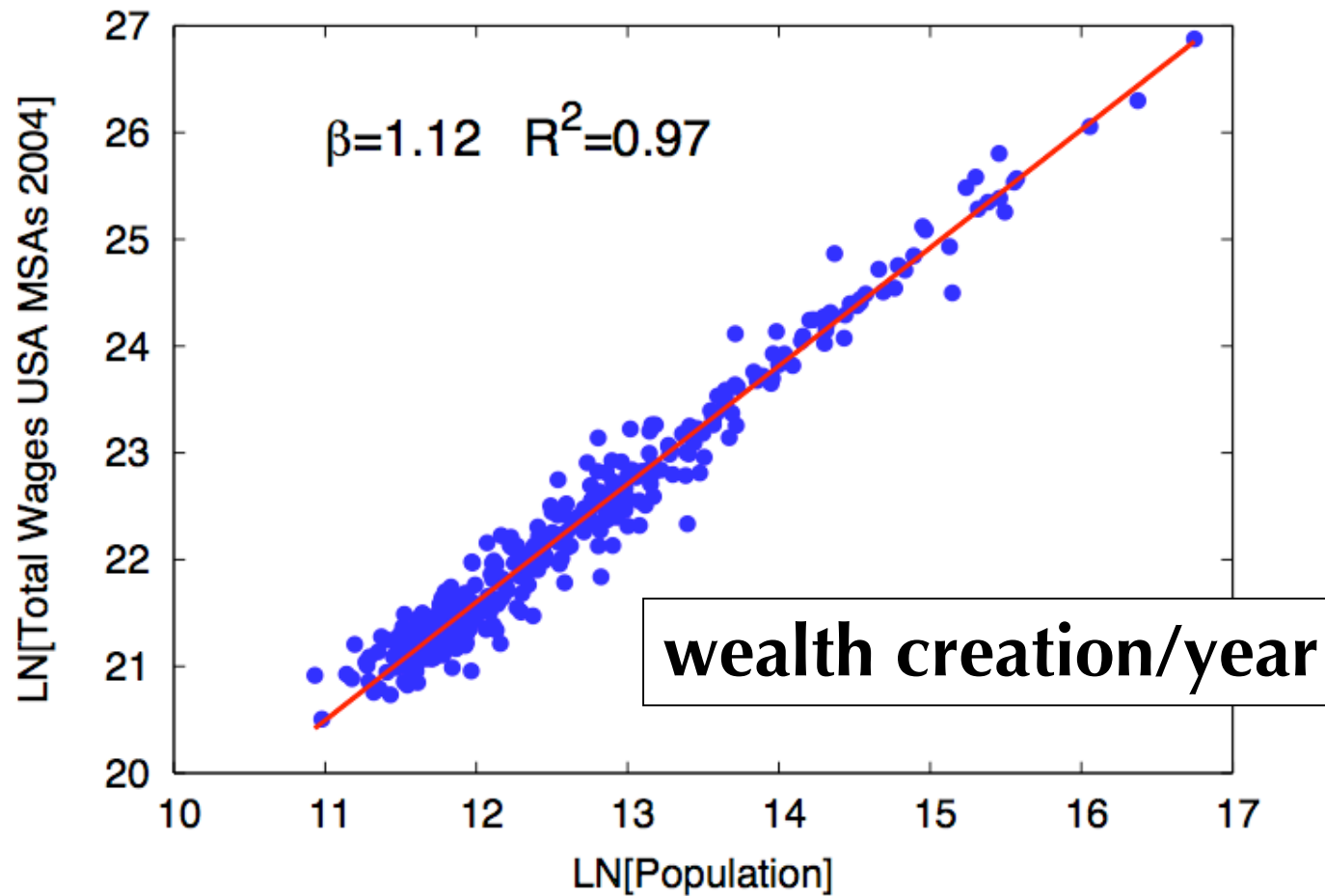
Clustering in the sky

mass and gravity



Images courtesy of M. Warren (LANL)

Increasing returns to scale in cities

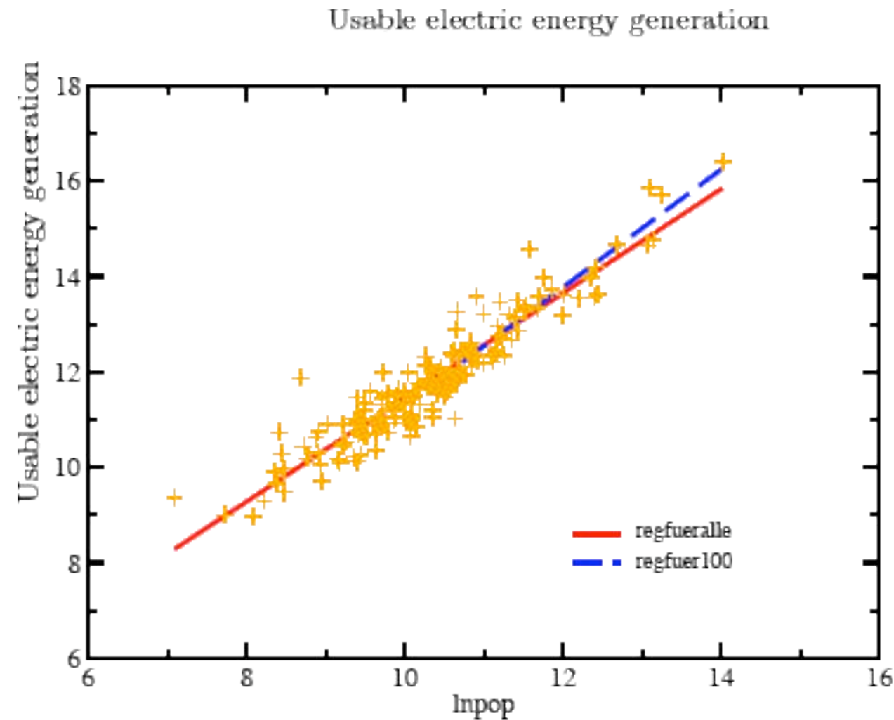


Energy consumption vs. city size

Germany: year 2002

Data source:
German Electricity
Association [VDEW]

Courtesy of
Christian Kuehnert
& **Dirk Helbing**



super-linear
growth

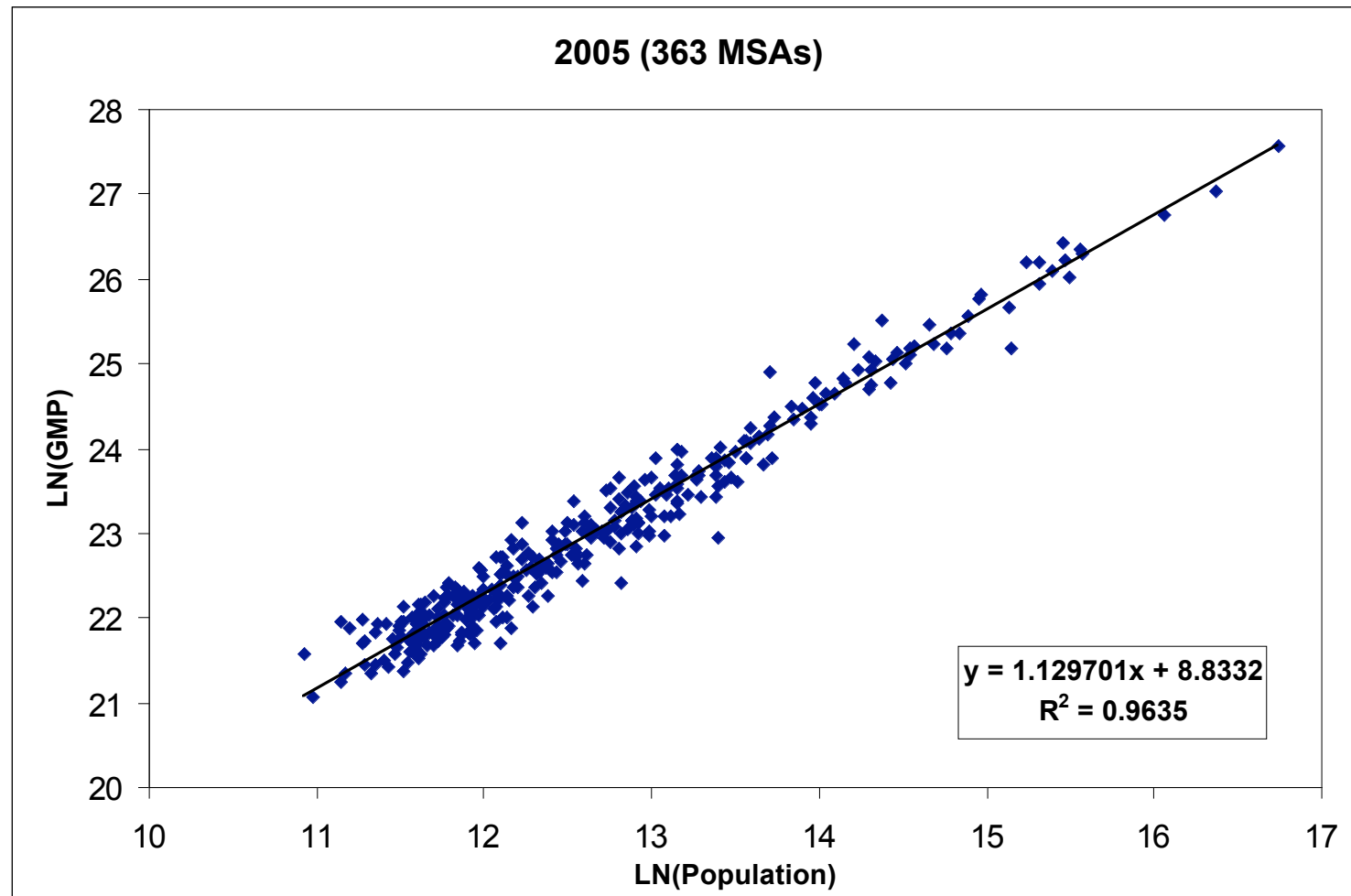


economy
of scale



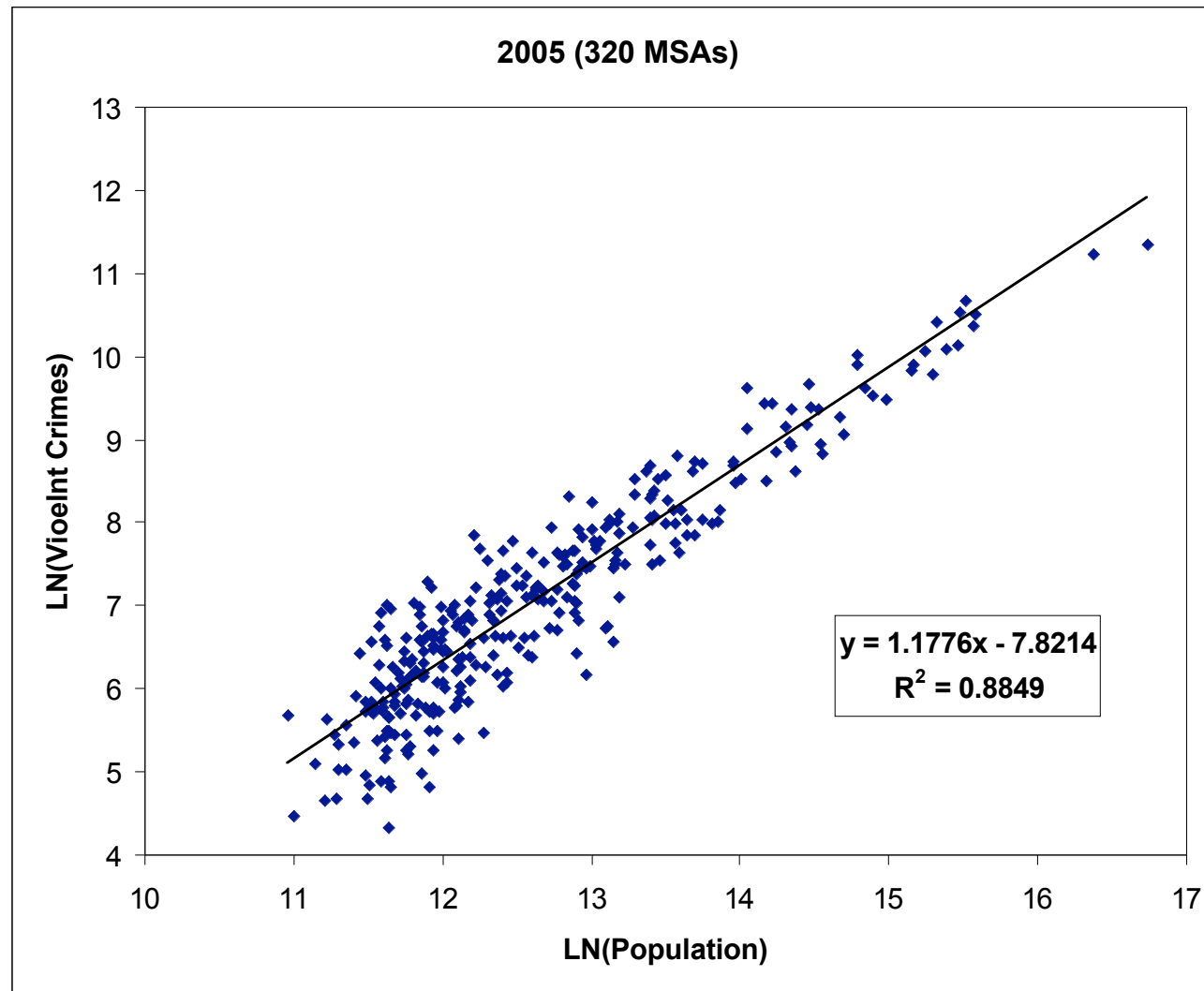
variable	exponent \pm std. error for all	exponent \pm std. error for first 100
net generation	1.34 ± 0.14	1.81 ± 0.24
usable generation	1.09 ± 0.03	1.24 ± 0.05
households that are end users	1.04 ± 0.02	1.09 ± 0.04
supply to households	1.00 ± 0.03	1.14 ± 0.04
end users	1.03 ± 0.02	1.08 ± 0.03
supply to end users	1.05 ± 0.03	1.16 ± 0.05
Length of cables	0.88 ± 0.03	0.90 ± 0.06
Losses	1.10 ± 0.03	1.18 ± 0.07

Gross metropolitan product of americal cities vs. population

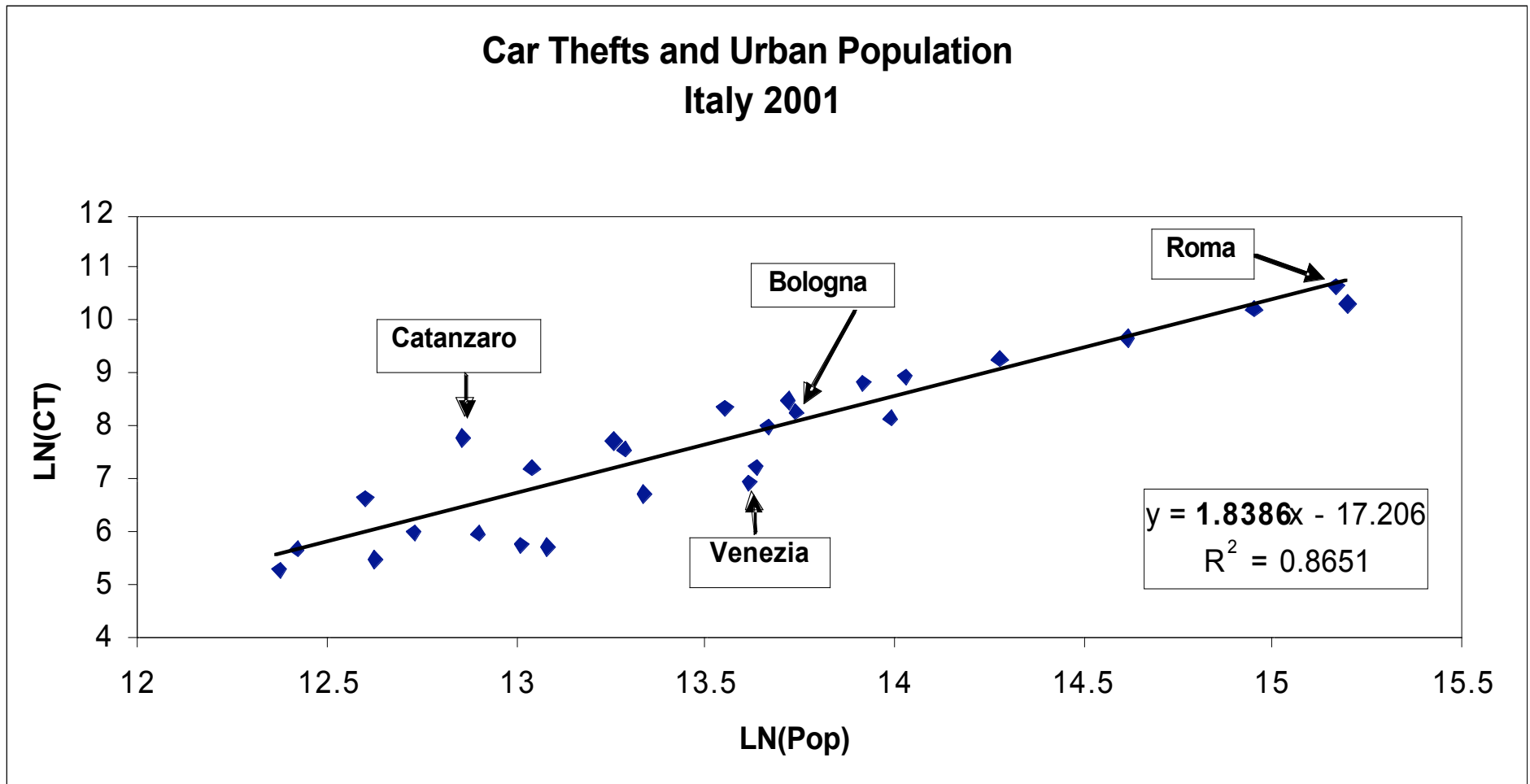


New York Cities Economy is larger than India's

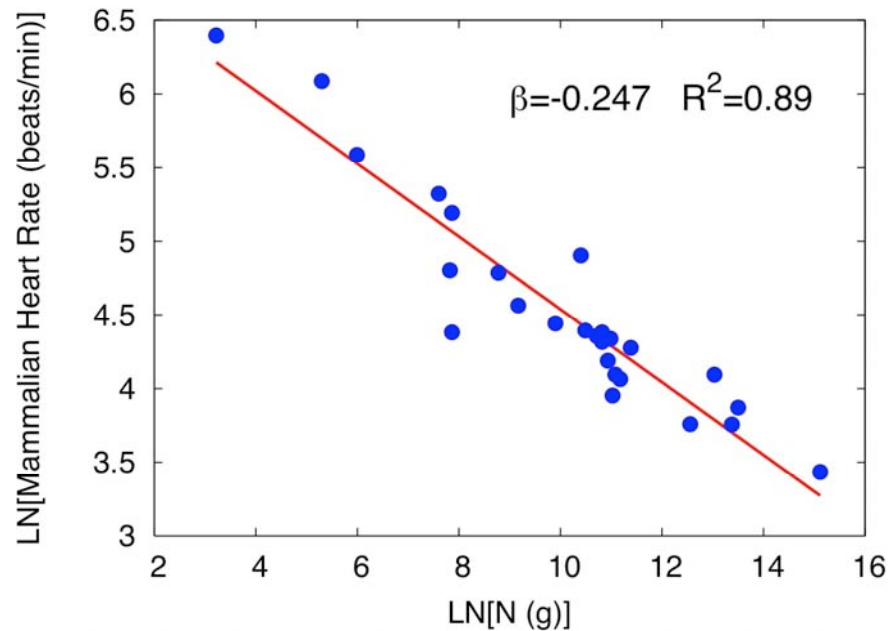
Violent crime in American cities vs. population



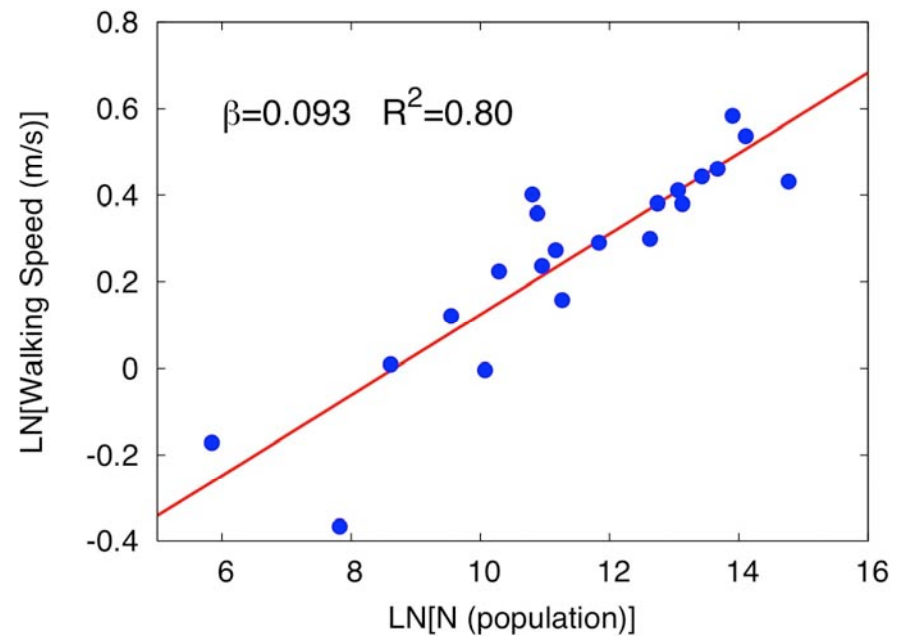
Car thefts in Italian cities vs. population



Pace of biological life vs. Pace of social life



Heart Rate vs. Body Size



Walking Speed vs. Population Size

conservation laws and growth

energy conservation:

$$R = NR_c + E_0 \frac{dN}{dt} + T \frac{dS}{dt} - p \frac{dA}{dt}$$

| **available resources**
/ **costs**
/ **growth**
/ **entropy**
/ **expansion (sprawl)**

$$n = \frac{N}{A} = n_0 N^\alpha, \quad \frac{dA}{dt} = (1 - \alpha) N^{-\alpha} \frac{dN}{dt}$$

Sprawl reduces the cost of growth for smaller cities

A city may allocate its resources to creating **information** or to **population growth**

growth under scaling laws

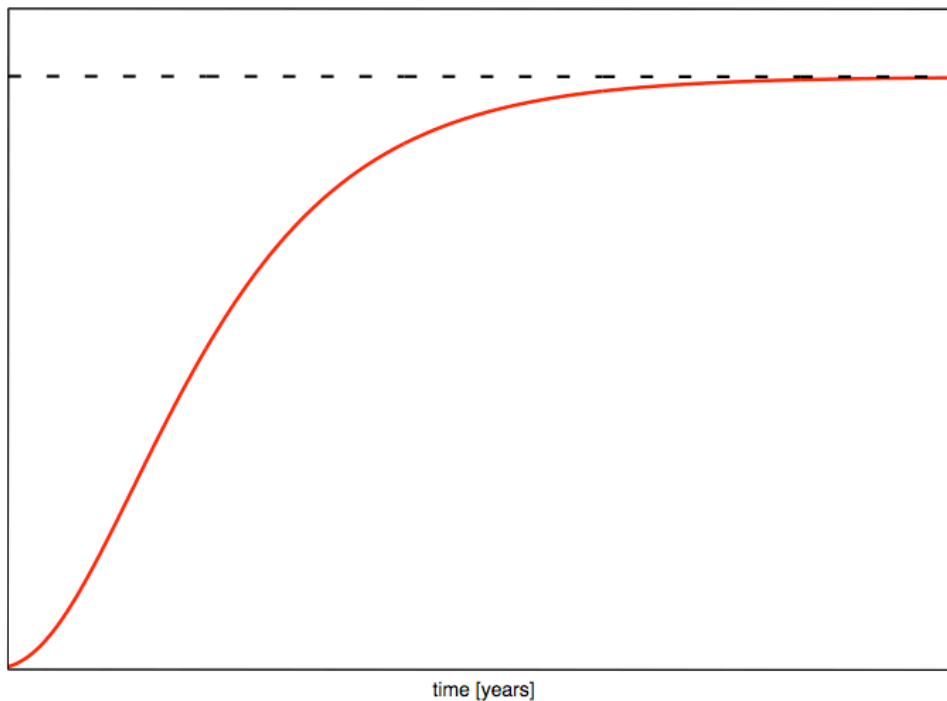
Consider the energy balance equation:

$$\underbrace{R}_{\text{available resources}} = \underbrace{NR_c}_{\text{costs}} + E_0 \underbrace{\frac{dN}{dt}}_{\text{growth}} \rightarrow \frac{dN}{dt} = \frac{R_a}{E_0} N^\beta - \frac{R_c}{E_0} N$$

General Solution:

$$N(t) = \left[\frac{R_a}{R_c} + \left(N^{1-\beta}(0) - \frac{R_a}{R_c} \right) \exp\left[-\frac{R_c}{E_0}(1-\beta)t\right] \right]^{\frac{1}{1-\beta}}$$

$\beta < 1$ implies limited carrying capacity
biological population dynamics

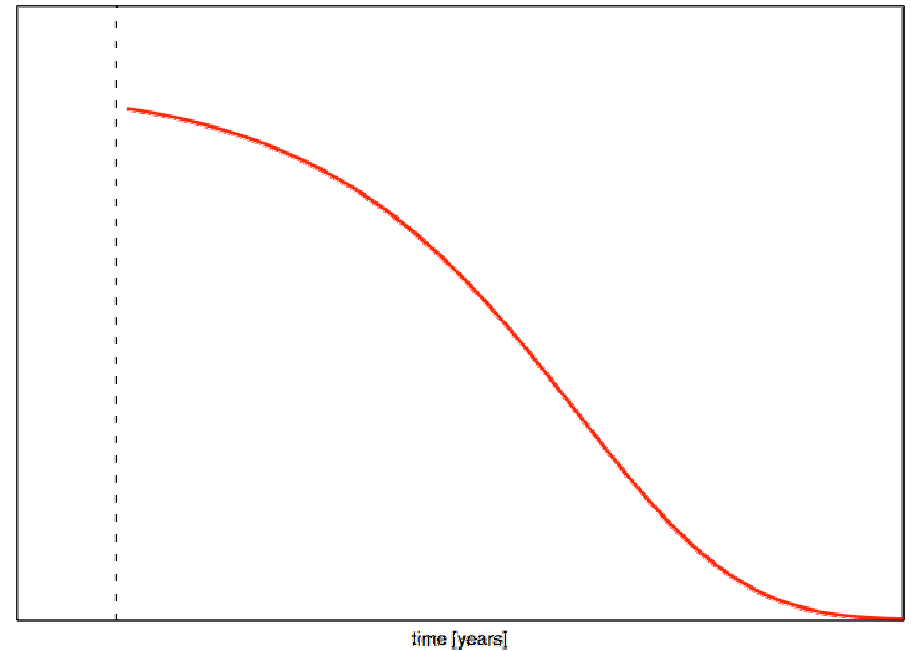
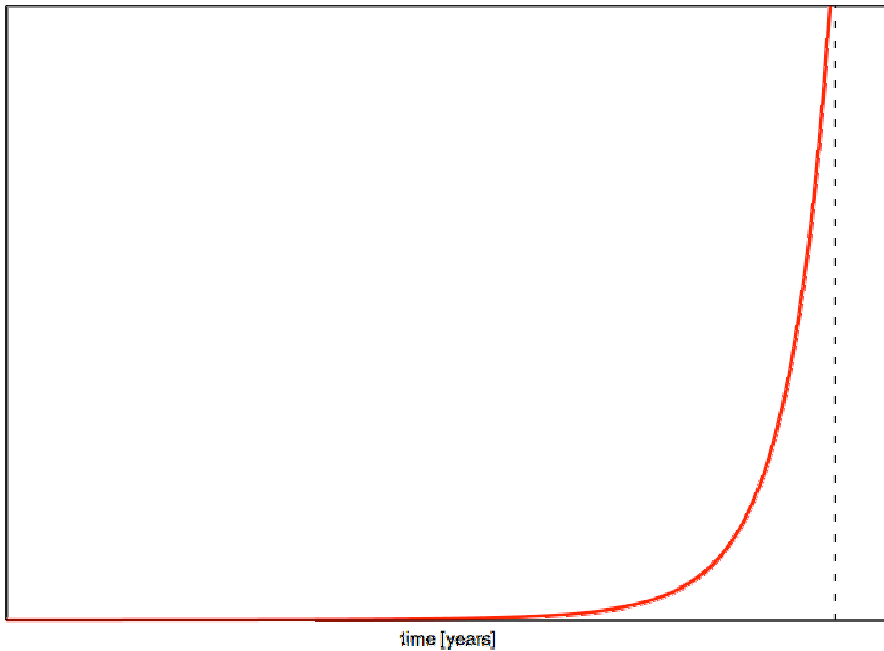


$$N_{\infty} = \left(\frac{R_a}{R_c} \right)^{\frac{1}{1-\beta}}$$

The dynamics is asymptotically stable -> static equilibrium

$\beta > 1$: Finite time Boom and Collapse

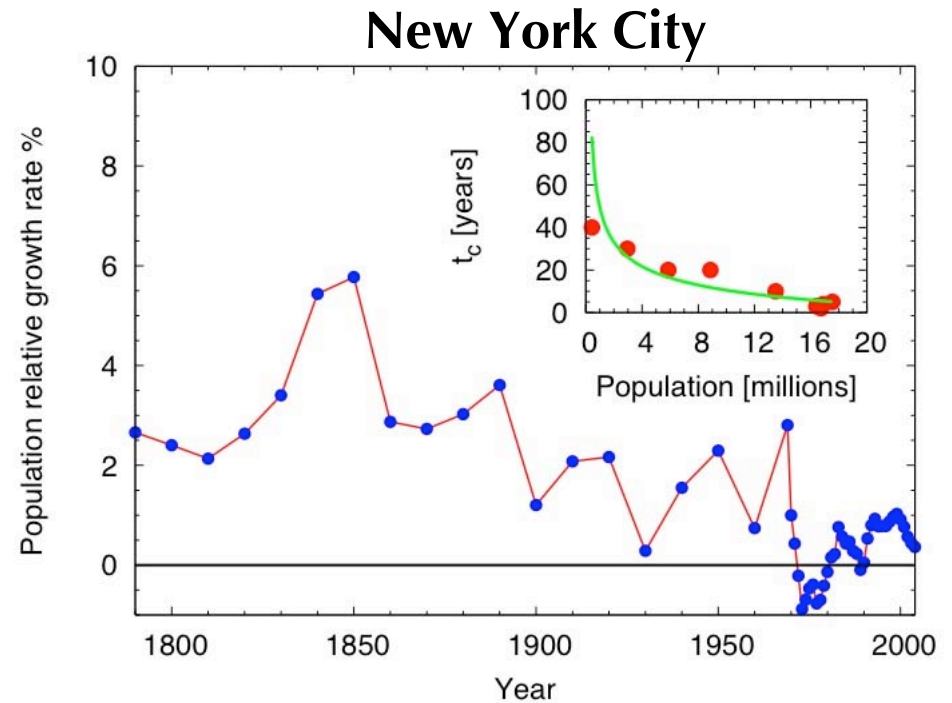
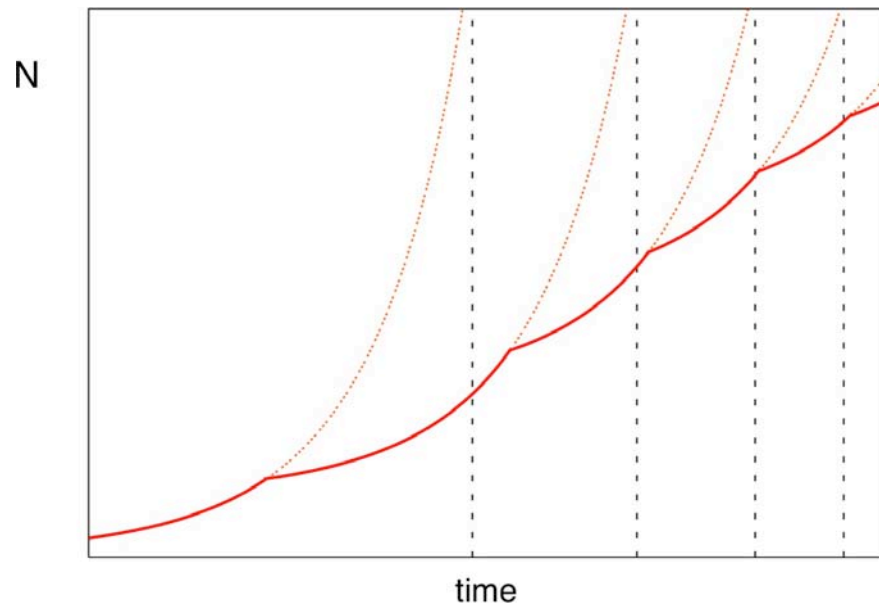
$$N(t) = \left[\frac{R_a}{R_c} + \left(N^{1-\beta}(0) - \frac{R_a}{R_c} \right) \exp\left[-\frac{R_c}{E_0}(1-\beta)t\right] \right]^{\frac{1}{1-\beta}}$$



$$t_{crit} \approx \frac{E_0}{(\beta-1)R_a} N^{1-\beta}(0) \cong 50 \frac{T}{n^{\beta-1}} \quad \text{years.}$$

The dynamics is never stable in a finite population

Escaping the singularity with $\beta > 1$: cycles of successive growth & innovation



$$t_{crit} \approx \frac{E_0}{(\beta - 1)R_a} N^{1-\beta}(0) \cong 50 \frac{T}{n^{\beta-1}} \text{ years.}$$

➡ t_{crit} shortens with population size N

Innovation, investment, productivity in energy science and technology



World database of energy technology patents

10952	(1623)	Coal
9224	(1297)	Petroleum
3920	(1045)	Natural gas

Fossil fuels

work with Jasleen Kaur

23521 (3829)

15565	(3924)	Solar
9540	(1513)	Wind
1712	(322)	Hydroelectric
1521	(420)	Geothermal
163	(38)	Biofuels

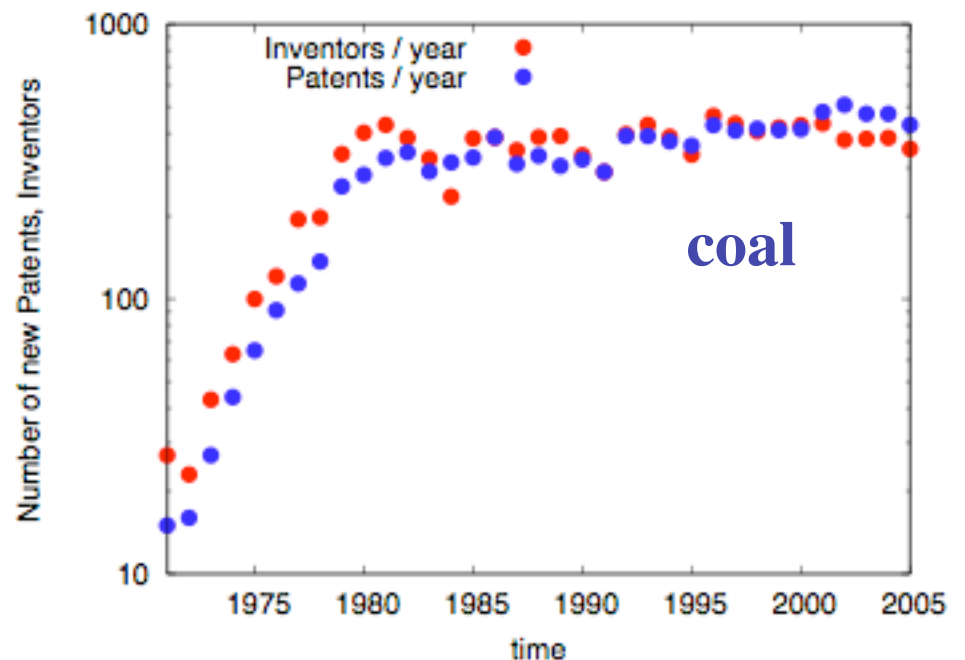
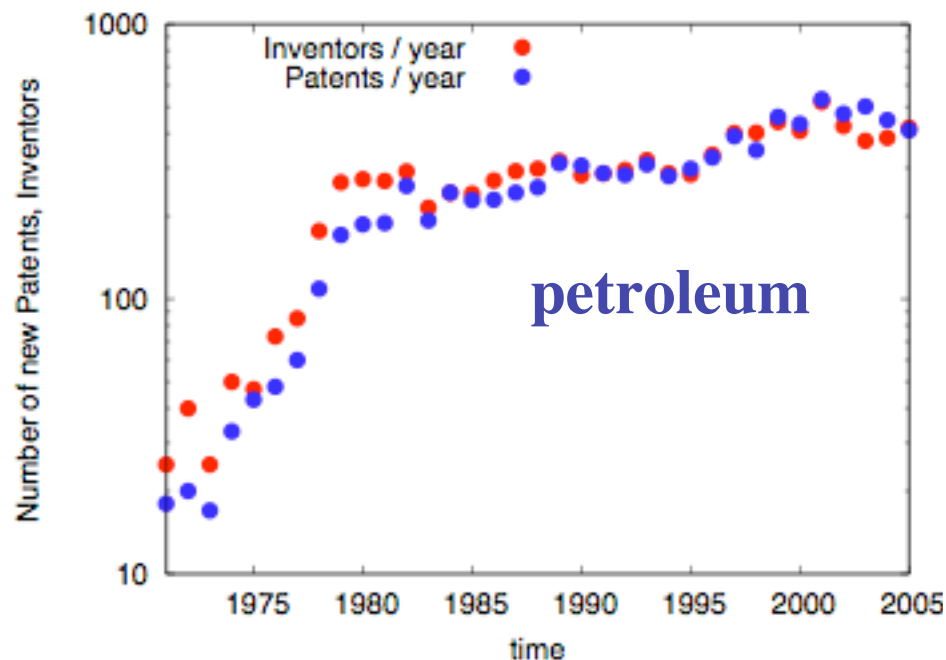
Renewables

28110 (6135)

829	(83)	Nuclear Fusion
157	(38)	Nuclear Fission

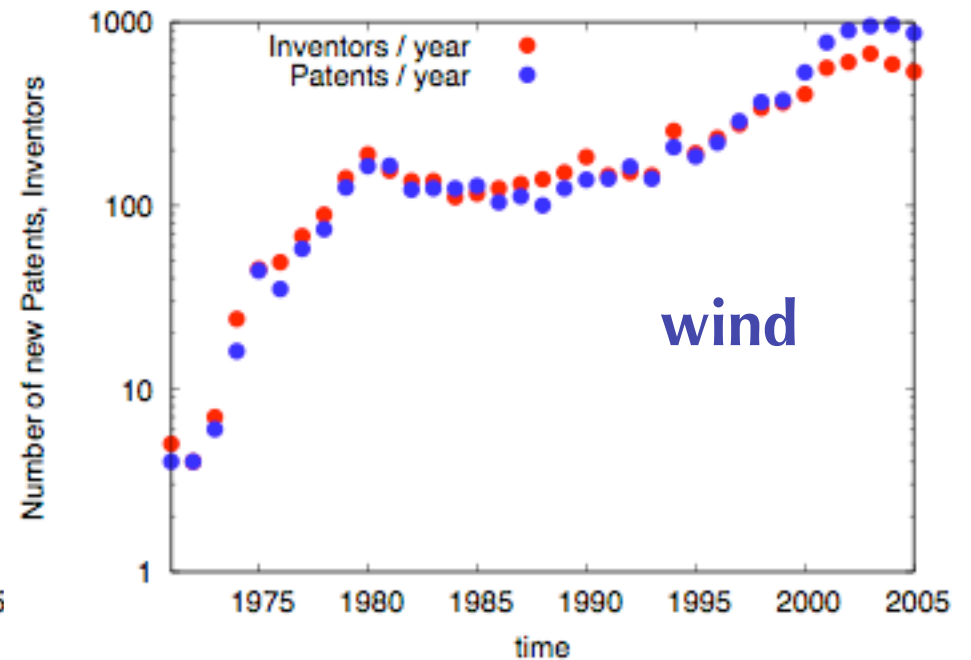
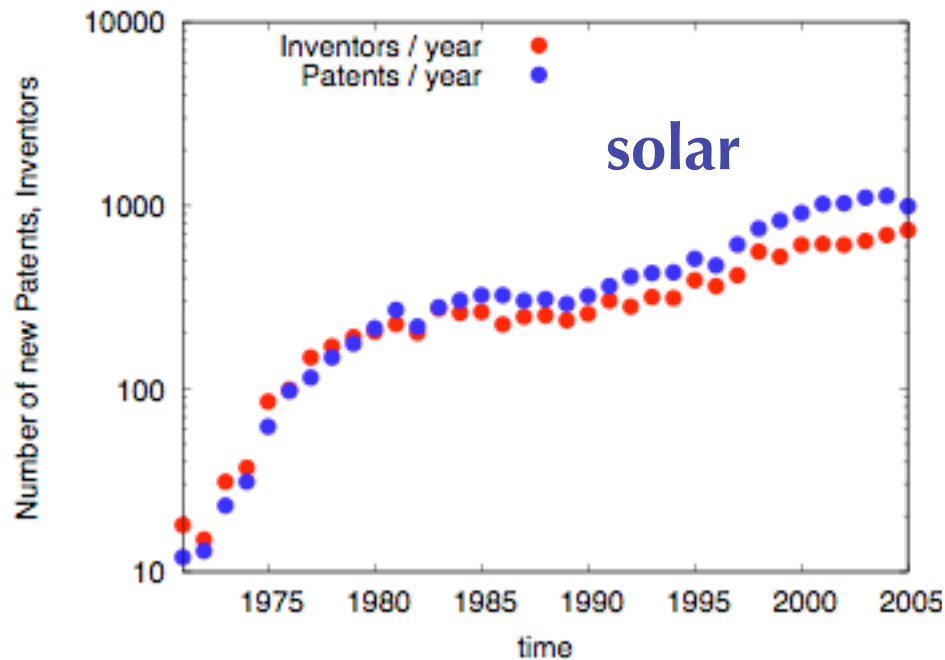
Nuclear technology 971 (120)

Patterns of energy innovation in time



Yearly invention rates in **fossil fuel technologies**
have been \sim constant since the 80s

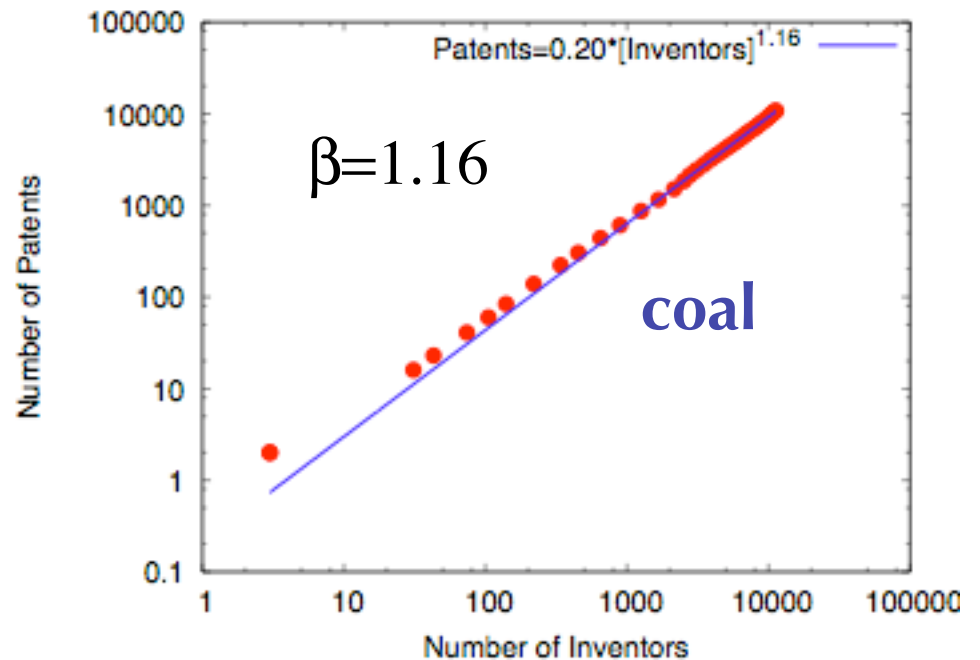
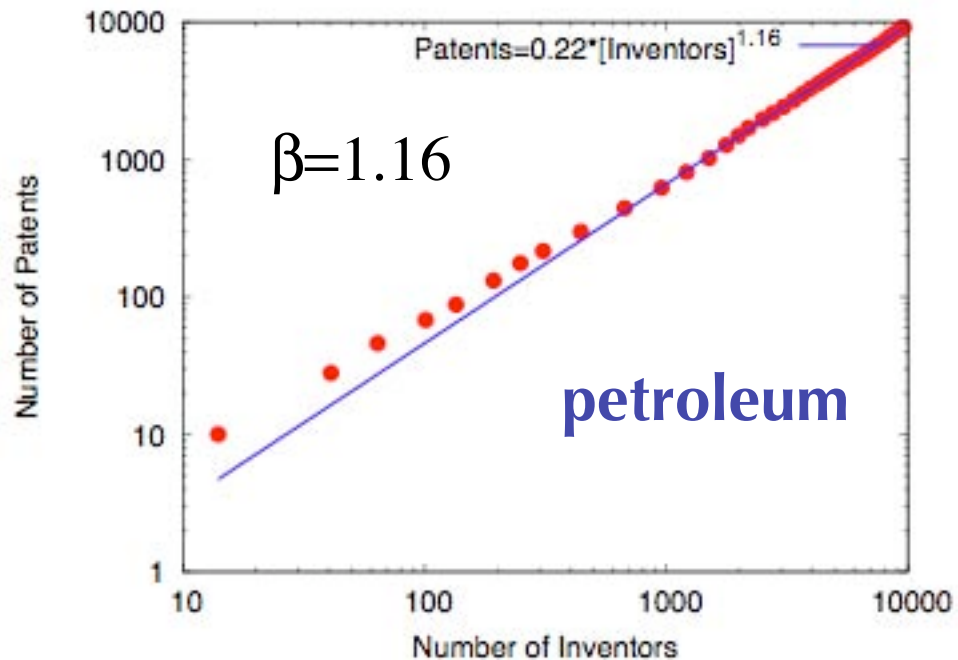
Patterns of energy innovation in time



Rates of invention in **renewable technologies** have steadily increased

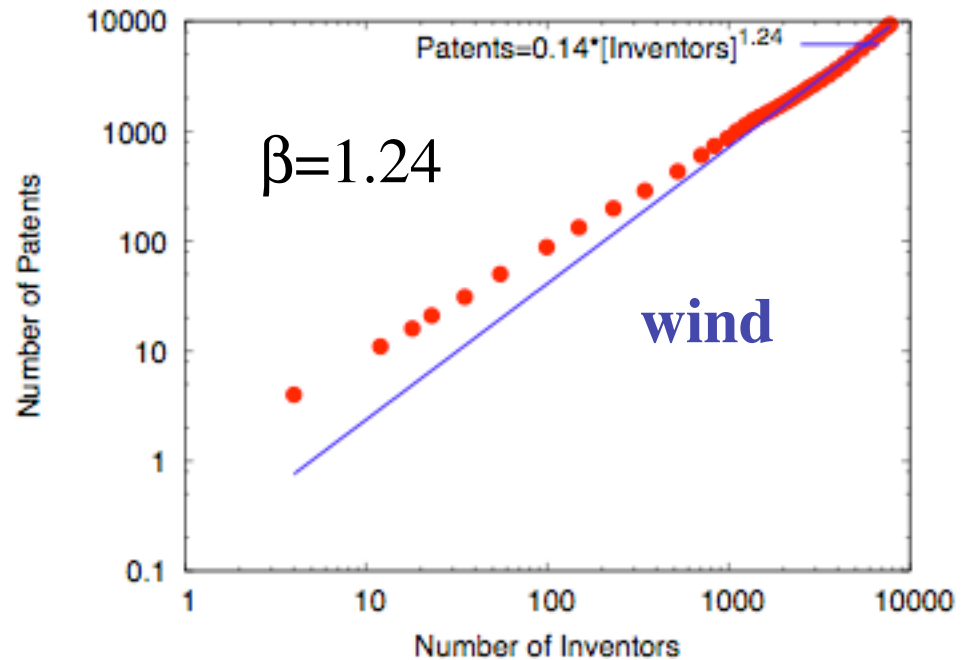
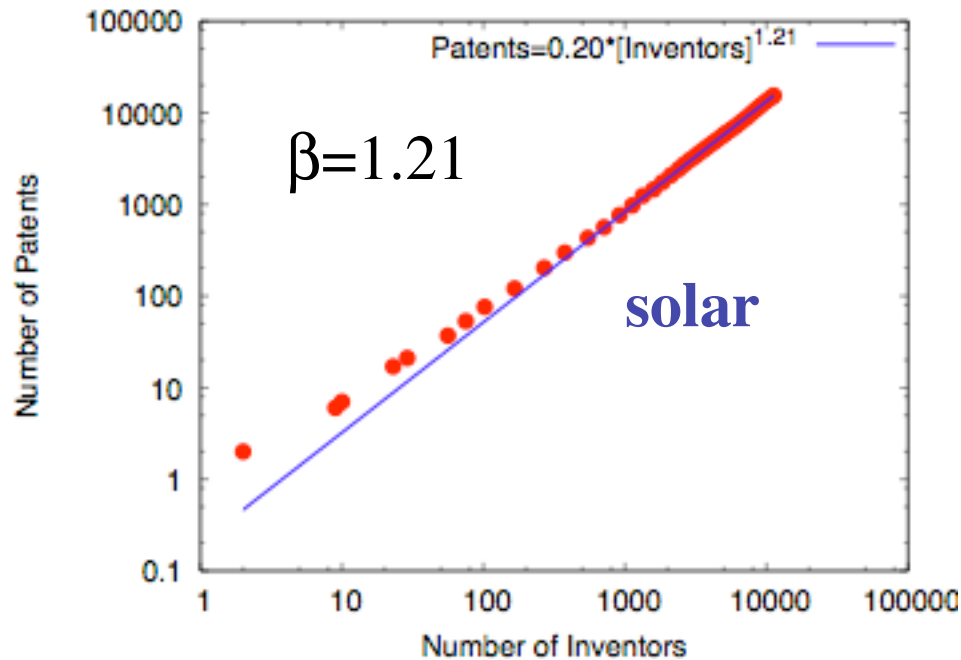
Marginal returns to labor

fossil fuels



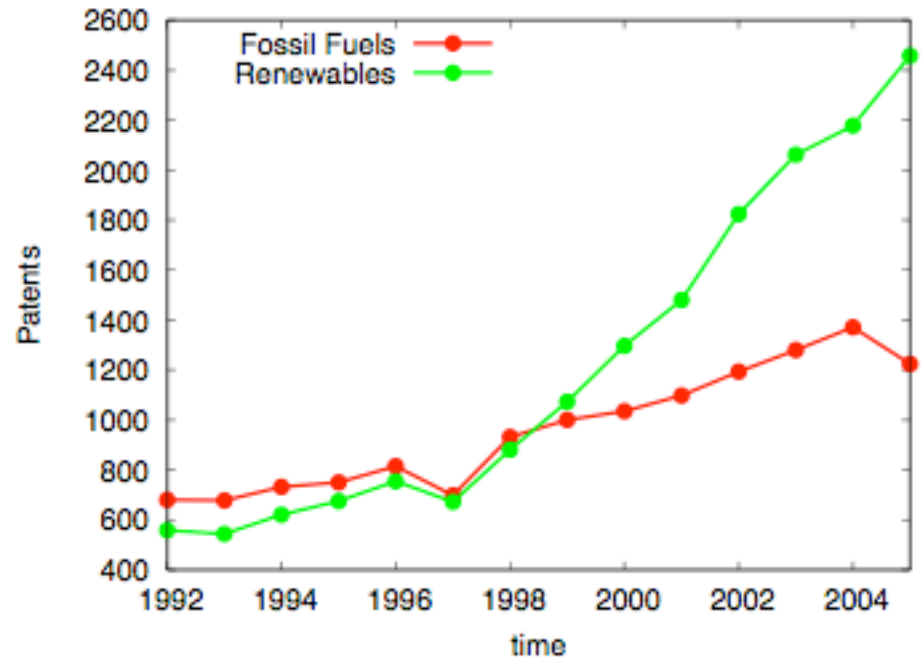
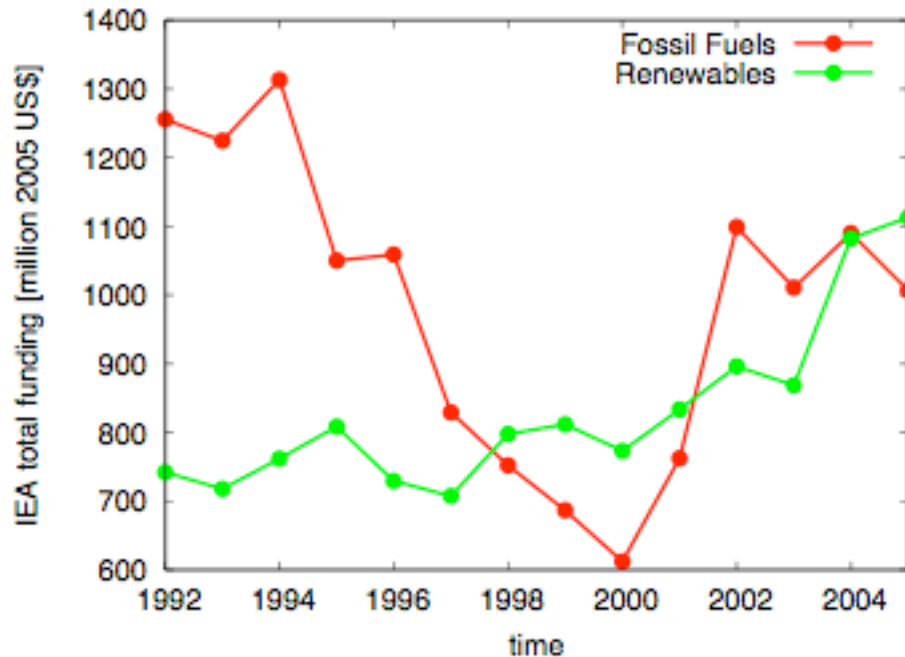
Patenting in oil and coal shows moderate increasing returns to labor

Marginal returns to labor renewables



solar and wind show **stronger returns to labor investments**
than **fossil fuel** technologies

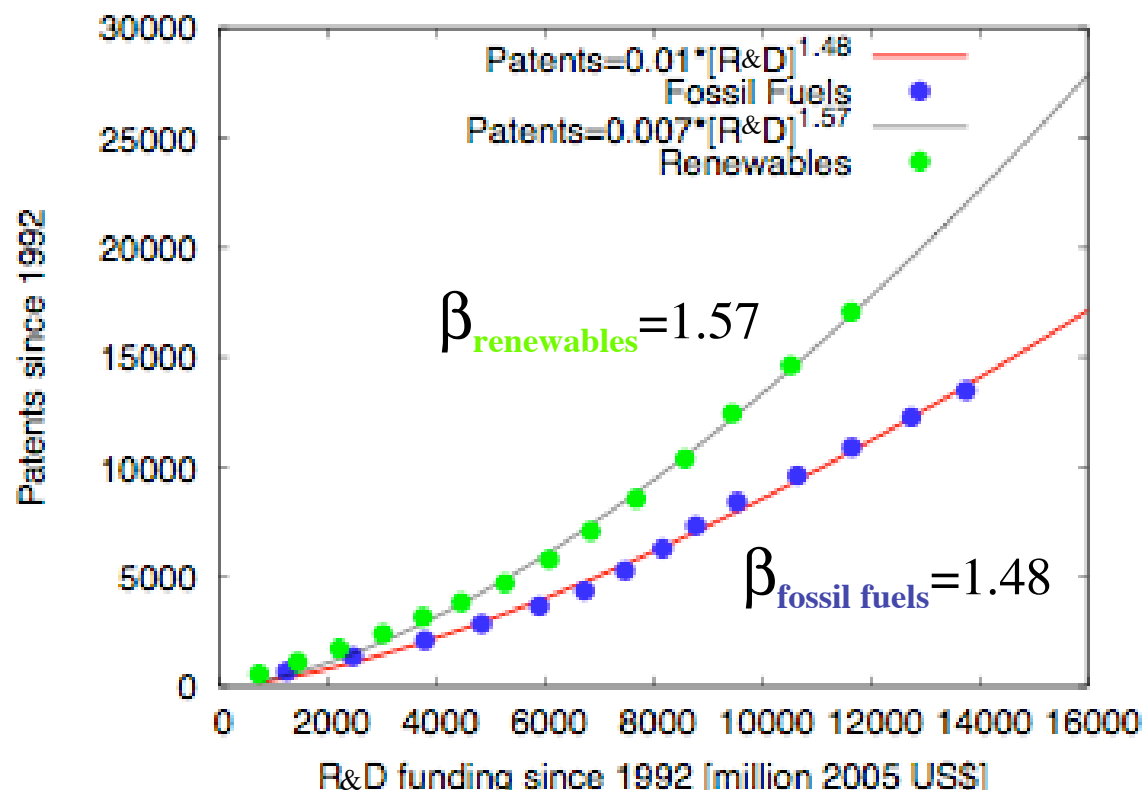
Worldwide funding for energy R&D vs. patenting trends



Funding data from International Energy Agency 2006 report

Renewables are overtaking **fossil fuel** technologies in terms of **innovation** and increasingly in **R&D funding**

Returns in innovation to R&D investments



Renewable technologies' patents show **greater returns** to R&D investment relative to **fossil fuels**

social aggregate regularities

hypotheses and theory

Despite non-stationarity, multiple interactions modes,
non-locality, innovation, individual adaptation

Many **empirical regularities** appear as functions of **population**
or **resources** (investment, labor)
but not as simple functions of **time**

Increasing returns to scale ($\beta > 1 \sim 1.15$) in **socio-economic**
variables are a universal
self-similar feature of cities, innovation

What are the **essential social networks** that mediate them?
What is the role of **spatially optimized infrastructure**
networks?