



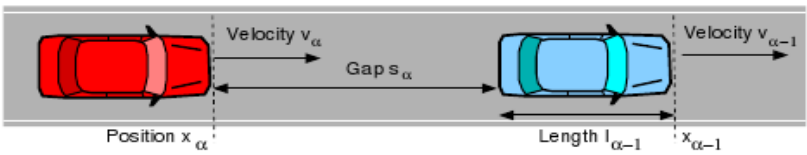
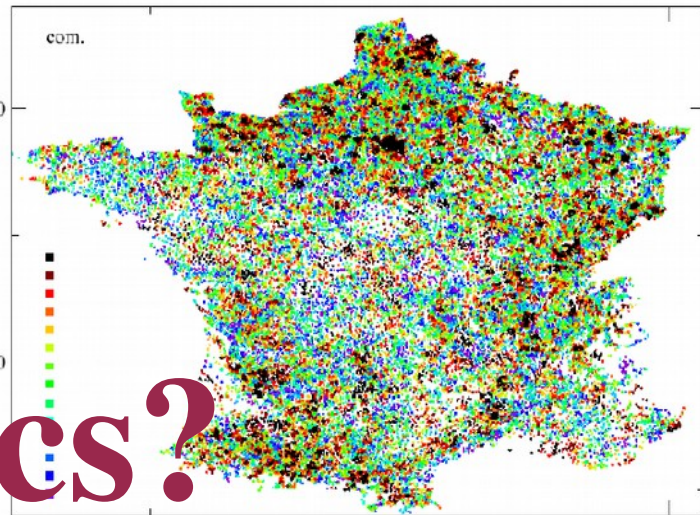
# Pourquoi des élections si serrées ?

Mexique, Italie, Allemagne : les scrutins se décident à quelques voix près. Un scientifique explique

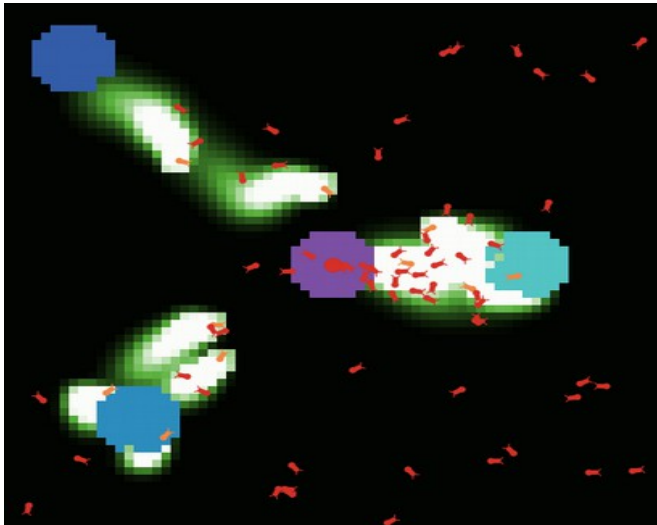
Serge [redacted]

Physicien au CNRS, membre du Centre de recherche en épistémologie appliquée (CREA) de l'Ecole polytechnique

**T**e Mexique se tro-  
paradoxe démoc  
l'on a toujours en  
car totalement  
Un président en



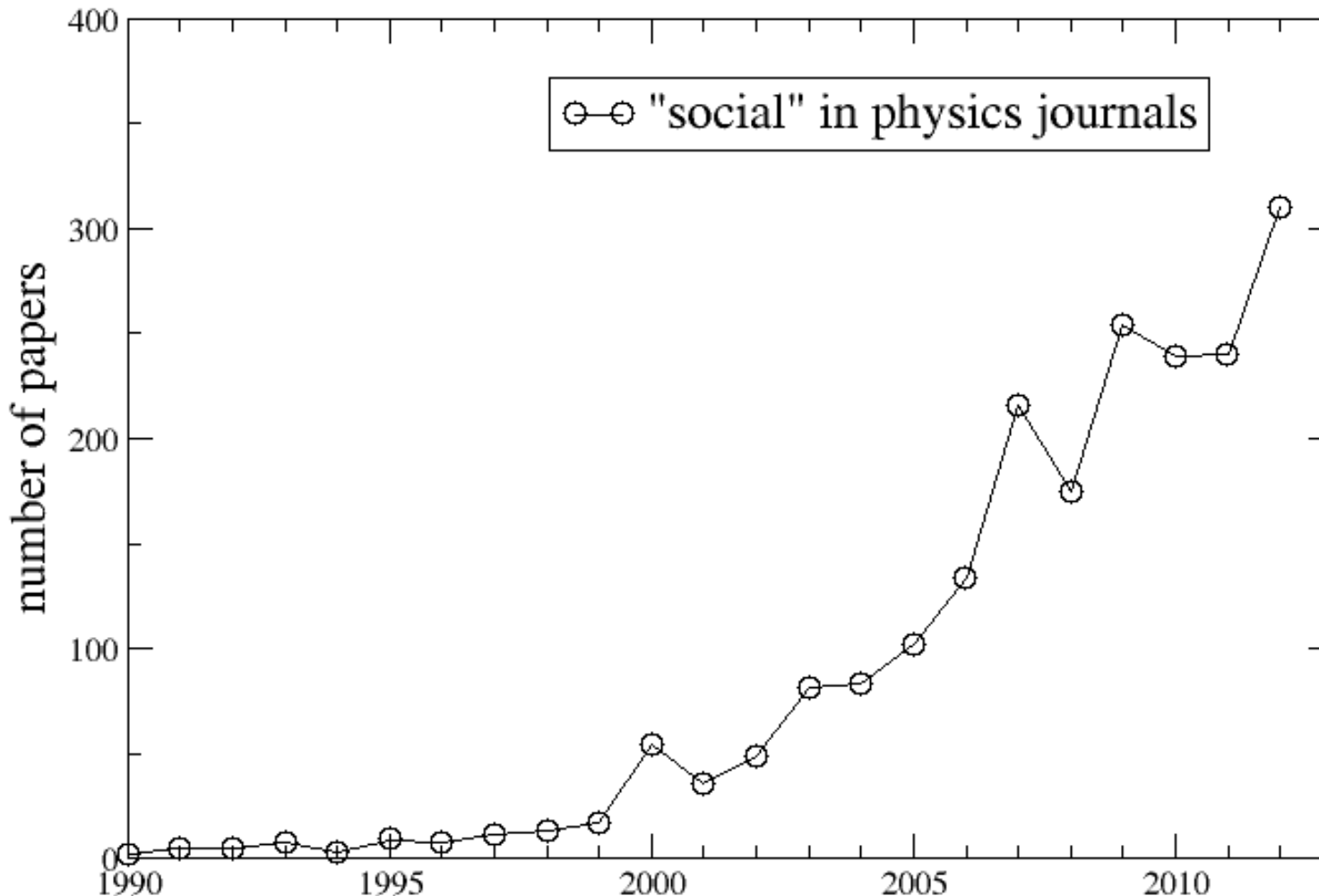
# Sociophysicis?



# Deux types d'approche

- Société virtuelle simplifiée où l'on comprend effets, causalités en détail
  - Modèles simplistes (style Ising : Schelling, Mirta)
  - Modèles plus réalistes (fourmis, trafic, épidémio...)
- Analyse de données réelles
  - Réseaux, data mining, dynamique
- Croissance car avalanche de données sociales
  - Web, réseaux sociaux, téléphones, cartes crédits, Vélov...

# Un domaine scientifique en croissance



mais petit ! (nanotube : 11 000 articles en 2008, simulations 100 000 !)

# Des régularités sociales à la physique statistique

- Poisson prouve la loi des grands nombres dans : "Recherches sur la probabilité des jugements en matière criminelle..., précédées des Règles générales du calcul des probabilités" (1837)
- Physiciens/données sociales, 19ème : Halley, Fourier, Poisson, Laplace... proches du pouvoir politique/économique : régularités sociales ! (taux suicide, mortalité stables)
- Quételet : la loi Normale passe de 'erreur sur vraie valeur' à 'distribution d'objets réels', indispensable à Maxwell
- Maxwell lit Quételet et "Histoire anglaise" de Buckle, science historique partant des lois statistiques (mortalité..., 1857)
- Maxwell s'en inspire pour renoncer au rêve Newtonien : suivre dans le détail tous les mouvements individuels des molécules, et en venir à connaissance via les distributions, les moyennes

# Lien entre préférences individuelles et structure sociale

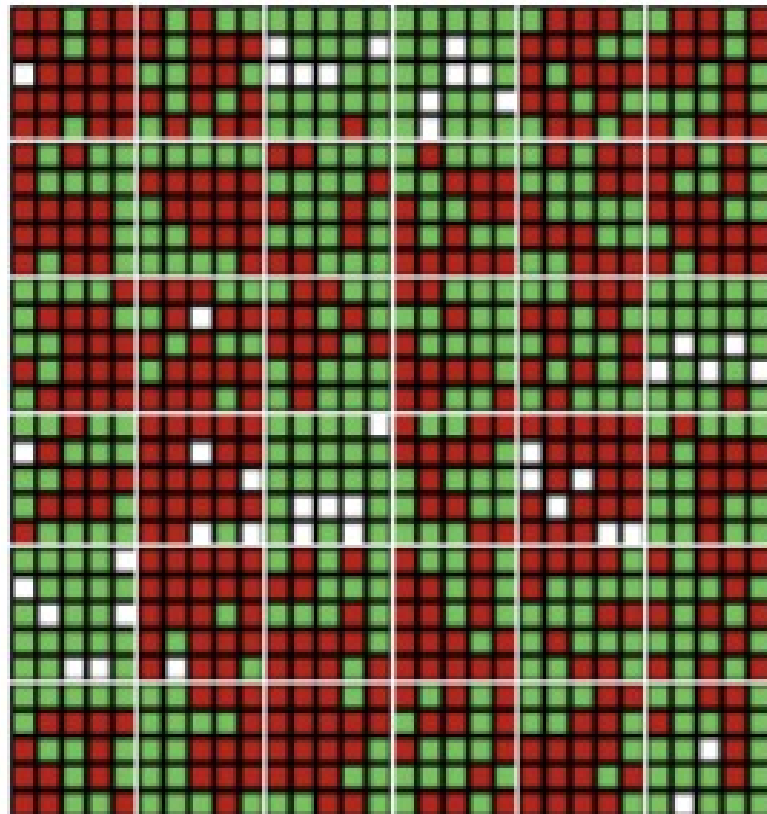
Physique et économie, respect des spécificités !

S Grauwin, E Bertin, R Lemoy & PJ  
*PNAS* **106**, 20622 (2009)

SG, F Goffette-Nagot & PJ, *J of Pub Economics* (2011)



# Schelling's model of segregation (1971, simplified)



City  $\equiv Q$  blocks composed of  $H$  cells

Mean density  $\rho_0$  of particles fixed

State of the system  $x \equiv \{\rho_q\}$

Agents are sensitive to the composition of their neighborhood  
 $\Rightarrow$  utility  $u(\rho_q)$



# Dynamical rule



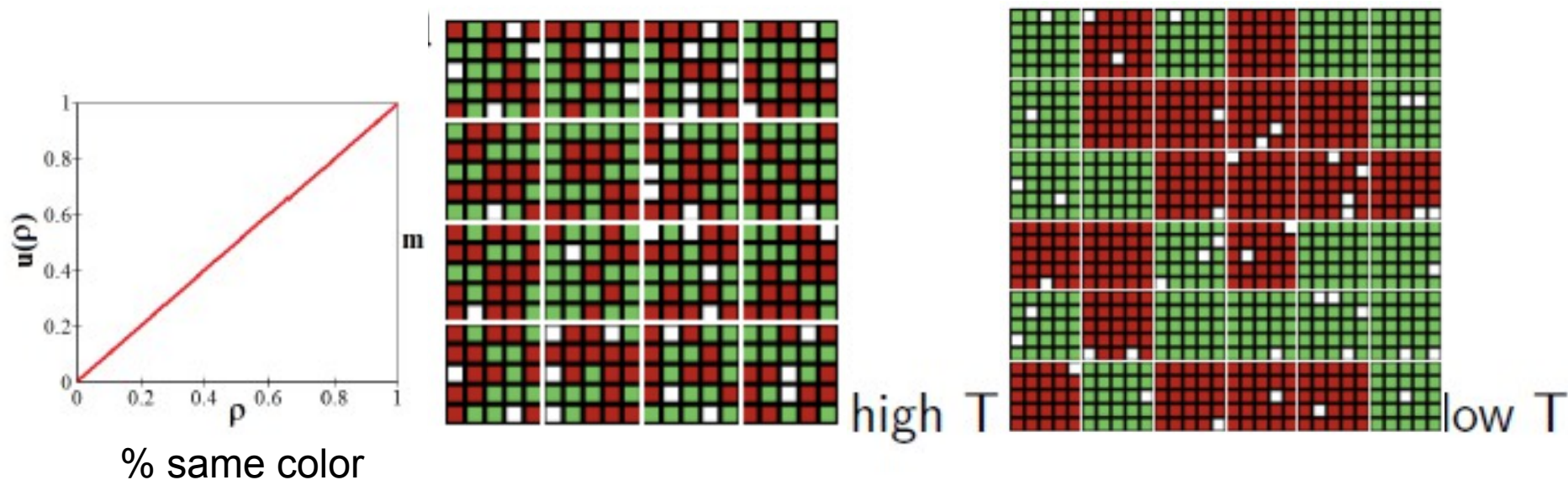
- At each iteration, an agent and a vacant cell are chosen at random
- The agent moves in that vacant cell with probability :

$$Pr\{move\} = \frac{1}{1 + e^{-\Delta u/T}}$$

- $\Delta u = u_{after} - u_{before}$
- $T > 0$  : intensity of the random “noise” (quality of the location, amenities...)



# Example



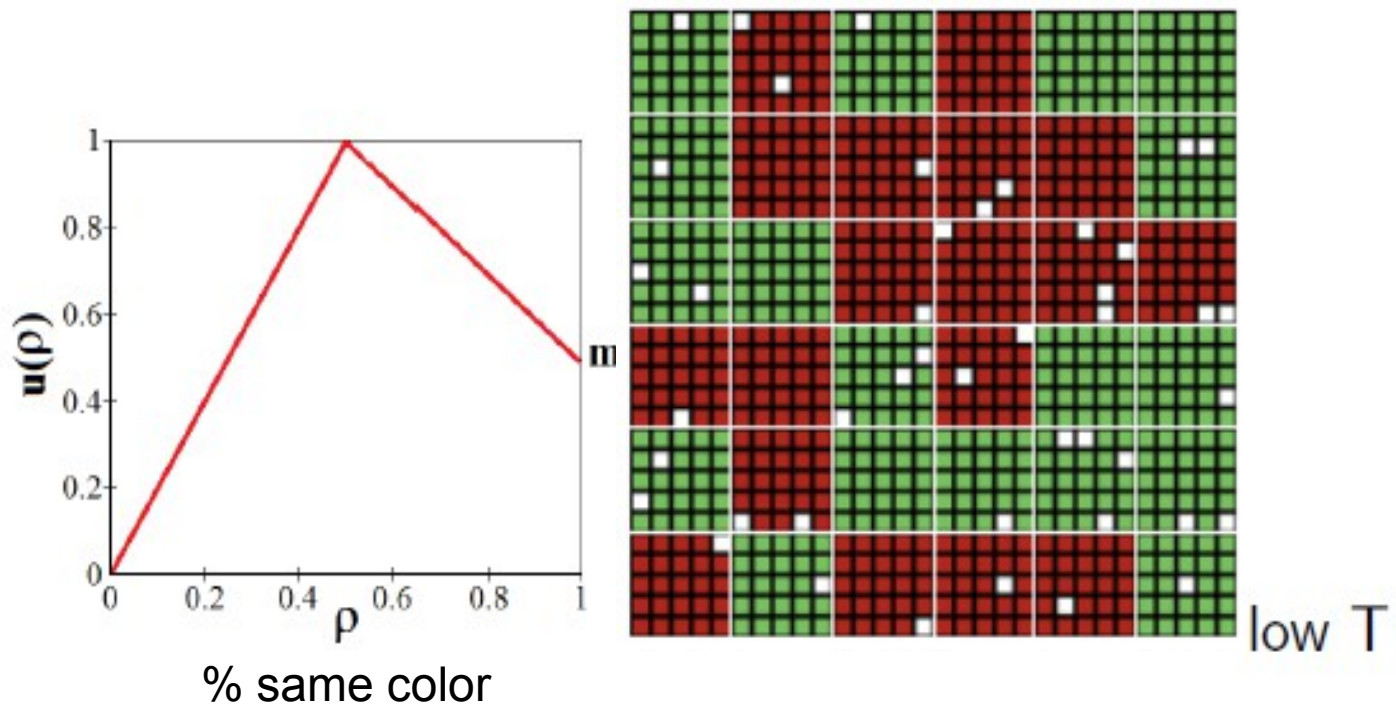
Similarity with Ising?

Stauffer and Solomon, arXiv :physics/0701051v1 "Schelling could have based his work on a long history of physics research (and Ising model)... but in 1971 Schelling did not yet know this physics"





CAUTION!



Not so simple...



# Concepts from physics and economics



## Physics

Particles

Energy of a particle  $\epsilon$

Total energy  $E$

Dynamics : minimization of system's **total** (free) energy

## Economics

Agents

Individual utility  $u$

Collective utility  $U = \sum u$

Dynamics : maximization of agents' **individual** utility





- Change continuously between individual and collective dynamics :

$$Pr\{move\} = \frac{1}{1 + e^{-C/T}}$$

- $C = \Delta u + \alpha(\Delta U - \Delta u)$
- $\alpha$  : tax/cooperativity parameter
  - $\alpha = 0 \longrightarrow$  “economics”, individual dynamics
  - $\alpha = 1 \longrightarrow$  “physics”, collective dynamics
- How to predict the global state for a given utility  $u(\rho)$  ?
- No state function ? !



# Our solution : Link function



- There exists a **global** (state) function  $L(x)$  such that, for each move

$$\Delta u = \Delta L$$

$L$  links micro (individual moves) to macro (state function) !

$$L(x) = \sum_q \sum_{m=1}^{n_q} u(m/H) \quad (\textit{simplifiée})$$

- $\Pi(x) = \frac{1}{Z} e^{F(x)/T}$ ,  $F(x) = \alpha U(x) + (1 - \alpha)L(x) + TS(x)$

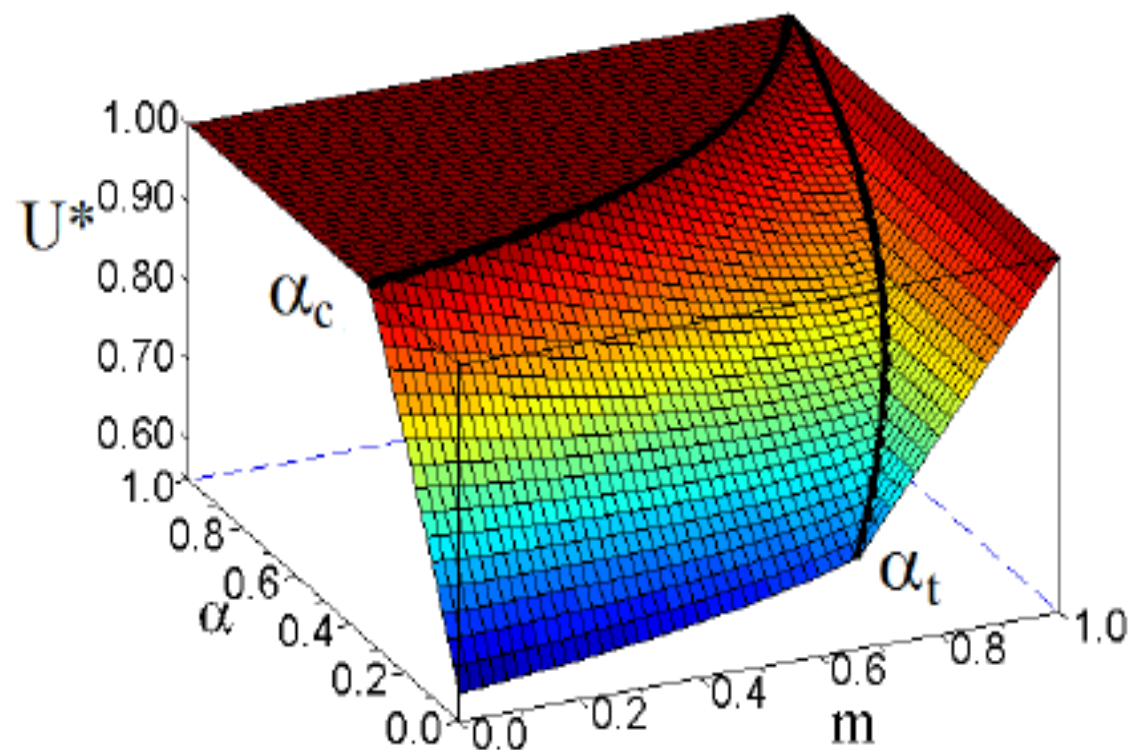
$F(x)$  : Generalized “free collective utility”

Resolution :  $H, Q \gg 1$  + standard phase separation methods

Stationary state maximizes  $F(x)$  (not  $U$ !)



# Collective utility - analytical result !



$$U^* = U/U_{max} = U/(\rho_0 H Q)$$





# Conclusion



## Conceptual differences between individual and collective dynamics

- $L$  extends free energy to deal with individual dynamics
- First analytical solution of (a simplified) Schelling model
- Paradigmatic example of unexpected macro behavior (40 citations/year)
- Interdisciplinary fruitful for both disciplines **if** respect of specificities !

*JP Bouchaud (review, J Stat Phys, 2013) : the most striking example in this review ... is the clear quantitative demonstration **[Grauwin]**, that the invisible hand can fail at solving simple coordination problems*

*Conceptually ok : but have we learnt something about society ?*



# Atomistic explanations

- Physique statistique: part de micro stable, pour "déduire" le macroscopique : des atomes aux propriétés des solides, des utilités individuelles à la ségrégation globale
- Expliquer en physique = ramener à phénomènes plus stables, plus généraux (noyaux, électrons ou atomes/matériaux ok !) Mais utile pour bio, socio : gènes, classe sociale ?
- We should not imagine that each individual is originally equipped with its own power, that he would then provide to common institutions. Instead, it is from the common power that each individual takes his individual power : we can think thanks to a - necessarily common - language.

*(Y Citton, Mythocracies, éd. Amsterdam, 2010)*

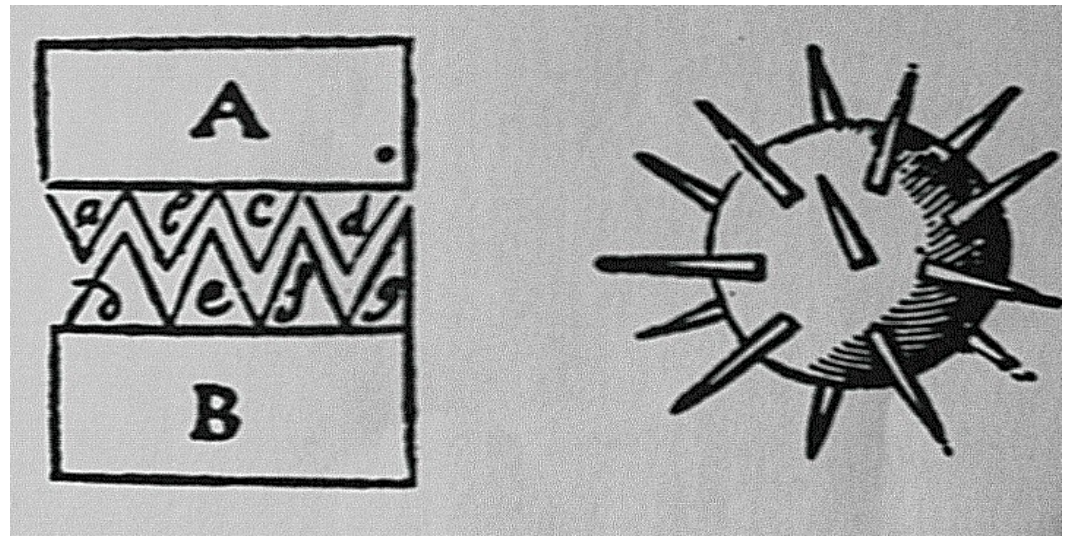
# Atomistic explanations

Simulating macro as emerging from the interactions among micro works because the properties of micro-agents, the rules of interaction and the nature of macro-structures are conveniently *simplified* to fit each with other

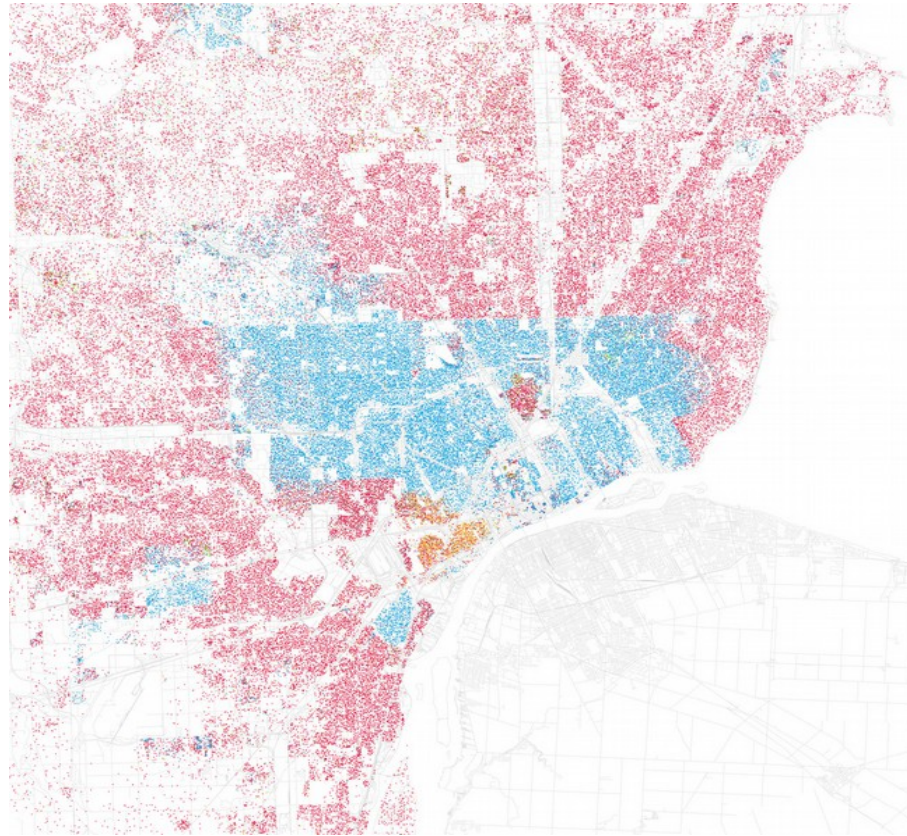
But why simulate the link between *artificial extremes*, when we can deploy the imbroglios of heterogeneous entities and map their roles **empirically**?

Micro-macro distinction  
not relevant for social?  
"Interactions" not local  
in space nor time

« atomes » des Cartésiens, 1700

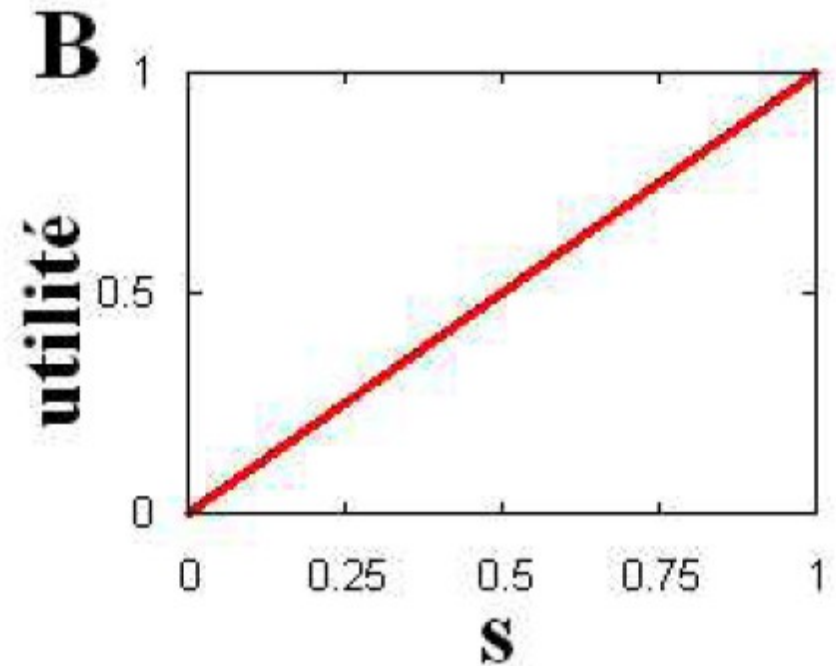
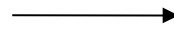
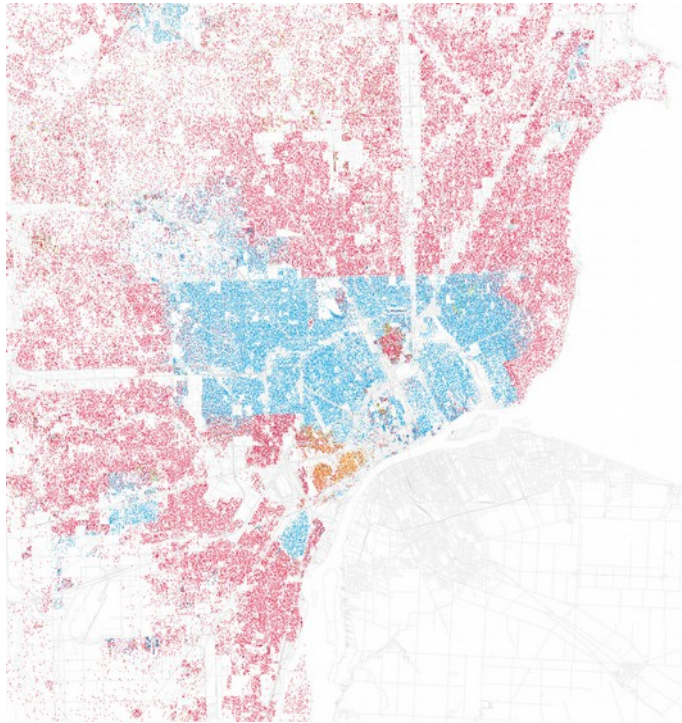


**« Alternative » to *atomistic* explanations :  
macro smaller than its parts ?  
Example of racial segregation**



**Detroit : non-Hispanic white is red, black is blue, Hispanic is orange and Asian is green (toutes les couleurs !)**



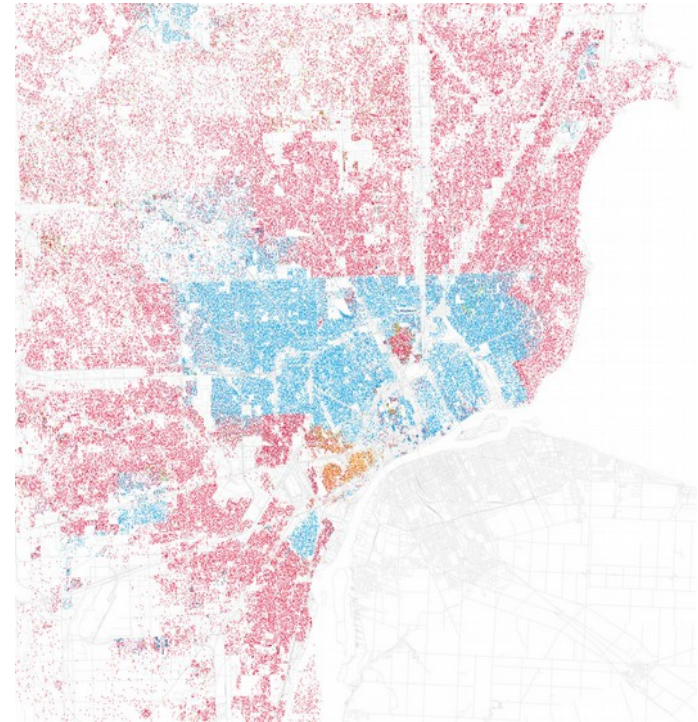
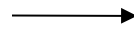
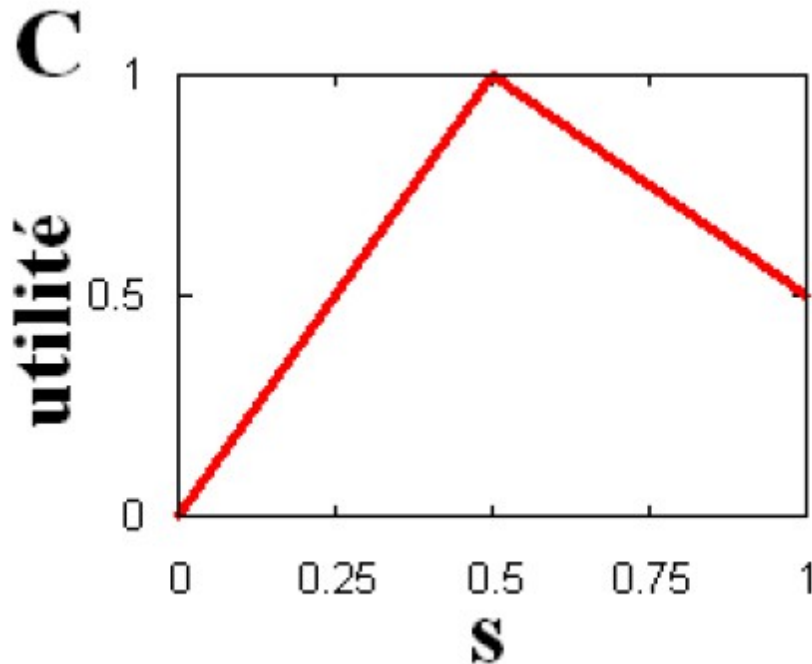


**Micro ↔ macro, sociologie à la Durkheim (caricature) :**

1. Régularité statistique (ségrégation **macro**, stable)

2. Explication : norme intériorisée par individus (**macro** → **micro**),  
préférence (inconsciente ?) vers ségrégation



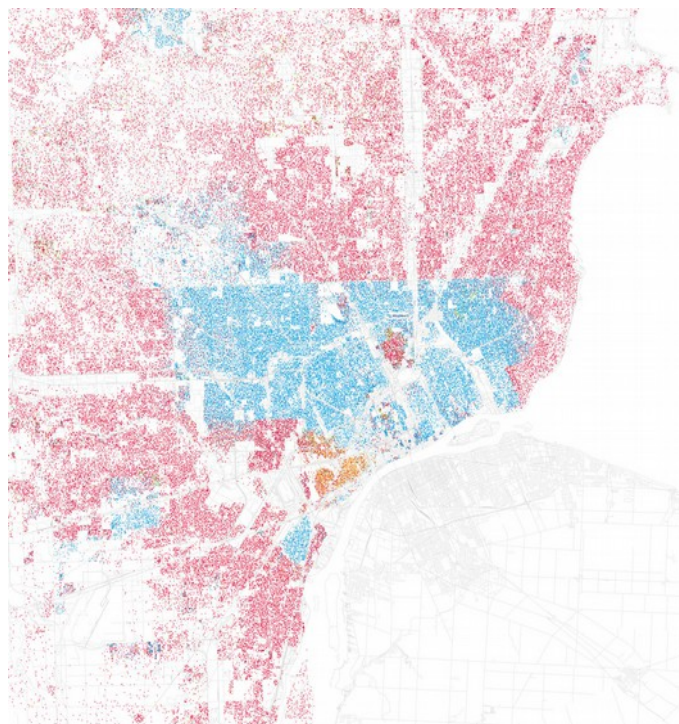


### ***Micro/macro en économie/socio-physique :***

*Chaque 'atome social' va maximiser son utilité individuelle (d'où vient-elle?)*

*Préférence individuelle pour mixité mène à... ségrégation ! (Schelling, Grauwil et al 2009) Macro → micro : attention !*

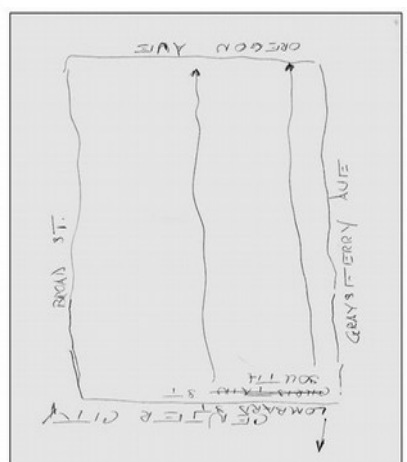
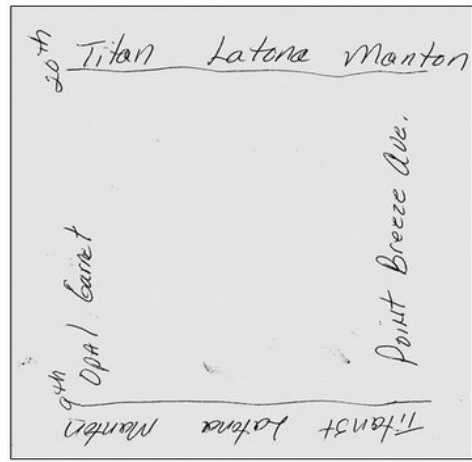
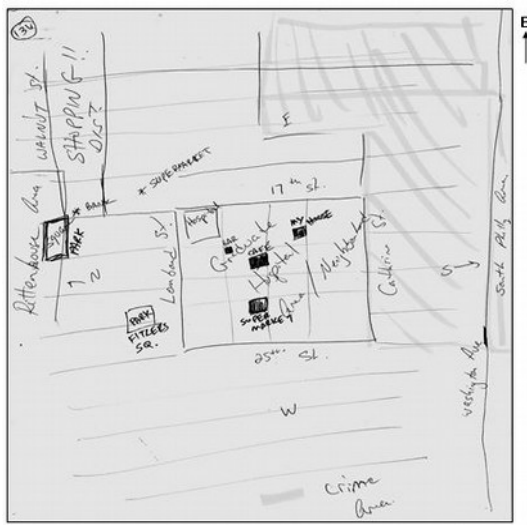
*Physique : maximiser (énergie) globale*



**Macro** (ville, quartier) est complexe et grand, fait d'interconnexions entre parties homogènes (**micro**, simples)

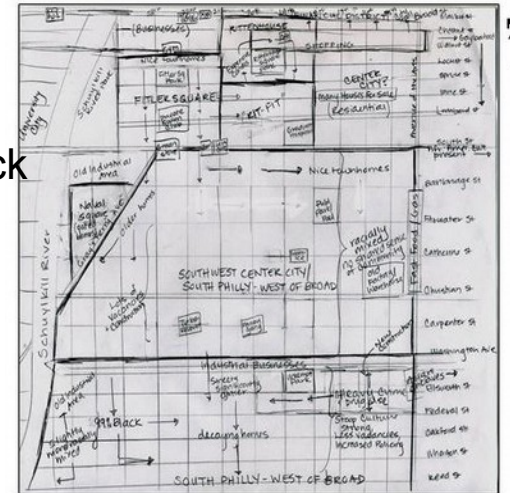
Vision alternative : macro est **plus petit** que les parties (coll B Latour, médialab, Sciences Po, Paris)

Macro comme cohérence **partielle et construite**



Alan, 62-year-old retired Black

Denise, 37-year-old Black



My personal map

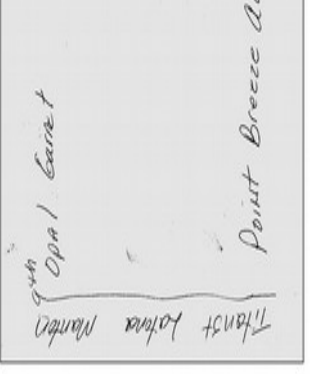
Melissa, 30-year-old White female

Translation of Melissa's map onto **standard map** provided by Philadelphia NIS (Macro)



From J Hwang  
Sociology Department  
Stanford University

**Example : each person has its own vision of his neighborhood (and « his » segregation) : coherent macro ?**



Alan

retired

Melissa

black

30 years

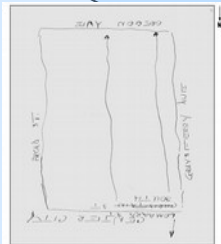


White

female



37 years



Black

**Neighborhood = Whole = standard map**

Smaller than parts, intersection,  
partial coherence, *made*

Denise



# Sociophysics useful ?

- Modèles jolis (pertinents?) ou outils d'analyse de données (sales)?
- **Cognitive issues** :
  - « social atom », drastic (and too convenient) simplification
  - simple models buy internal validity at the cost of external validity, use “thin concepts”, homonymous with everyday concepts, but “little of their behaviour from the real world is imported into the model” (Cartwright 1999)
  - useful conceptually, better than economics, or when human action "channelled" : traffic, epidemiology...
  - "Tragedy of the commons" modeled by *robots* (rational and selfish individuals, game theory, no creativity) : overexploitation of the common good. But **empirical** work (Ostrom) : cooperation, creative adaptation to social/ecological context, find arrangements to successfully manage the commons.



# Sociophysics useful ?

- **Political issues :**
  - Black box, unlegitimate expertise (Galam *Le Monde*, Schelling and « urban segregation, a fatality », *Pour la science* 2006)
  - models = social engineering, legacy of WWII (why physicists?)
  - "our knowledge of [social] mechanisms [...] is essential for **self-optimization** of the society as a whole." (Barabasi, *Nature*, 2007; *FuturICT* projet européen 1G€)
  - The "whole/macro" has to be decided in common
- Besoin de nouveaux outils formels pour tirer parti de l'avalanche de données sociales : **quelle nouvelle « (physique) statistique » ?**
  - Dangers de la centralisation des données sociales (Snowden)
  - Utilisation **réflexive** des analyses de données sociales?

