



Jean-Pierre Nadal

CNRS

Laboratoire de **Physique** **S**tatistique (LPS)

(laboratory associated with the CNRS, ENS, Paris 6 and Paris 7)

Ecole Normale Supérieure (ENS)



and

Centre d'**A**nalyse et **M**athématique **S**ociales (CAMS)

(laboratory associated with the CNRS and the EHESS)

Ecole des Hautes Etudes en Sciences Sociales (EHESS)



<http://www.lps.ens.fr/~nadal/>

nadal@lps.ens.fr



T. C. Schelling (70's) : « **the dying seminar** »

Market (and non market) model
with a single good and **positive externalities**

This lecture:

- The dying seminar
- Alternative formulation (~ Random Field Ising Model)
- **Equilibrium** properties and **collective states**
 - customers' **phase diagram**
 - **empirical data**
- **dynamics**

« The dying seminar » (T. C. Schelling) attending a conference/seminar/working group

Forum Des Sciences Cognitives

<http://cognivence.risc.cnrs.fr/>

cognivence@gmail.com

why coming?

❖ more or less interesting program...

❖ there might be a cost...

Registration fees: 1 578,72 € TTC

❖ quite importantly,
opportunity to meet and discuss with others

- some may be happy to come even almost alone
- most would be unhappy to come if they find themselves alone
- some may be happy to come only if all the others attend...

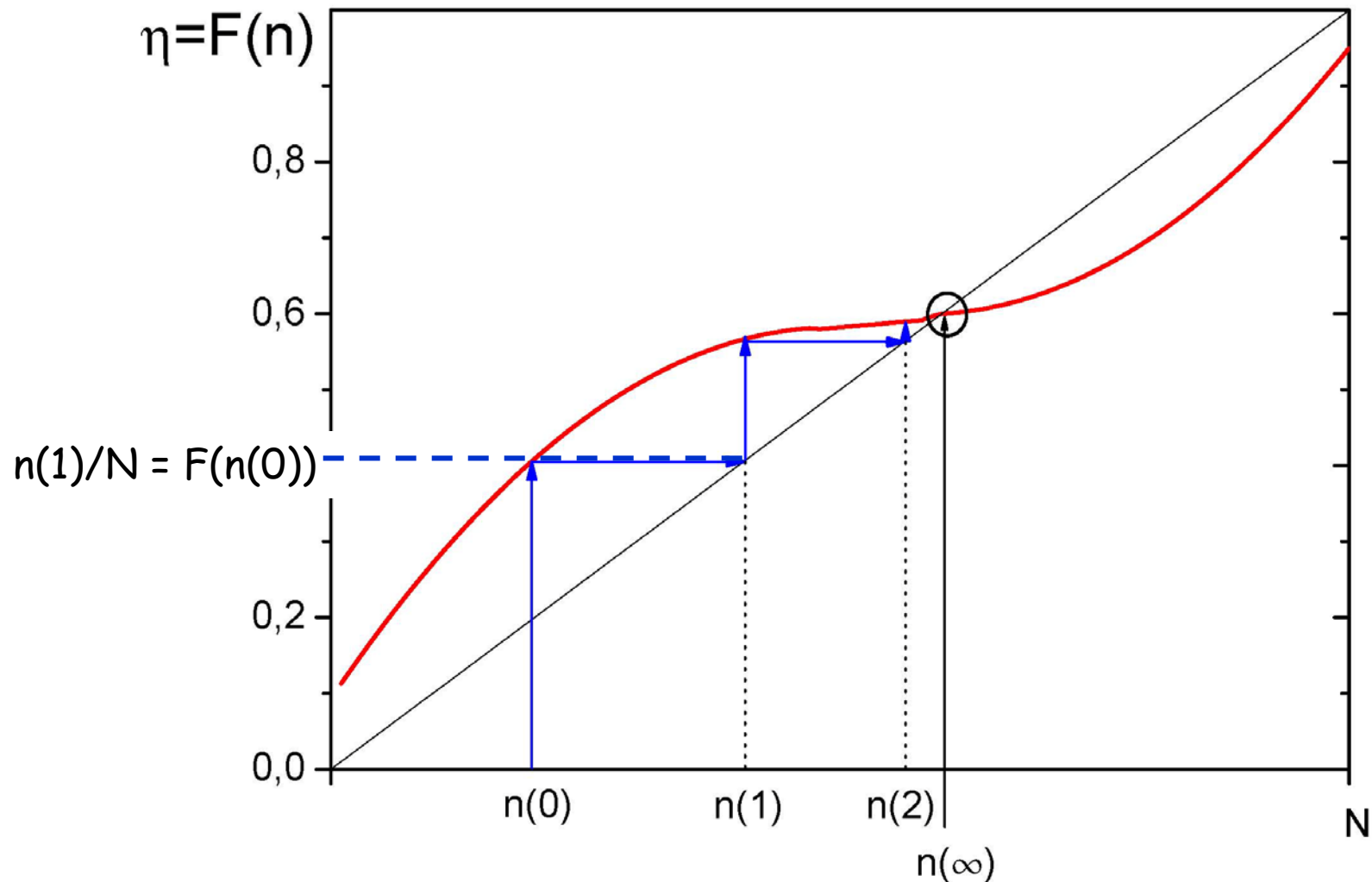
The dying seminar

- T. C. Schelling
« Micromotives and Macrobehavior », Norton & Cy, 1978)
- N scientists are asked to participate to a seminar/working group, meeting every Saturday
- every one has his own willingness to participate:
 scientist i is willing to participate
 if the number who attend is larger than n_i
- each week every one knows what was the attendance of the last Saturday

The dying seminar

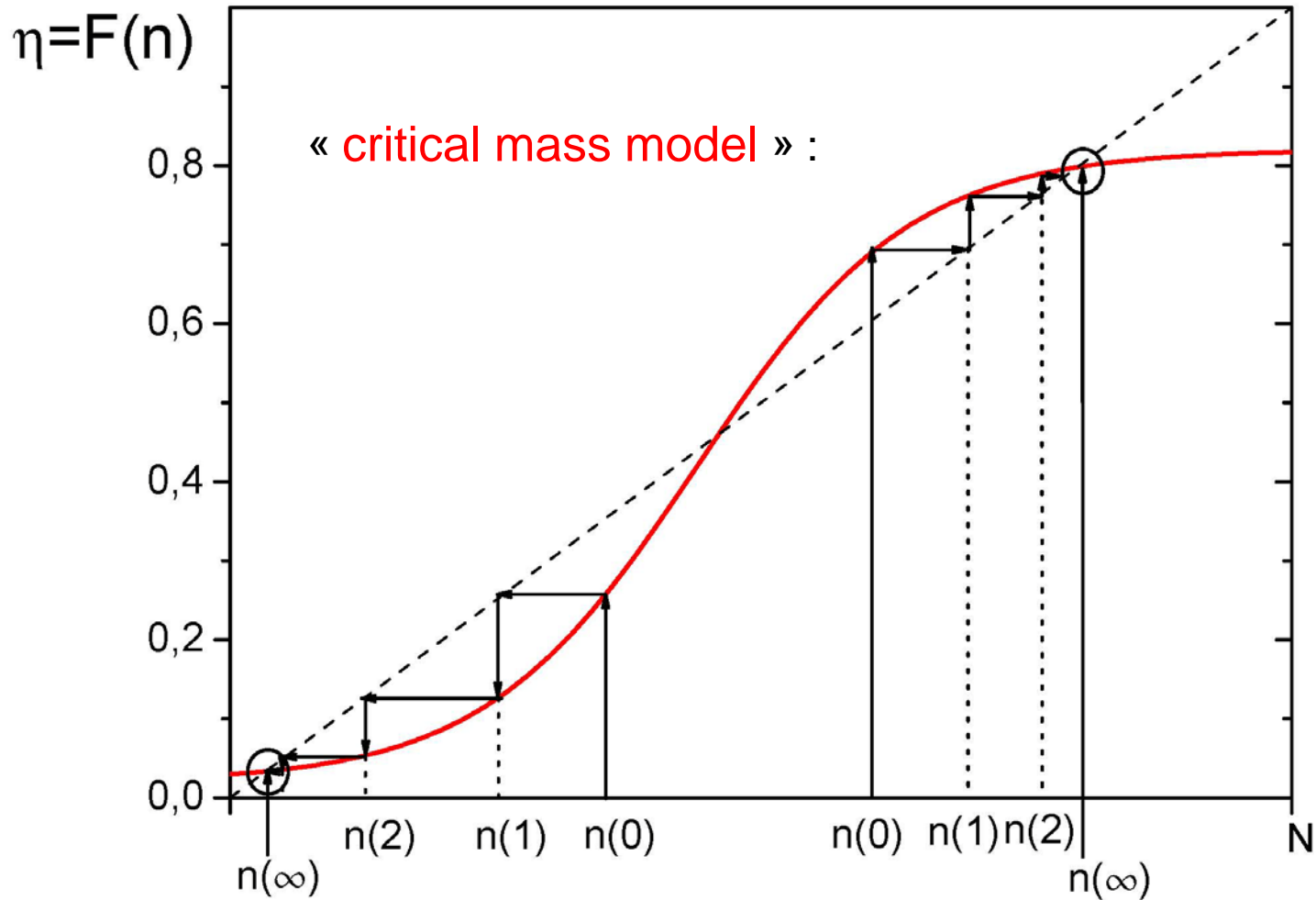
$F(n)$ = fraction of agents who would be glad to attend if the attendance is n

= fraction of agents with $n_i \leq n$



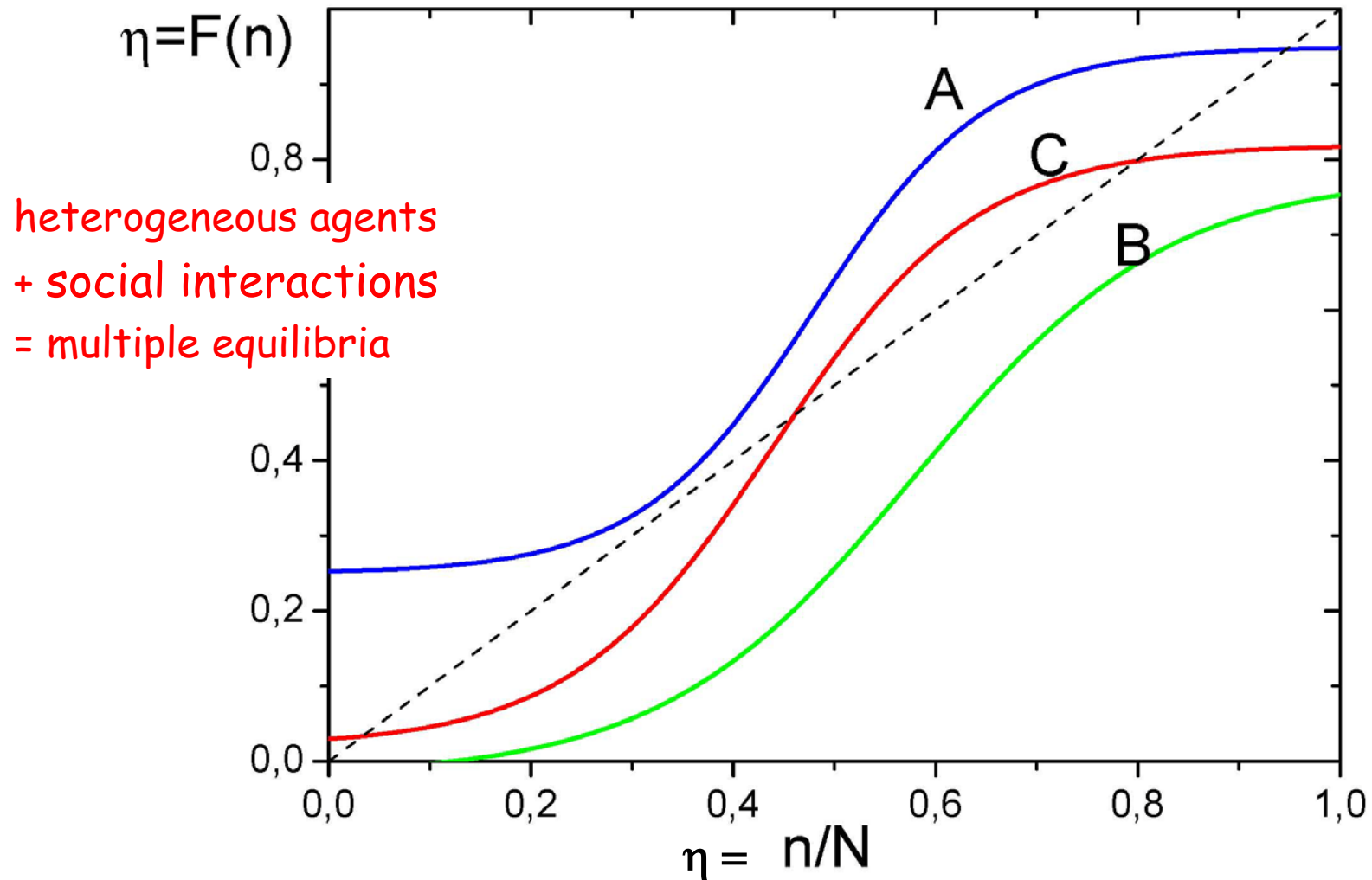
The dying seminar

$F(n)$ = fraction of agents with $n_i \leq n$



The dying seminar

$F(n)$ = fraction of agents with $n_i \leq n$



alternative formulation (~ Random Field Ising Model)
market context

N agents

each one has to make a binary decision:

to buy or not to buy

a single homogeneous good

at the posted price P

in the absence of social influence:

willingness to pay:

agent i has its reservation price H_i

agent i buys if: $P < H_i$

choice under social influence

« positive externalities »,

« bandwagon property »,

strategic complementarity

reservation price higher if others buy

agent i buys if: $P < H_i + J K_i / N$

$$J > 0$$

K_i = number of 'neighbours' of i who are buying
(social network)

= **Dying seminar**: i attends/buys if $K > n_i = N (P - H_i) / J$

= Random Field Ising Model (RFIM) at zero temperature:

$$S_i = \text{sign}(H_i - P + J K_i / N) \quad K_i = \sum_j (S_j + 1) / 2$$

reservation price higher if others buy

agent i buys if: $P < H_i + J K_i / N$

$$J > 0$$

K_i = number of 'neighbours' of i who are buying
(social network)

Global neighbourhood

Large N limit

$K_i / N \cong$ total fraction of buyers in the population $\equiv \eta$

Heterogeneity:

« quenched disorder »

$H_i =$ Idiosyncratic Willingness to Pay (IWP)

$H =$ population average $\sigma^2 =$ variance

$H_i = H + \sigma x_i$ x_i distributed according to some pdf $f(x)$
 $\langle x \rangle = 0$ $\langle x^2 \rangle_c = 1$

$J > 0$ weight of social influence

Surplus $_i = H_i + J \eta - P$

agent i wants to buy iff surplus $_i > 0$

2 parameters: j, δ

$j = J / \sigma$

$h = H / \sigma$

$p = P / \sigma$

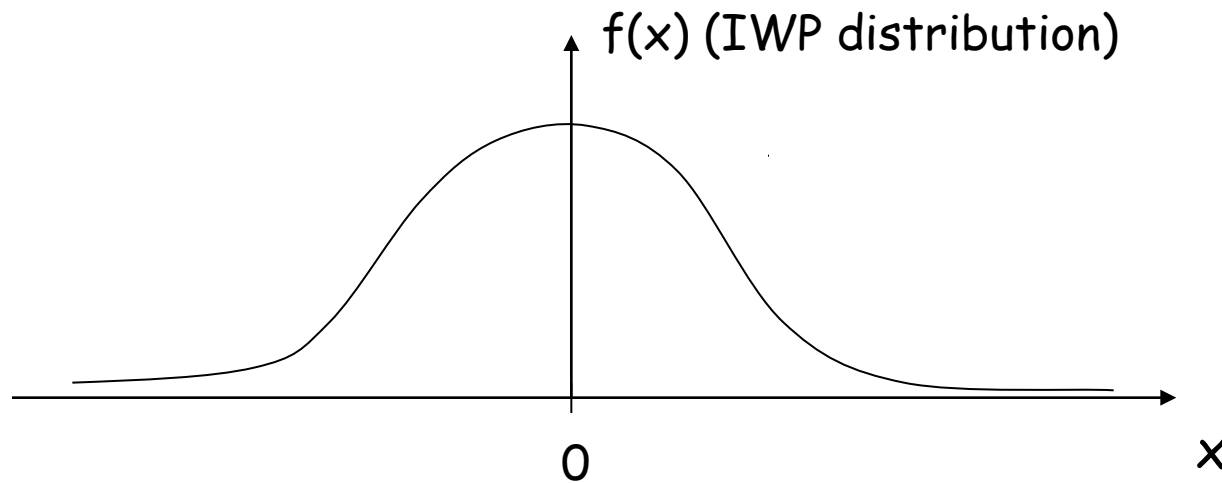
$\delta = h - p$

+ shape of f

Nash equilibria

- individual i 's choice : buy iff $x_i > p - h - j \eta$ [$x_i = (H_i - H) / \sigma$]
- equilibria?

↑
fraction of buyers

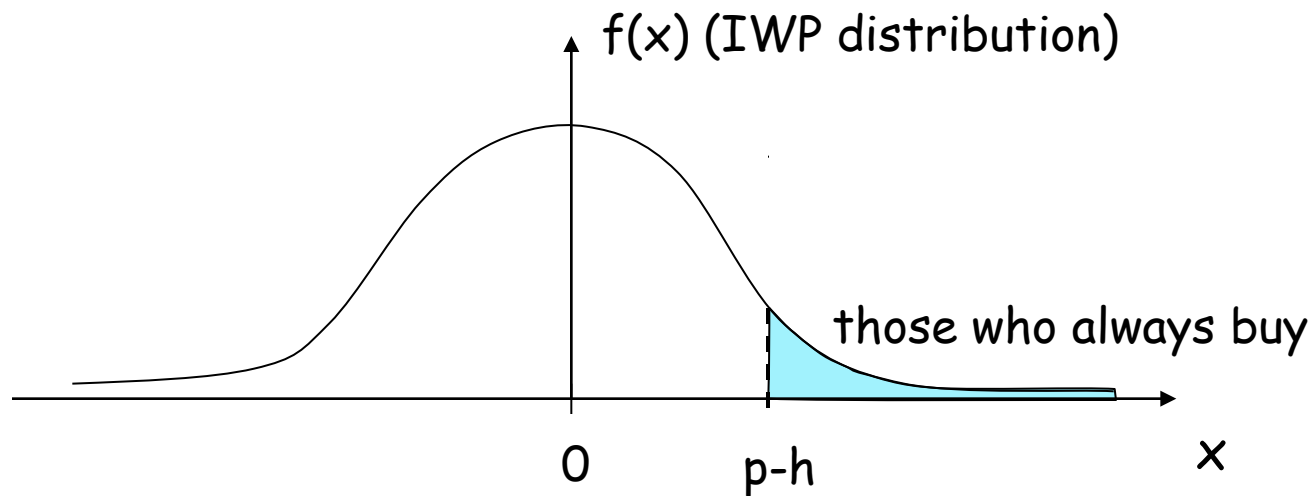


Nash equilibria

- individual i 's choice : buy iff $x_i > p - h - j \eta$ [$x_i = (H_i - H)/\sigma$]
- equilibria?

↑
fraction of buyers

even if $\eta = 0$, for $x_i > p - h$, i buys



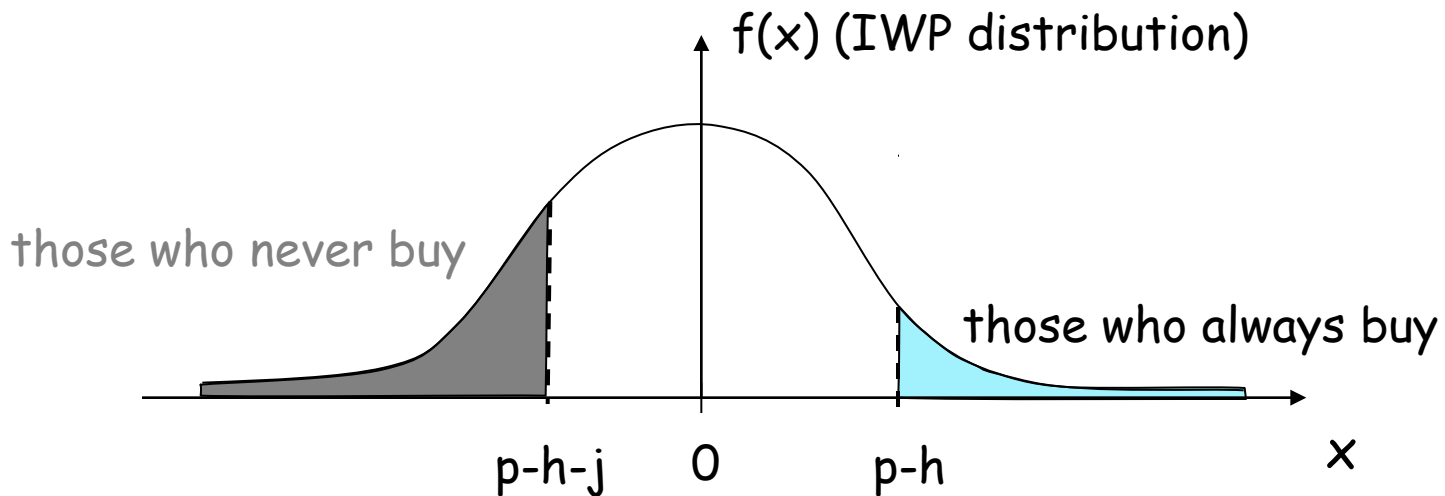
Nash equilibria

- individual i 's choice : buy iff $x_i > p - h - j \eta$ [$x_i = (H_i - H) / \sigma$]
- equilibria?

↑
fraction of buyers

even if $\eta = 1$, for $x_i < p - h - j$, i does not buy

even if $\eta = 0$, for $x_i > p - h$, i buys

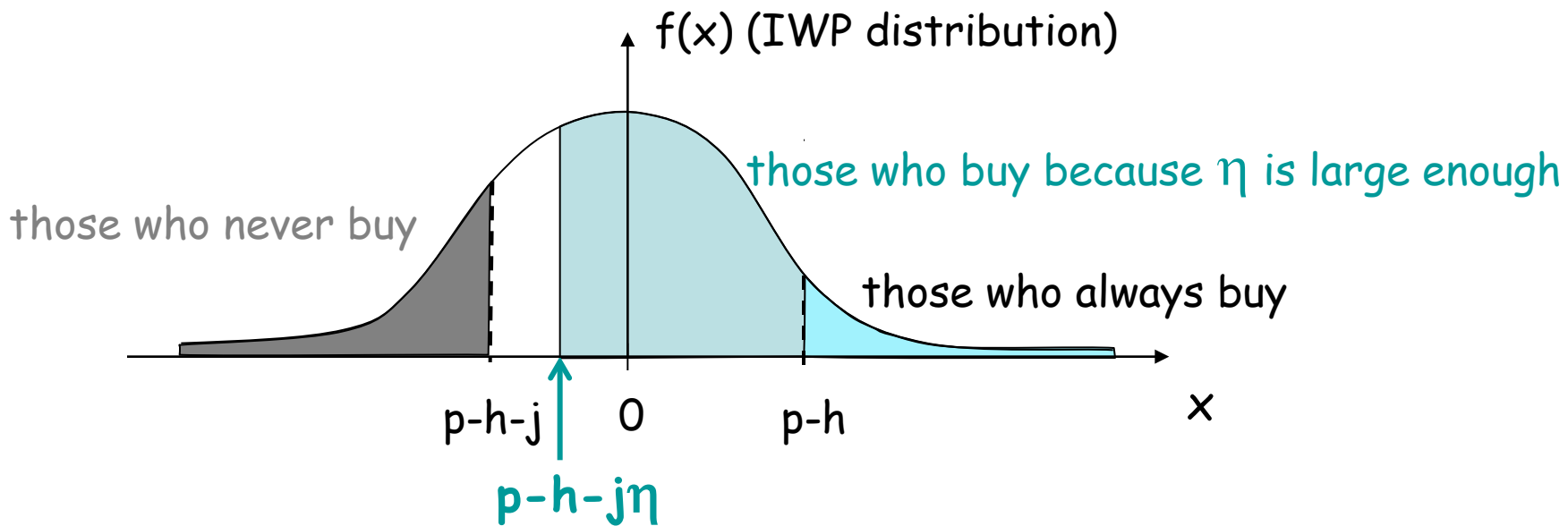


Nash equilibria

- individual i 's choice : buy iff $x_i > p - h - j \eta$ [$x_i = (H_i - H) / \sigma$]
- equilibria?

even if $\eta = 1$, for $x_i < p - h - j$, i does not buy

even if $\eta = 0$, for $x_i > p - h$, i buys

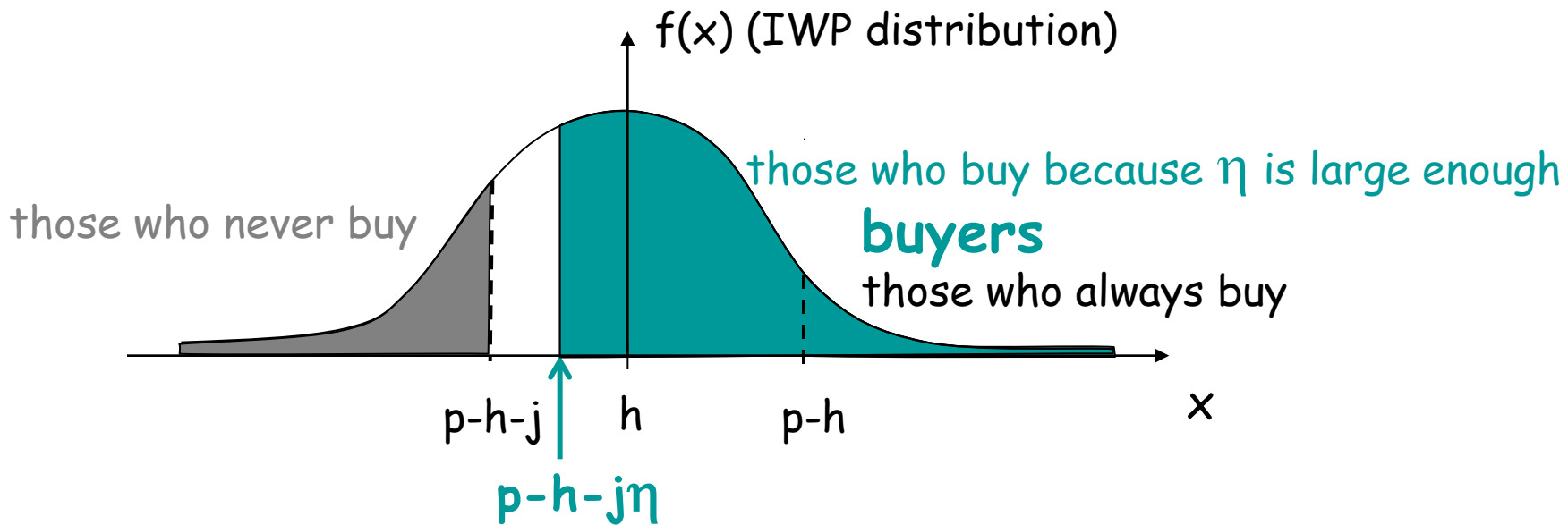


Nash equilibria

- individual i 's choice : buy iff $x_i > p - h - j \eta$ [$x_i = (H_i - H) / \sigma$]
- equilibria?

even if $\eta = 1$, for $x_i < p - h - j$, i does not buy

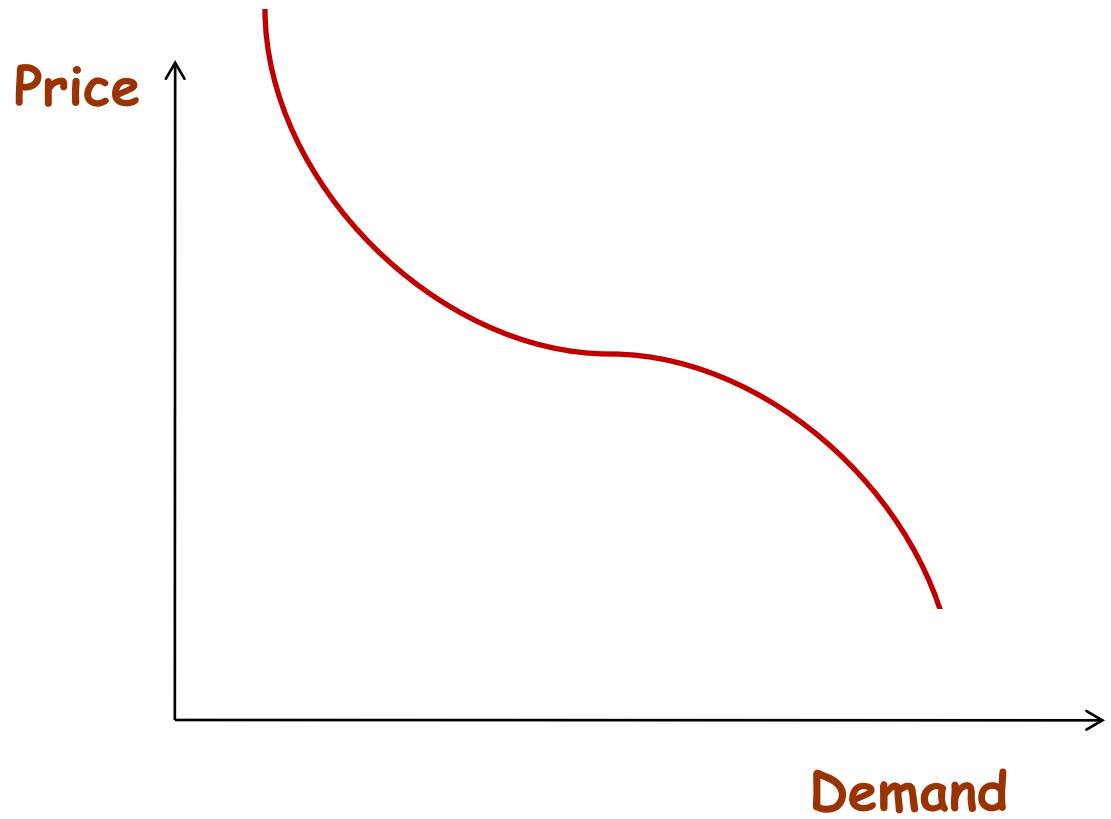
even if $\eta = 0$, for $x_i > p - h$, i buys



Nash equilibria : η solution of
$$\eta = \int_{p-h-j\eta}^{\infty} f(x) dx$$

Demand vs. price

(at given values of h and j)



at small values of j
or large values of h

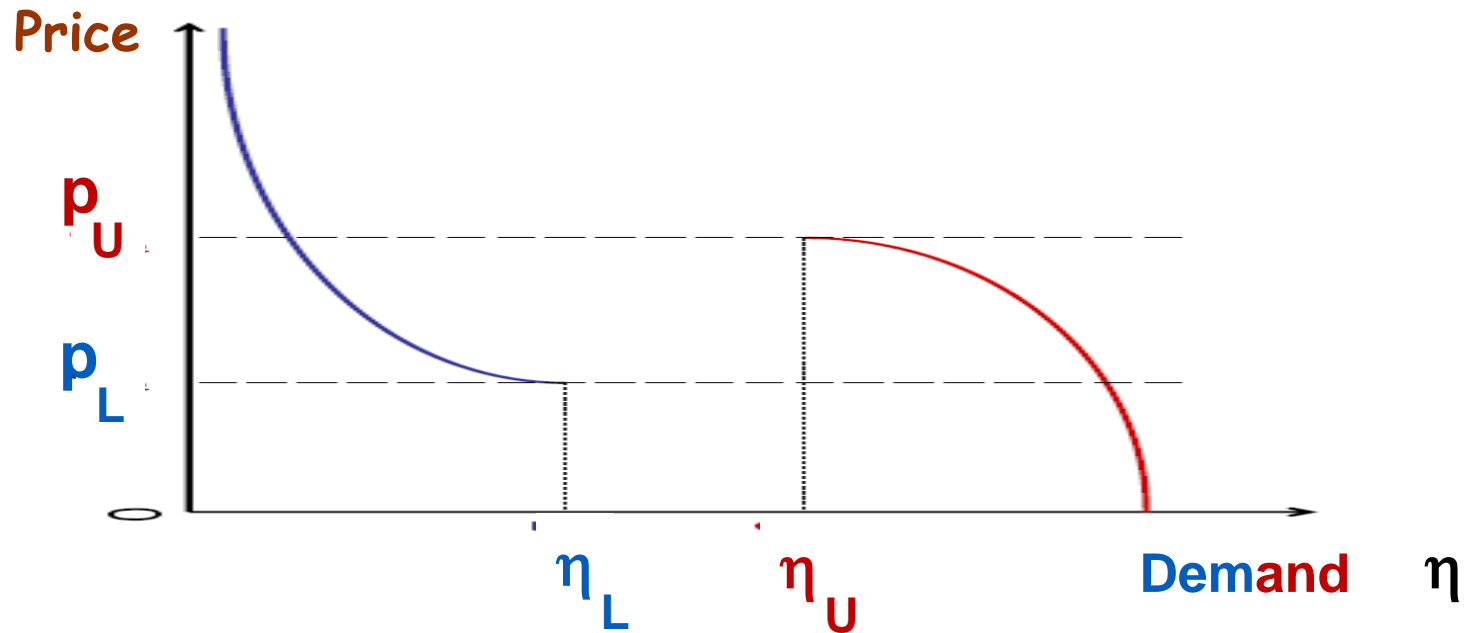
standard behaviour

Demand vs. price

(at given values of h and j)

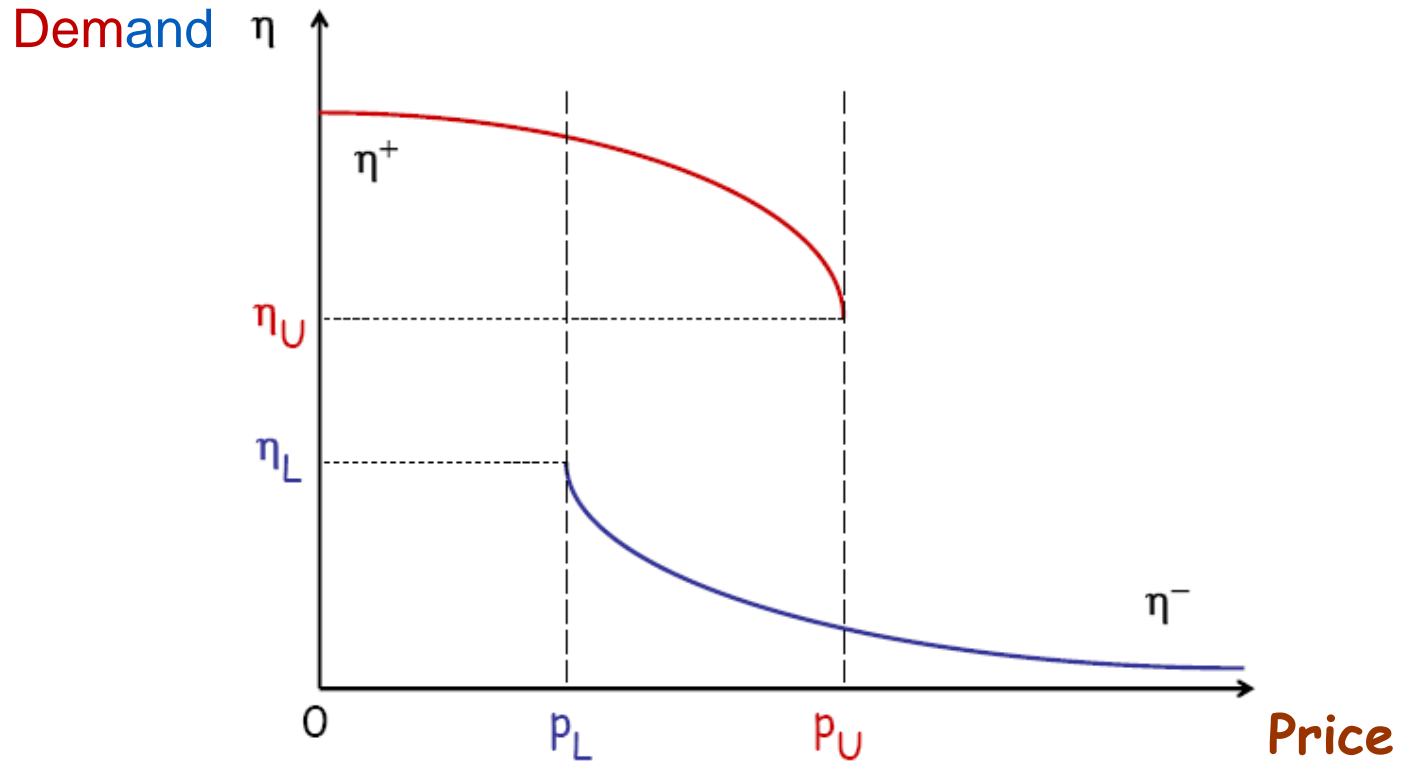
large enough values of j
and small values of h

multiple equilibria



Demand vs. price

(at given values of h and j)

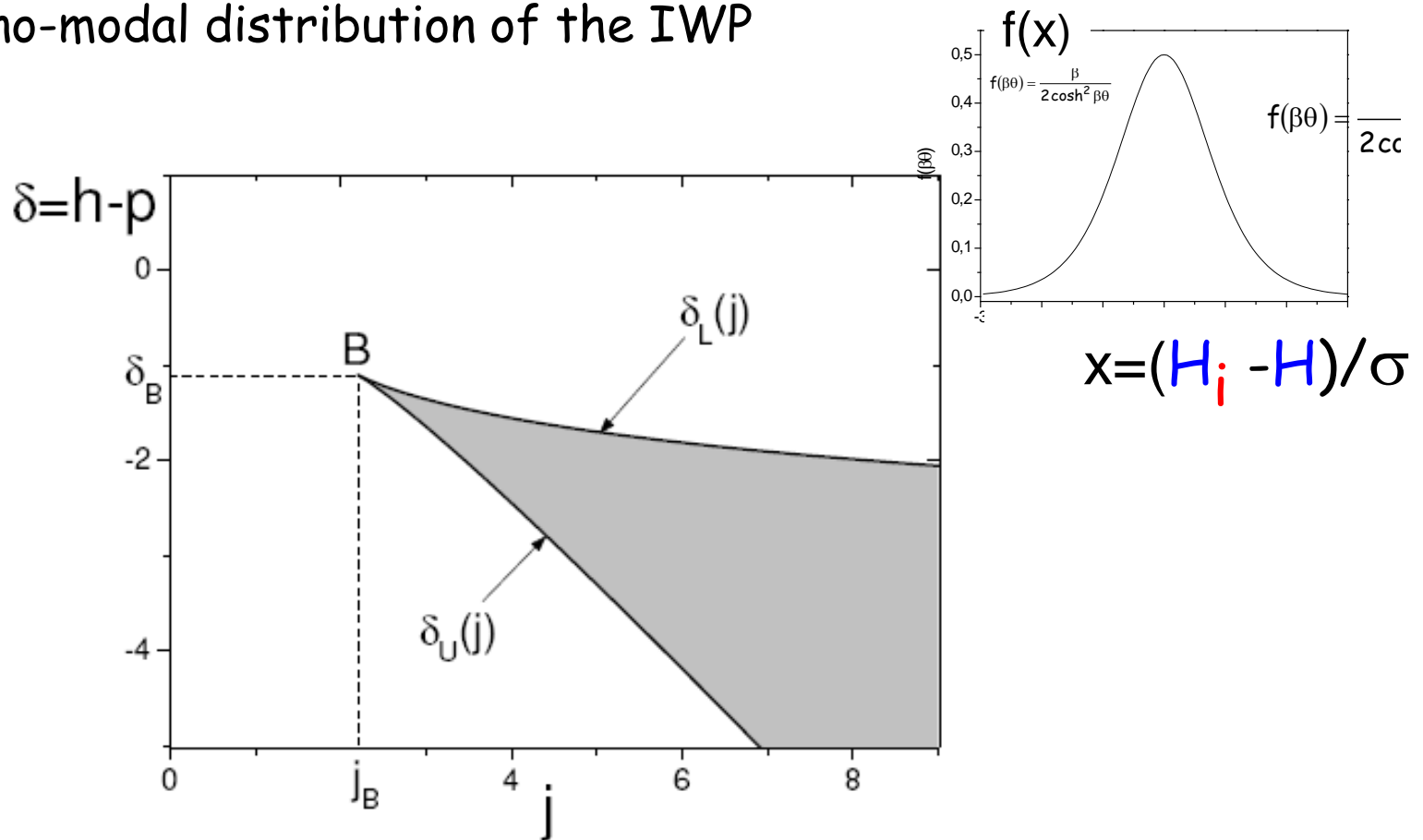


Nash equilibria
 η solution of:

$$\eta = \int_0^{\infty} \frac{f(x)}{p - h - j\eta} dx$$

customer's phase diagram

smooth mono-modal distribution of the IWP



generic phase diagram for any smooth monomodal distribution

(more complex generic diagram for multimodal distributions)

Bimodal distribution

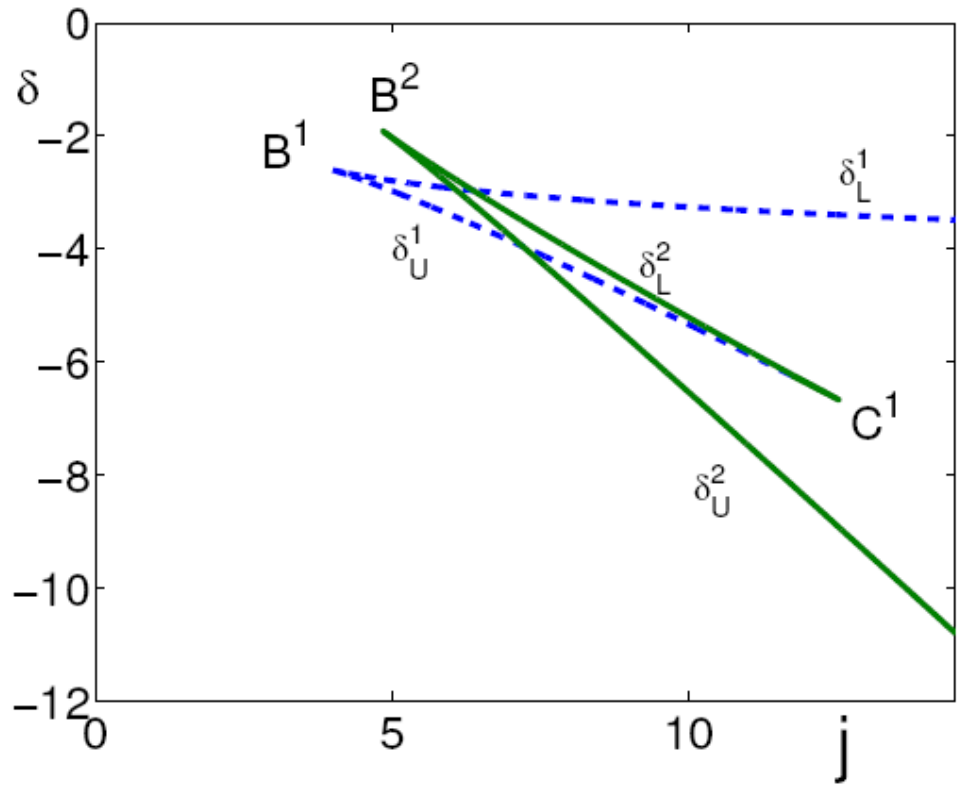
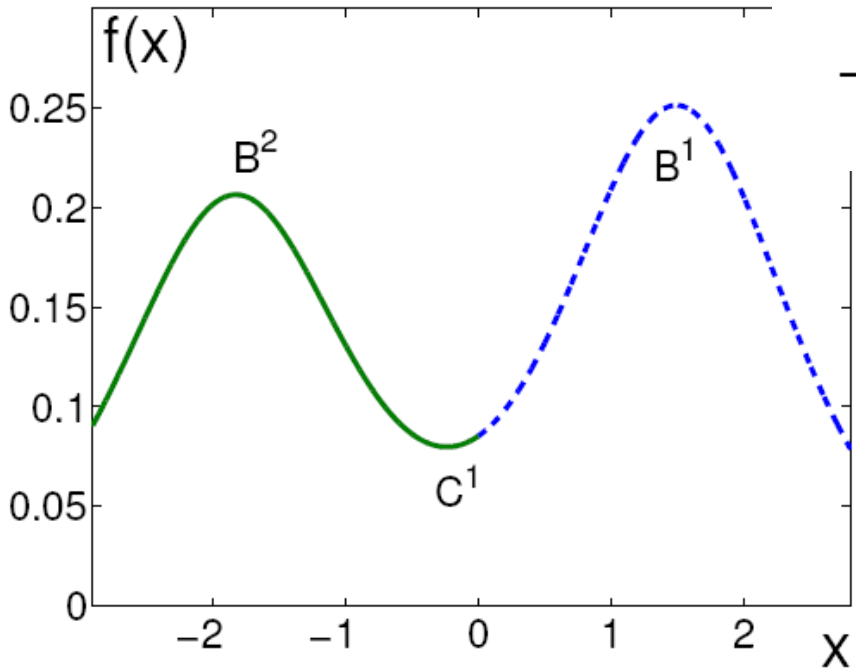
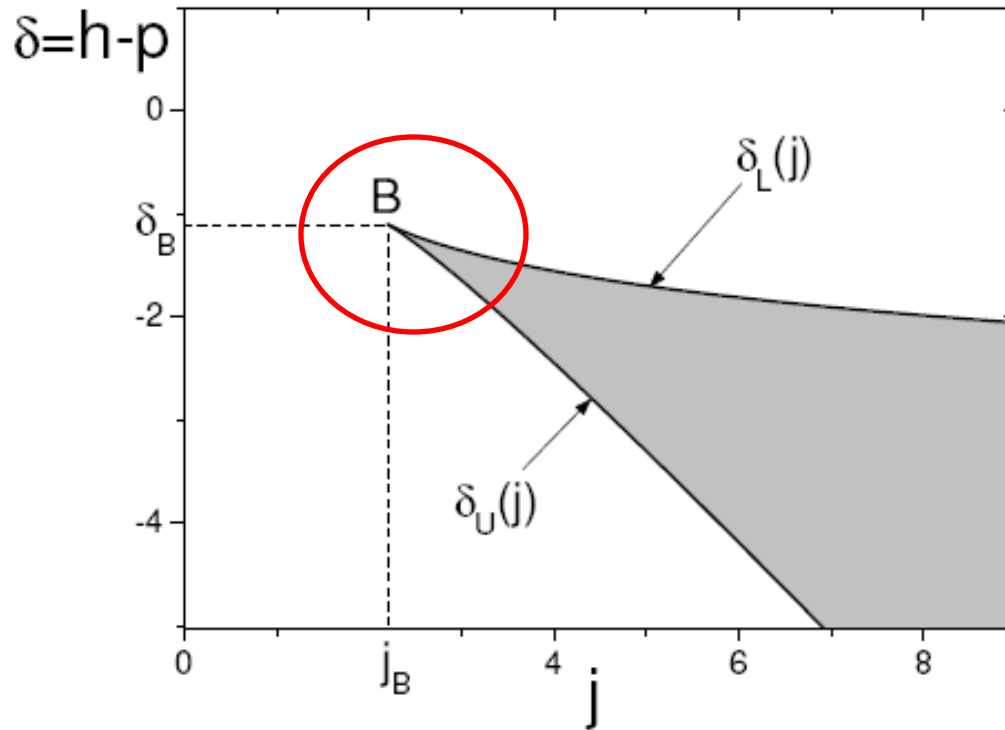


Figure 11: An example of bimodal pdf.

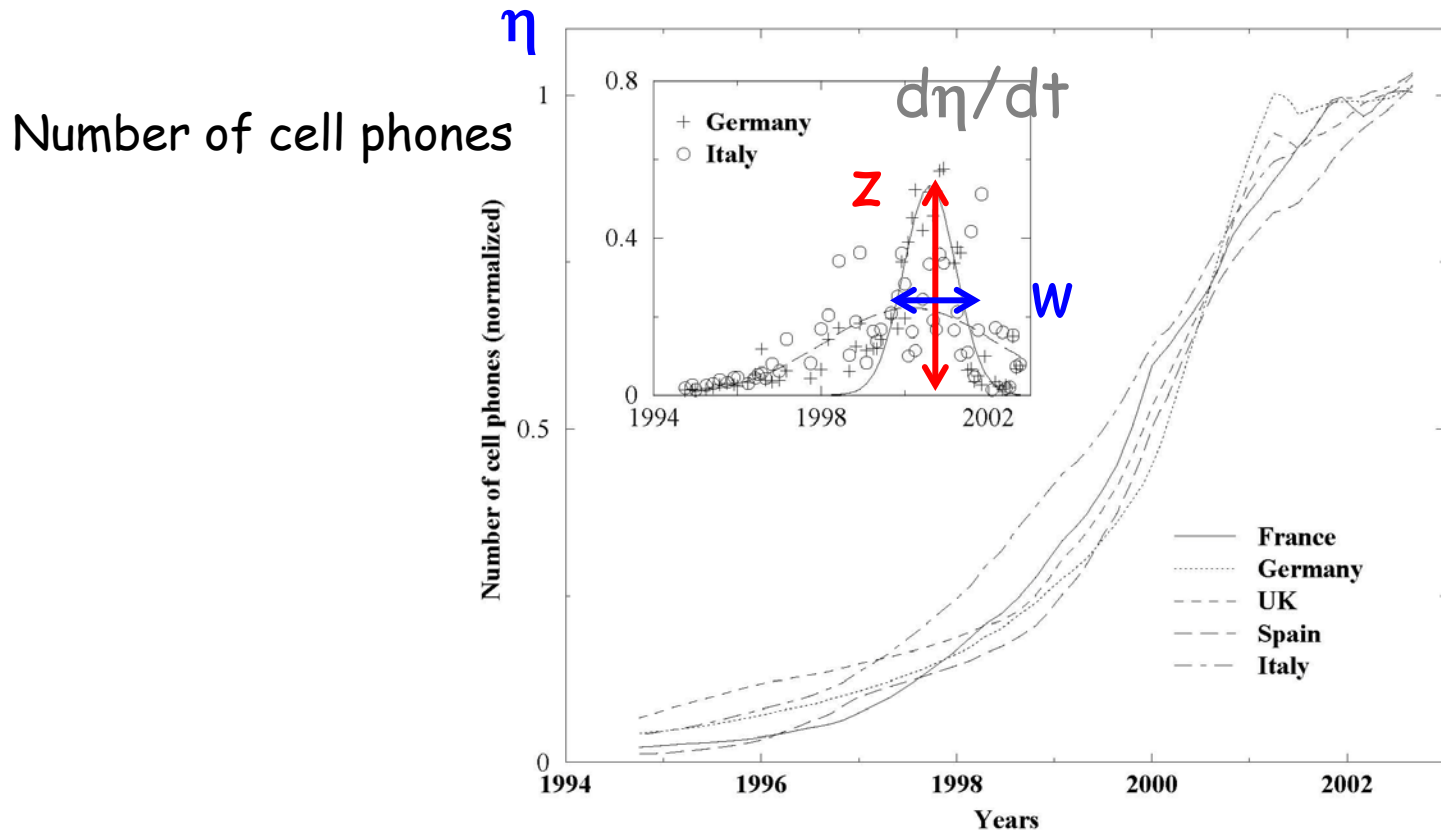
customer's phase diagram

smooth mono-modal distribution of the IWP



universal properties near the singular point B

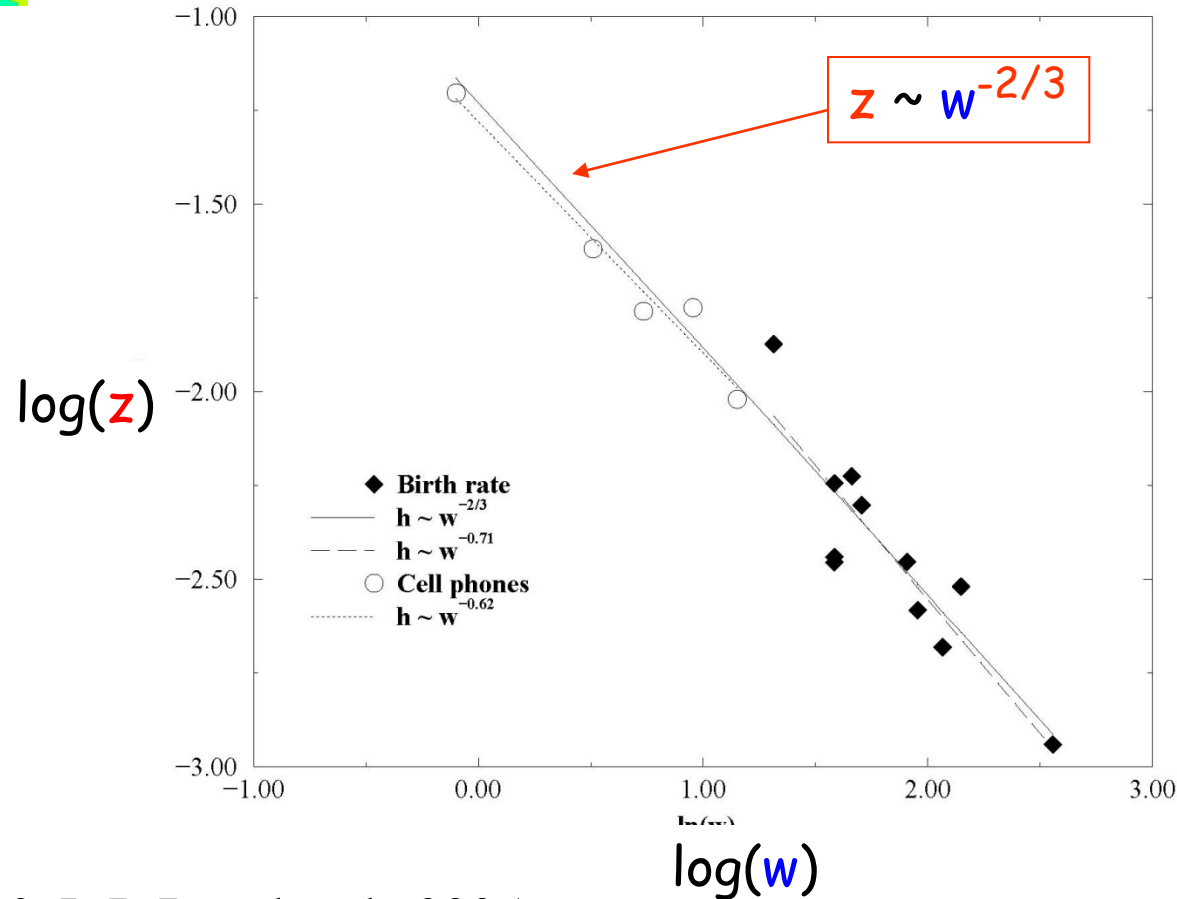
Analysis of Empirical Data



Q. Michard & J.-P. Bouchaud, 2005

« Theory of collective opinion shifts: from smooth trends to abrupt swings »

Empirical Data: scaling



Q. Michard & J.-P. Bouchaud, 2005

« Theory of collective opinion shifts: from smooth trends to abrupt swings »

See also:

“Of Songs and Men: a Model for Multiple Choice with Herding”

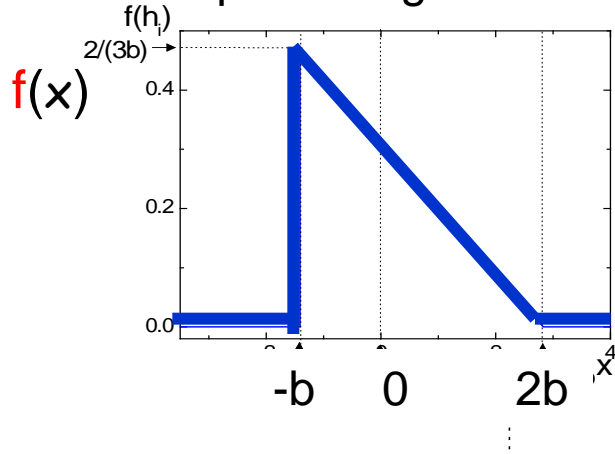
C. Borghesi & J-P Bouchaud (2006)

(case of more than 2 choices)

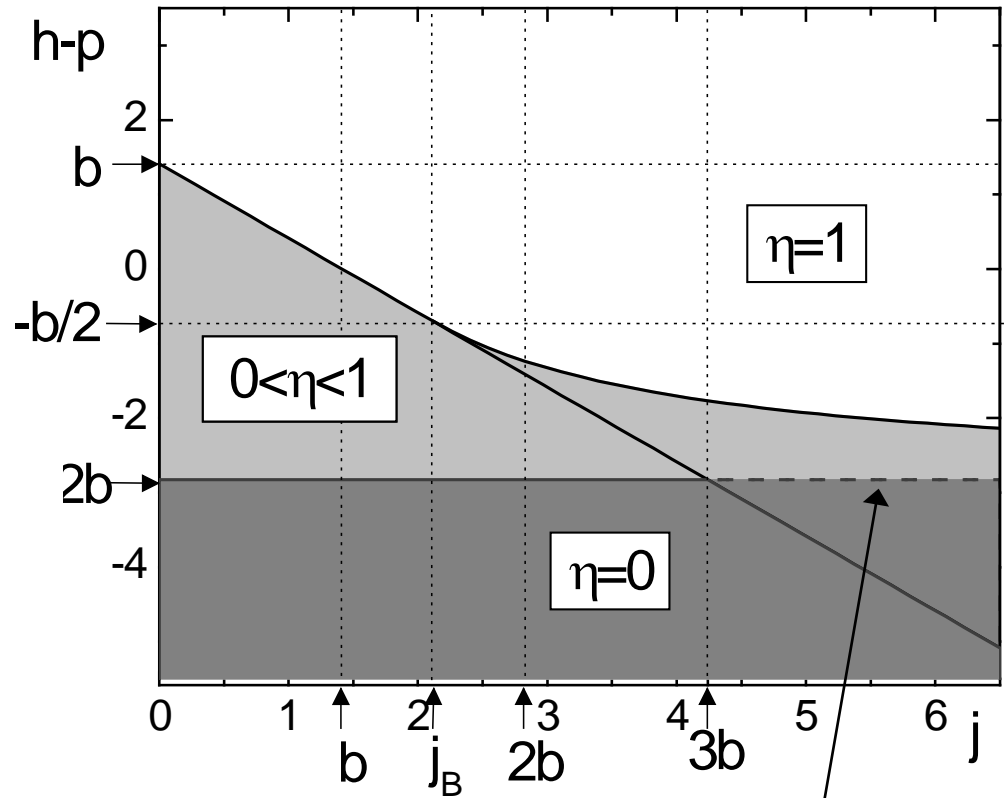
customers phase diagram

Exple: triangular distribution of the IWP:

$$h_i = h + x_i$$



phase diagram:

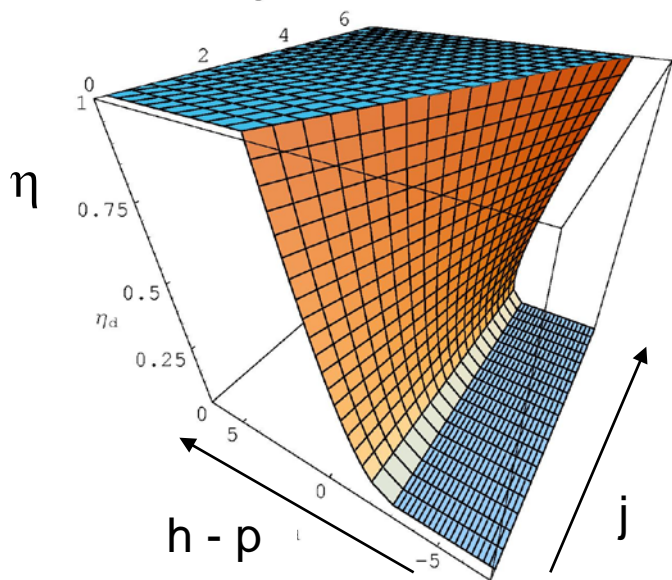


$$h = H/\sigma \quad p = P/\sigma$$

$$j = J/\sigma$$

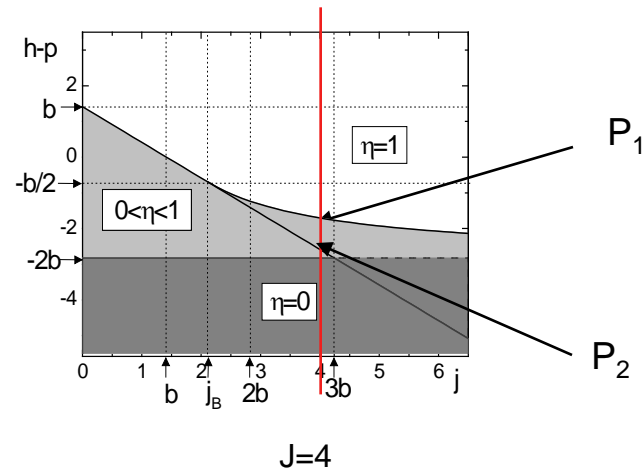
coexistence
of 2 solutions

fraction of buyers



Dynamics: simulations

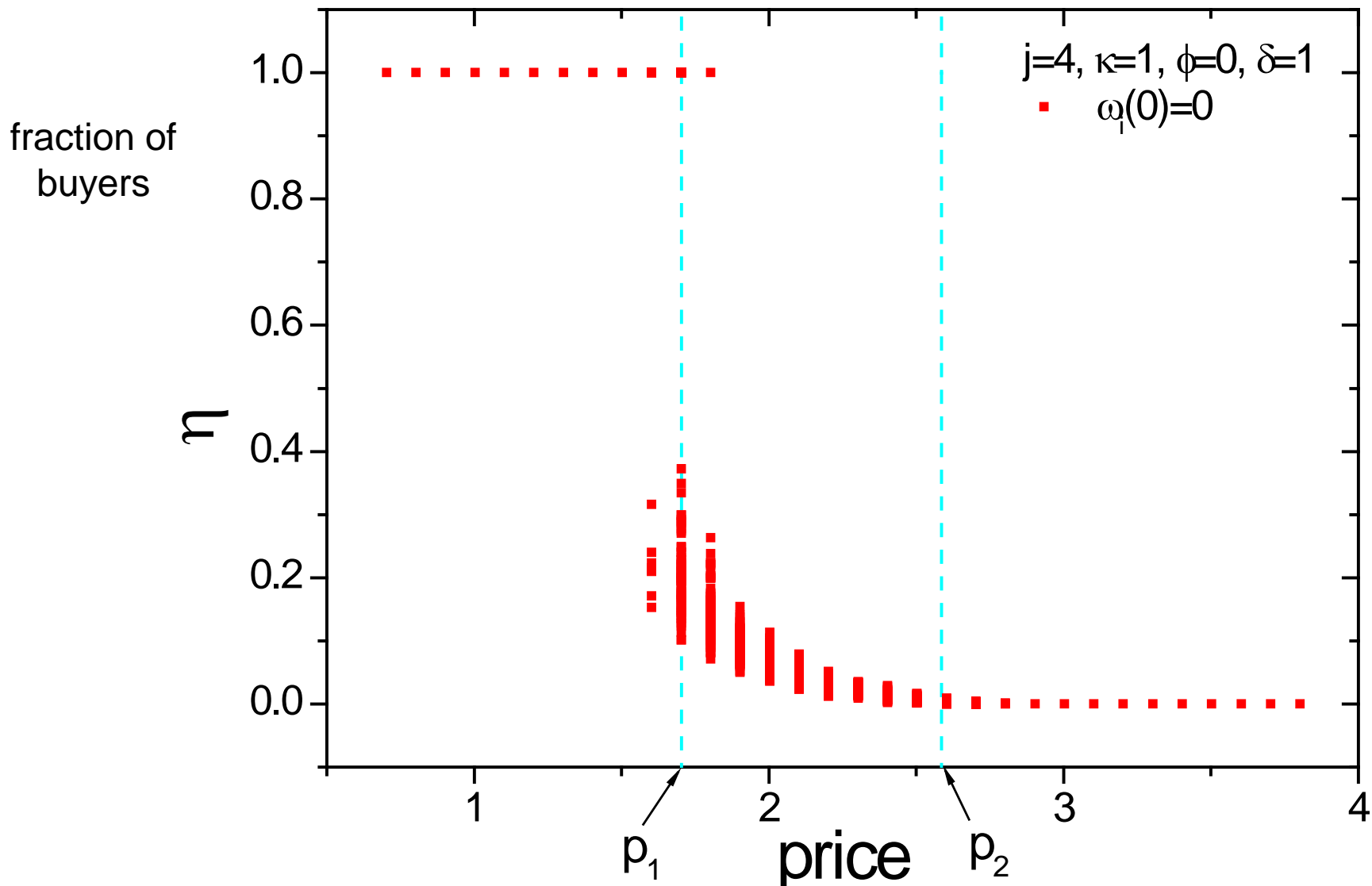
phase diagram
for the
triangular distribution :



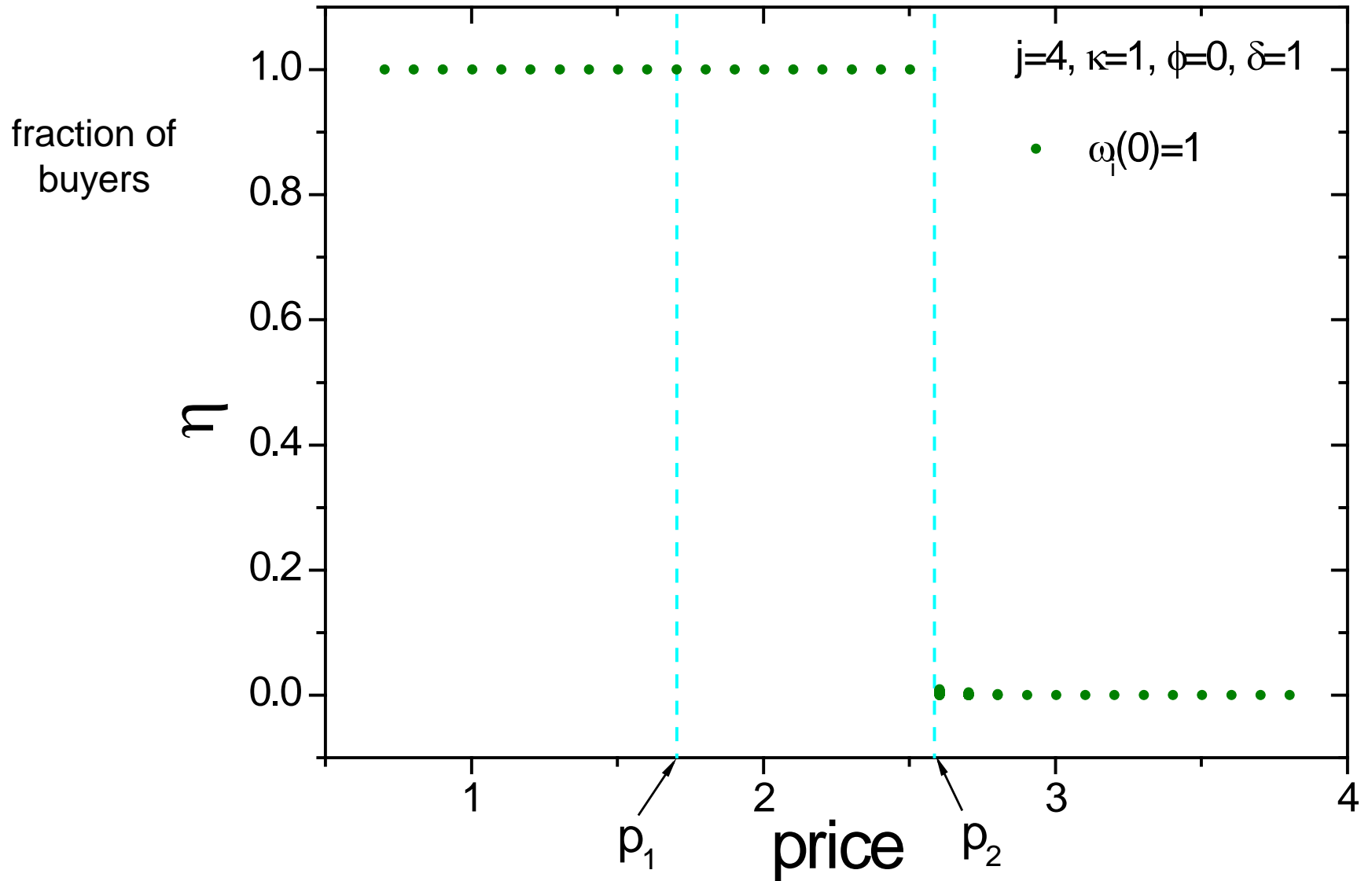
myopic fictitious play

$$\hat{\eta}_i(t+1) = \eta(t)$$

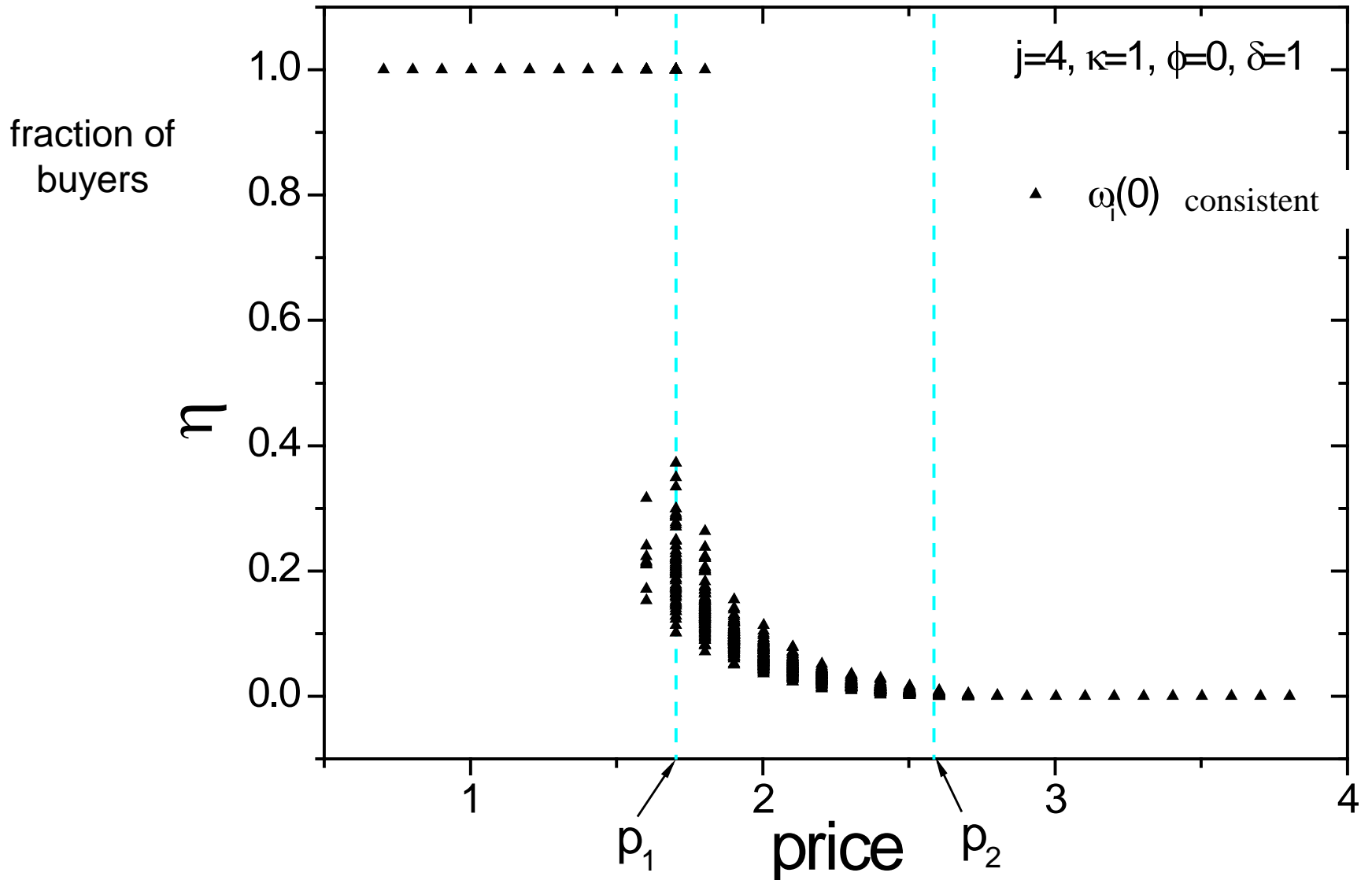
myopic best response



myopic best response



myopic best response



Biblio: Statistical physics approach

Use of the Ising framework in socio-economic modelling by physicists... and economists

- H. Föllmer, *Random Economies with Many Interacting Agents*, Journal of Mathematical Economics, 1974
- S. Galam, Y. Gefen, Y. Shapir, *Sociophysics: a mean behavior model for the process of strike*, J. Math. Sociol. 9 (1982) 1-13.
- A. Orléan, *Bayesian Interactions and Collective Dynamics of Opinion: Herd Behaviour and Mimetic Contagion*, Journal of Economic Behavior and Organization, 1995
- G. Weisbuch, A. Kirman and D. Herreiner, *Market organisation*, In « Simulating Social Phenomena », Springer-Verlag, 1997
- S. N. Durlauf, *Statistical Mechanics Approaches to Socioeconomic Behavior*, in The Economy as an Evolving Complex System II, B. Arthur, S. N. Durlauf and D. Lane Ed., Addison-Wesley, 1997
- Weisbuch G. & Stauffer D., *Adjustment and social choice*, Physica A, 2003
- JPN, D. Phan, M.B. Gordon, J. Vannimenus, *Multiple equilibria in a monopoly market with heterogeneous agents and externalities*, Quantitative Finance Vol.5, No. 6, 557-568 (2006)
- M. B. Gordon, JPN, D. Phan and V. Semeshenko, *Discrete Choices under Social Influence: Generic Properties*, Mathematical Models and Methods in Applied Sciences (M3AS), 2009

