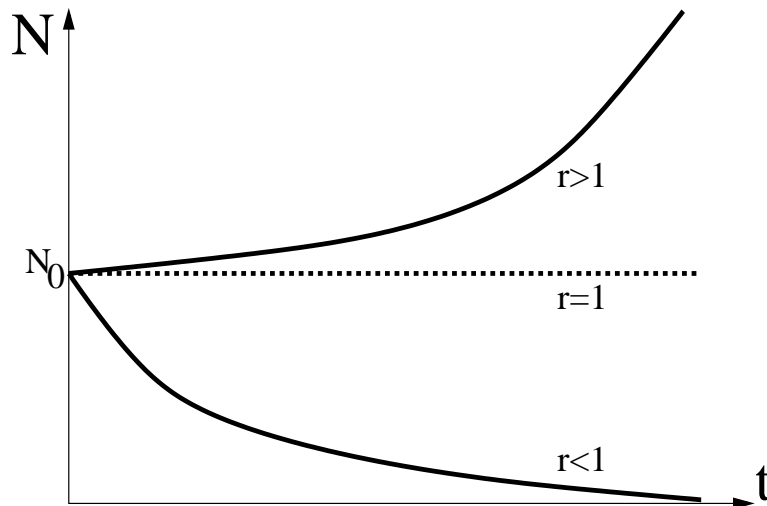


## Macroscopic Growth Dynamics

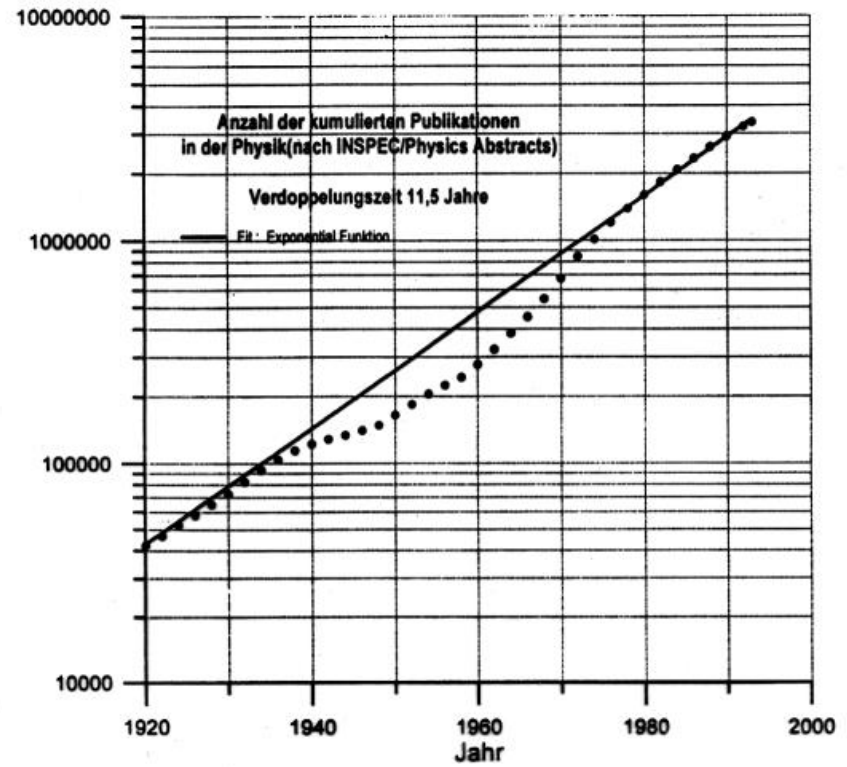
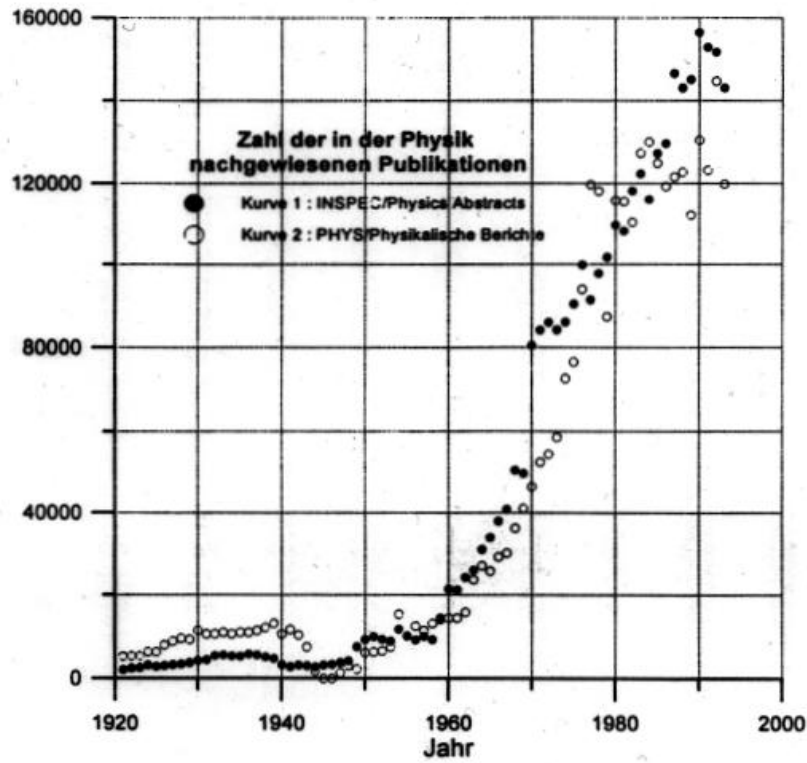
- ▶ quantity  $N(t)$  (GNP, income, firm size ...)

$$\frac{dN}{dt} = f(N, u, t)$$

- ▶ most simple case:  $f(N) = b N$ 
  - iterative:  $N_{t+1} = (b + 1)N_t; \Delta t = 1,$   
integration:  $N(t) = N_0 r^t; (r = b + 1)$



Exponential growth indeed occurs:



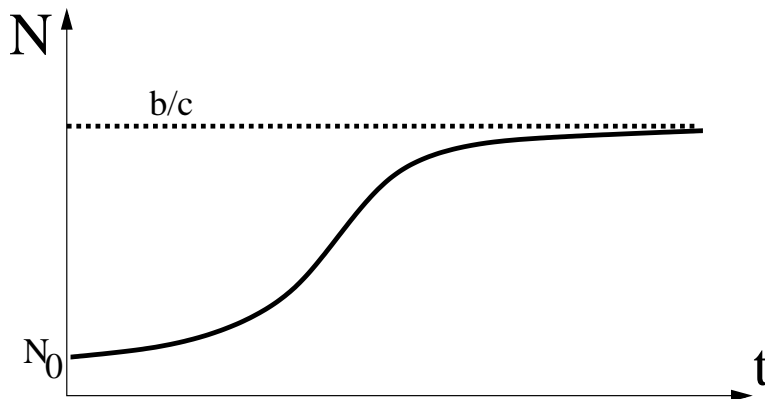
## Limits to Growth

- ▶ Pierre Francois Verhulst (\* 1804 in Brussels): 1845  
1973: Report for the Club of Rome's Project on the Predicament of Mankind by Donella H. Meadows (Meadows & Meadows '04)
- ▶ system can sustain only a maximum  $N_{max}$   
reasons: depletion of resources, competition, ...

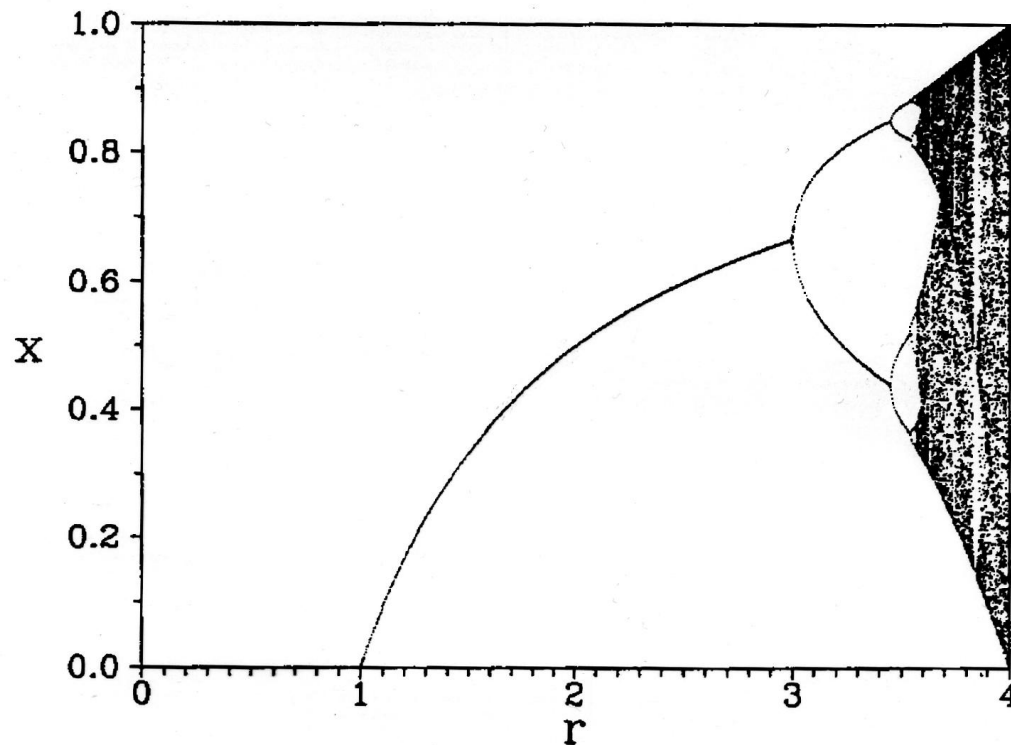
$$f(N) = bN - cN^2 = cN(b' - N) ; \quad b' = b/c = N_{max}$$

$$N(t) \Rightarrow t = \frac{1}{b'} \ln \frac{N}{b' - N}$$

$\Rightarrow$  logistic growth, saturation effects  $\Rightarrow$  cause innovation



- ▶ iterative dynamics:  $N_{t+1} = (b + 1)N_t - cN_t^2$   
with  $\lambda = b + 1$ ,  $N_t = (\lambda/c) x_t \Rightarrow x_{t+1} = \lambda x_t(1 - x_t)$
- ▶ logistic map: initial value  $x_0 \in (0, 1, )$ , control parameter  $\lambda$



- ▶ predictability  $x(t \rightarrow \infty) ?? \Rightarrow$  complex dynamics, deterministic chaos

## Evolon Model of Cooperative Growth

- ▶ so far:  $\dot{N} = cN(b' - N)$
- ▶ more elaborated: cooperativity exponents

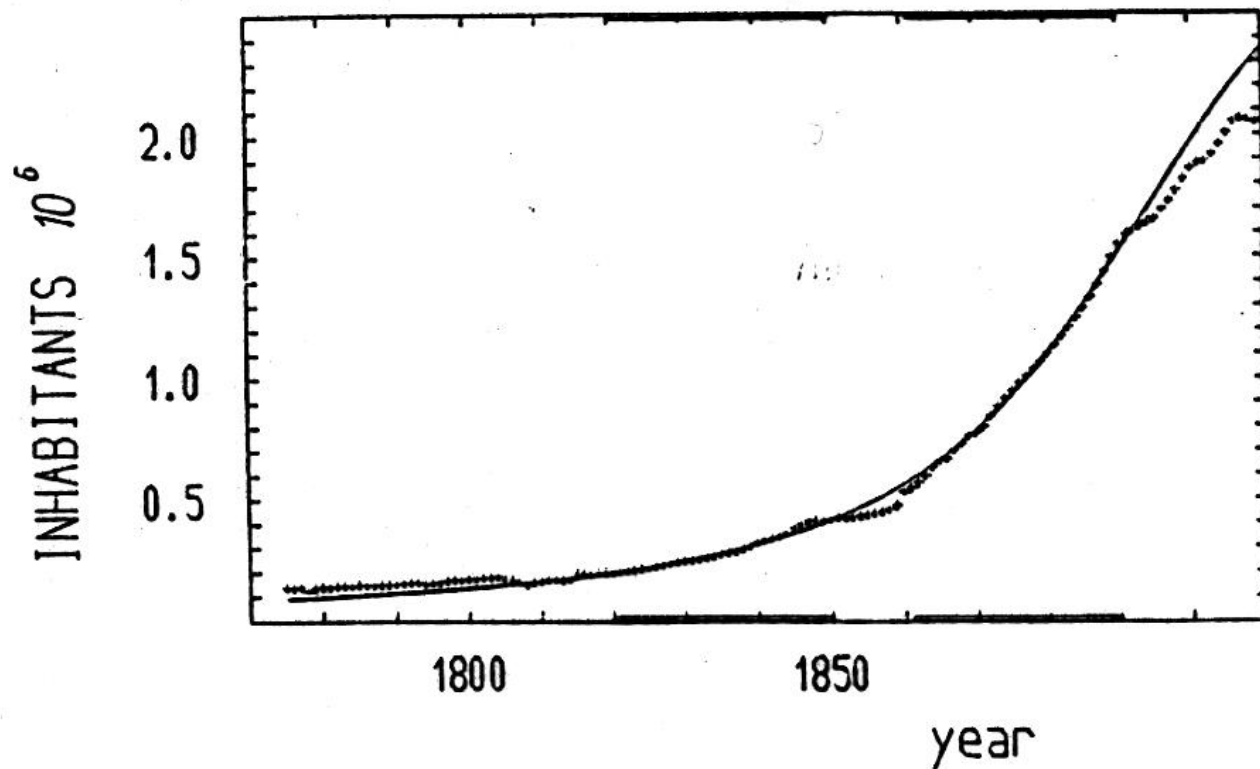
$$\frac{dN}{dt} = c N^k (b' - N)^l$$

*phenomenological* approach, holds for (relatively) autonomous growth processes (no “perturbations”) (Albrecht & Mende '91)

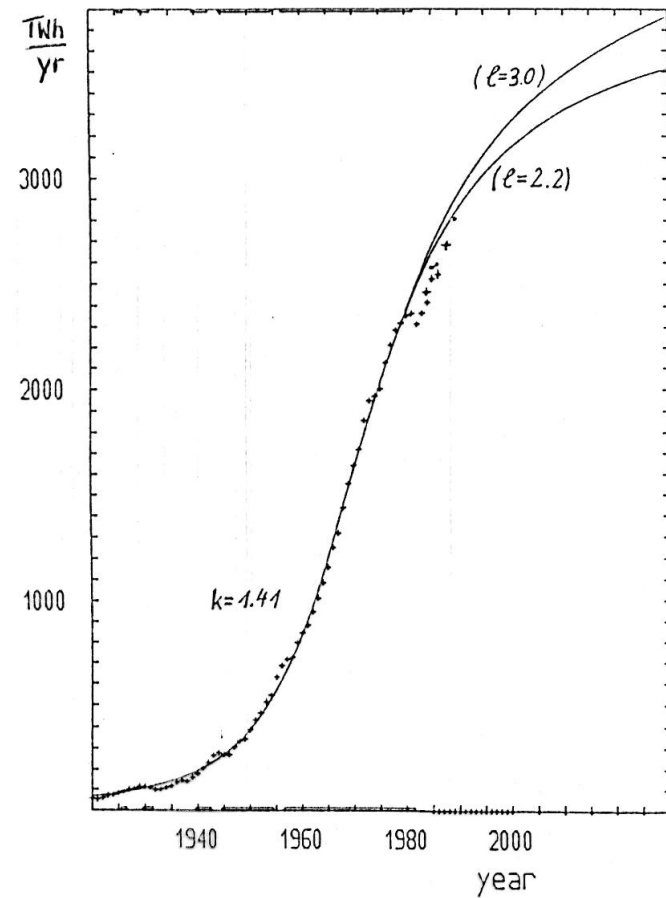
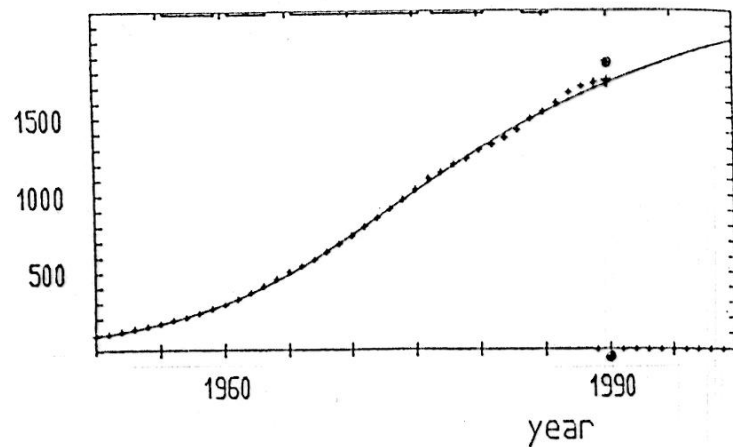
- ▶  $k$ : (“extensive”) growth,  $l$ : (“intensive”) saturation
  - $k = l = 1$ : logistic growth
  - $k, l < 1$ : parabolic growth with saturation  
try to reach a given target by known methods  
applied repeatedly (substitution processes, ...)
  - $k, l > 1$ : hyperbolic growth with saturation  
no predetermined targets, evolutionary processes  
innovations

## Examples (Albrecht & Mende '91)

- ▶ growth of population of Berlin: 1860-1910  
 $k = 1.6$ ,  $l > k$  (after 1890: coalescence)



- ▶ electric power production  
former Soviet Union after 1956:  $k = 1.03$ ,  $l = 2.2$   
USA after 1925:  $k = 1.41$ ,  $l > 1.8$



## Further Examples:

- ▶ parabolic processes: targeted electricity production ( $k \approx 0.65-0.68$ )  
USSR, FRG, GDR for 1946-1955 (reconstruction)  
Germany 1900-1920 (substitution)  
USA 1902-1929 (substitution)
- ▶ hyperbolic processes:  
population of 10 largest German cities for 1871-1970 ( $k = 1.6, l > 1.6$ )  
precision of time measurement 1200-1970 ( $k = 1.12$ )

### $l > k$ rule:

- ▶ cooperativity increases during saturation period  
⇒ additional cooperativity of subsystems while adapting to growth limiting factors



## “Derivation” of $cN^k(b' - N)^l$ ??

- ▶ coupling of successive exponential growth processes (“exponential tower”) (Mende ...)

$$\begin{aligned} \text{subprocess } n & : \quad \dot{N}_n = [c_n N_{n-1}] N_n \\ \text{subprocess } n-1 & : \quad \dot{N}_{n-1} = [c_{n-1} N_{n-2}] N_{n-1} \\ \dots & \quad \dots \\ \text{subprocess } 1 & : \quad \dot{N}_1 = [c_1 N_0] N_1 \end{aligned}$$

- ▶  $N_0 = \text{const.}$ ,  $c = c_{n-1} = c_{n-2} = \dots = c_1$

$$\frac{dN}{dt} = \frac{dN_n}{dt} = cN^k ; \quad k = 1 + \frac{c}{c_n}$$

- ▶ *saturation*: substitution  $N^* = b' - N$
- ▶ multiplicative coupling of growth and saturation
- ▶  $k < 1$ :  $c_n > 0$ ,  $c < 0 \Rightarrow$  one driving process, but inhibiting subprocesses  $\Rightarrow$  parabolic growth
- ▶  $k > 1$ :  $c_n > 0$ ,  $c > 0 \Rightarrow$  cooperation of subprocesses to support growth

## Generalization of Growth Dynamics

- ▶  $N \Rightarrow N_i$  ( $i = 1, \dots, z$ ) – e.g. size (income) of company  $i$

$$\frac{dN_i}{dt} = f_i(N_1, N_2, \dots, N_z, u, t) + \text{stochastic forces}$$

- ▶ expansion

$$\frac{dN_i}{dt} = \epsilon_i N_i + \sum_j^z \gamma_{ij} N_i N_j + \sum_k^z \sum_j^z \mu_{ijk} N_i N_j N_k + \dots$$

- ▶ Lotka-Volterra equation

$$\dot{N}_i = N_i \left[ a_i - \sum_j b_{ij} N_j \right]$$

$b_{ii}$  : inter“species” competition,  $b_{ij}$ : intra“species” competition  
 positive, negative feedbacks  
 exsistence of unstable (“buisness”) cycles, ....

## Formation of Hierarchies

- ▶ complex system (“company”): various organizational hierarchies  
global aim: increase of “productivity” (utility, fitness, ...)

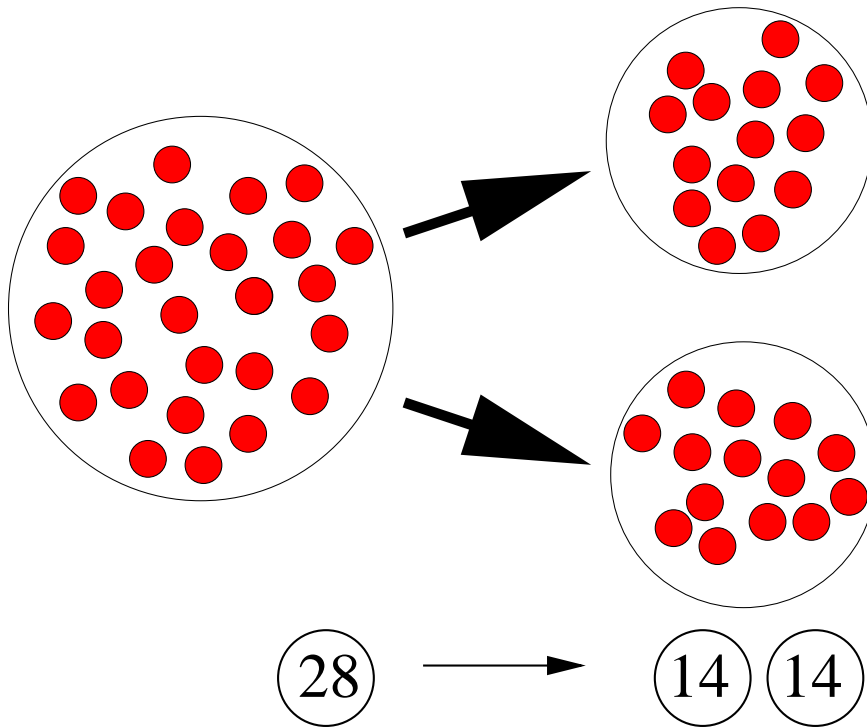
simple, but illustrative model of Drossel '99:

- ▶ productivity of 1 unit at (lowest) level 1:  $P_1(1)$  (negligible)  
productivity of  $N$  interacting units at (lowest) level 1:  $P_1(N)$ 
  - *increases* with interaction possibilities:  $P \sim N(N - 1)$
  - *decreases* with costs of interaction (e.g. transportation costs)  
if system size increases linearly with  $N$ , then  $P \sim -N(N - 1) N$

$$P_1(N) = \left[ g_1 N - c_1 N^2 \right] (N - 1)$$

- maximum size:  $P_1(N) \rightarrow 0$ :  $N_{\max} = g_1 / c_1$

- ▶ maximum productivity per unit:  $P_1(N)/N \rightarrow \max$   
 $\Rightarrow$  optimal size  $N_{\text{opt}} = (g_1 + c_1)/2c_1$
- ▶ reasons to split into  $N = N' + N''$  if  $P_1(N) < P_1(N') + P_1(N'')$   
 most profitable split for total productivity:  $N' \approx N''$   
 $\Rightarrow$  critical (“split”) size:  $N_{\text{crit}} = 2(g_1 + c_1)/3c_1 = 4/3 N_{\text{opt}}$



➤ iterative process:

- N units → groups with  $I_1$  units
- supergroups with  $I_2$  groups
- groups of supergroups with  $I_3$  supergroups ...

➤ productivity at level  $k$  *increases* with

- number *and* productivity of groups at level  $k - 1$ :  $P_k \sim I_{k-1} P_{k-1}$
- interaction possibilities between “supergroups” at level  $k$ :  $P_k \sim I_k^2$

➤ costs at level  $k$  *increase* with system extension and number of interactions:  $P_k \sim -I_k I_k^2$

- increase also with number of groups at level  $k - 1$ :  $P_k \sim -I_{k-1}$

$$P_k = \left[ (g_k I_{k-1} P_{k-1}) I_k - (c_k I_{k-1}) I_k^2 \right] I_k ; \quad N = I_1 I_2 \dots I_k$$

➤ if  $g_2, \dots, g_k \sim c_1/g_1$ ,  $c_k \sim g_1^{2k-3}/c_1^{2k-4}$ :  $P_k \sim g_1 N^2$  (!!)

- productivity of a single large group with *no* interaction costs
- formation of hierarchies: efficient way of reducing interaction cost

- ▶ so far: optimization of *global* productivity
  - realistic system: cannot probe all possible configurations  
no breaking/rearrangement of large number of connections
  - growing systems: more likely follow established pathways
    - ⇒ search for “local” optima (rather than global optima)
    - ⇒ different set of growth rules lead to high productivity

**Example 1:** (Drossel '99)

1. simultaneous formation of isolated groups until  $P_1/N$  decreases
2. groups interact → formation of supergroups until  $P_2/N$  decreases
3. supergroups interact → formation of super-supergroups until  $P_3/N$  decreases
4. groups at level  $k - 1$  can still grow further if this increases productivity at level  $k$

$N=5, P/N=2.0$



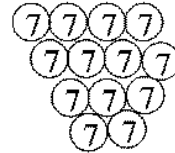
$N=10, P/N=5.6$



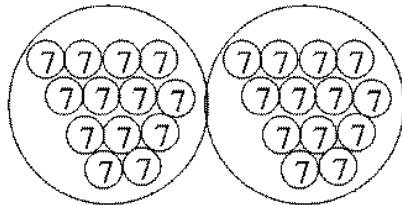
$N=14, P/N=6.4$



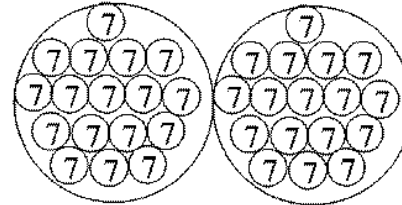
$N=91, P/N=31$



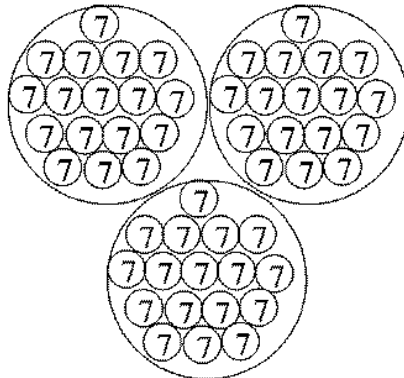
$N=182, P/N=172$



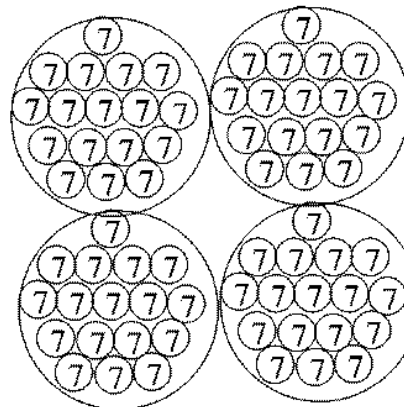
$N=238, P/N=195$



$N=357, P/N=361$



$N=476, P/N=529$



**Example 2:** (Drossel '99)

1. level 1: add new units  $\rightarrow$  (i) join existing groups if this increases productivity, OR (ii) form a new group with one of the units in other groups, as long as productivity increases
2. migration of units from other groups to newly formed one, as long as productivity increases
3. level  $k$ : split of groups from supergroups to form new supergroups, and migration of groups to other supergroups, as long as productivity increases





**Example 3:** (Drossel '99)

1. add new units to a group until productivity decreases
2. split into two groups that grow until productivity decreases
3. rearrangement into three groups that grow until productivity decrease
4. split into two supergroups that grow until productivity decreases

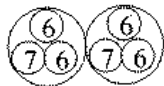
N=5, P/N=2.0



N=14, P/N=7.94



N=38, P/N=20.4



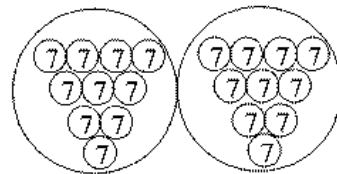
N=6, P/N=2.68



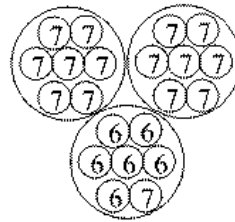
N=37, P/N=20.2



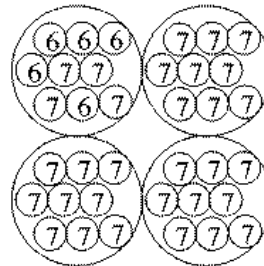
N=140, P/N=131



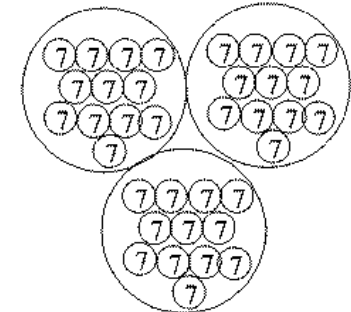
N=141, P/N=133



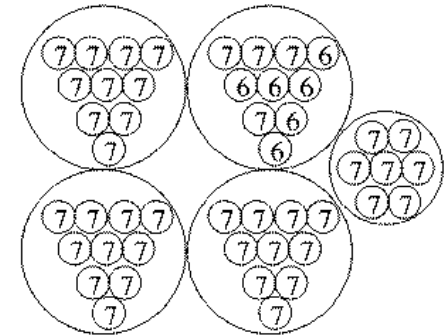
N=247, P/N=282



N=246, P/N=280



N=339, P/N=418



**Result:**

- complexity emerges: formation of hierarchies to optimize two contradicting requirements (benefit vs. costs of interaction)

**Extensions:**

- *heterogeneous agents*: no identical units, groups, ....
- explicit time dependence: “aging of groups”
- explicit dependence on distance, costs of migration
- dynamics of entry/exit: “birth” dependent on local conditions, “death” of units, groups, ...
- dependence on resources

### Some References:

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Albrecht, K.- F.: Problems of Modelling and Forecasting on the Basis of Phenomenological Investigations, *Ecological Modelling*, 63 (1992), p. 45-69.

Mende, W., Albrecht, K.- F. Electric Energy Production as an Evolution Process, in: Voigt-Mühlenbein-Schwefel (eds.) *Evolution and Optimization '89*, Akademie Verlag, Berlin, 1990, p. 177-189.

Barbara Drossel, Simple model for the formation of a complex organism, *Phys. Rev. Lett.* 82, 5144 (1999)