

# Applying Parallel Genetic Algorithms to Economic Problems

## The Case of Agricultural Land Markets

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IIFET 2000

# Organisation

why not to use standard economics?

economic applications of genetic algorithms

what are genetic algorithms and how do they work?

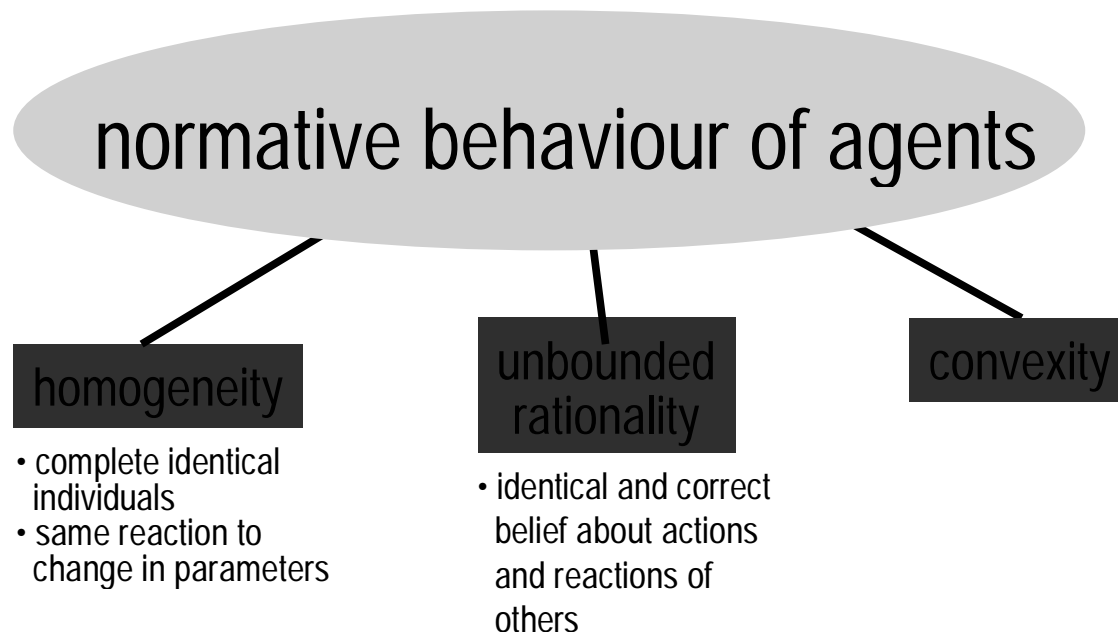
example: land allocation model

3 market scenario simulations

conclusions

# Why not to use standard economics?

The usual case:



+ analytical analysis

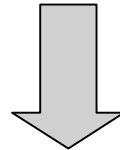
- Do economic agents behave like models want them to?

standard economics  $\Rightarrow$

# Why not to use standard economics?



replace normative behaviour



instead: **GENETIC ALGORITHMS**

GA is search and updating procedure

search for 'best' farm behaviour out  
of a set of possible behaviours

# Economic applications of GA

	model type	game type	Nash Equil.	GA type
Arifovic (1994)	simple cobweb	symmetric	pure strategies	standard
Dawid/Kopel (1998)	cobweb heterogeneous production structure	symmetric	mixed strategies	adjusted GA switching gene
Balmann (1998)	land auction market	asymmetric	mixed strategies	adjusted GA for land market
Balmann/Happe (2000)	land auction market	asymmetric	mixed and pure strategies	parallel GA

standard economics  $\Leftrightarrow$  economic applications  $\Leftrightarrow$

# GA - steps to undertake

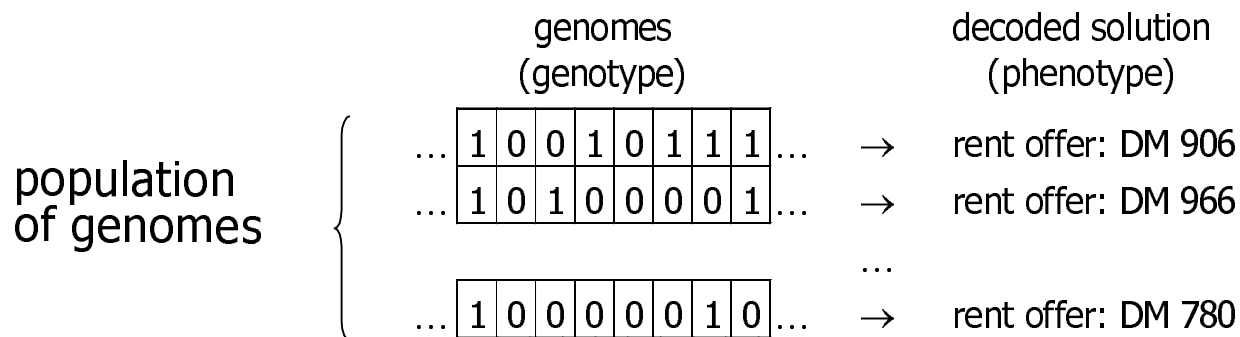
provide genetic information:

representation of strategy/solution as a string of genes

define population:

to apply genetic operators

apply genetic operators: selection, crossover, mutation



# Genetic Algorithms - rules

variety generation  $\rightleftarrows$  variety restriction

rules:

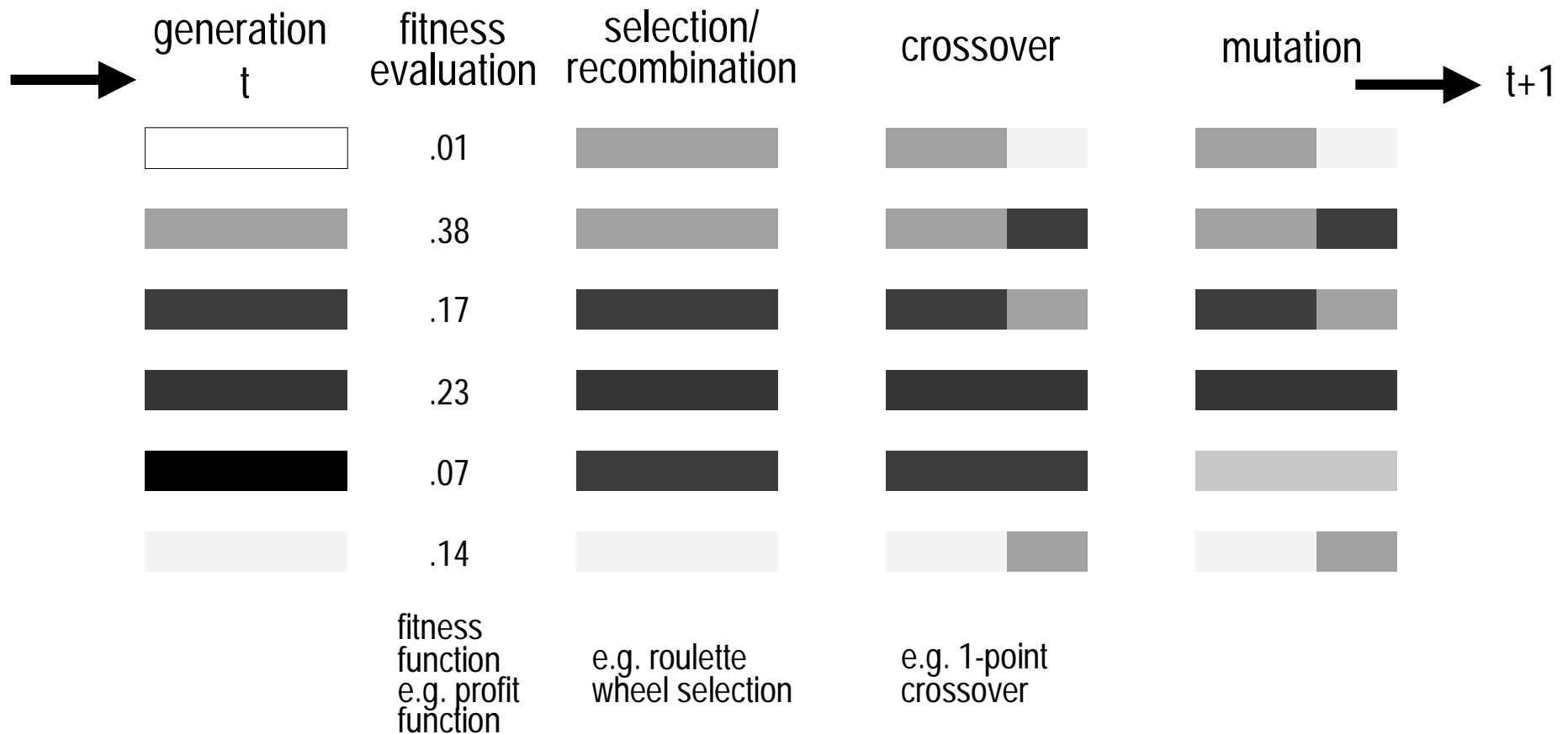
do not change only one variable at a time

do not rely on local analysis and prediction

change all variables at the same time

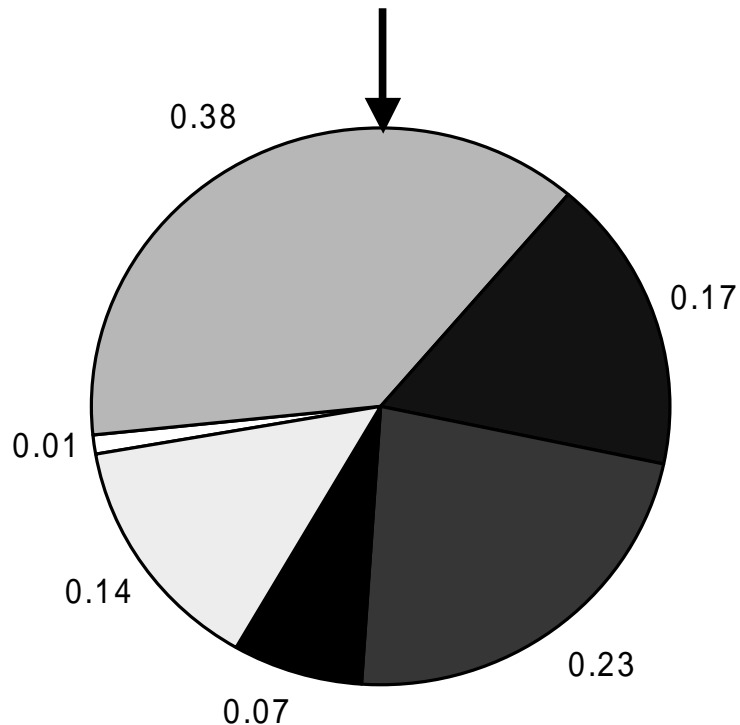
forget failures and keep successful solutions

# How a GA works...



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# Roulette wheel selection

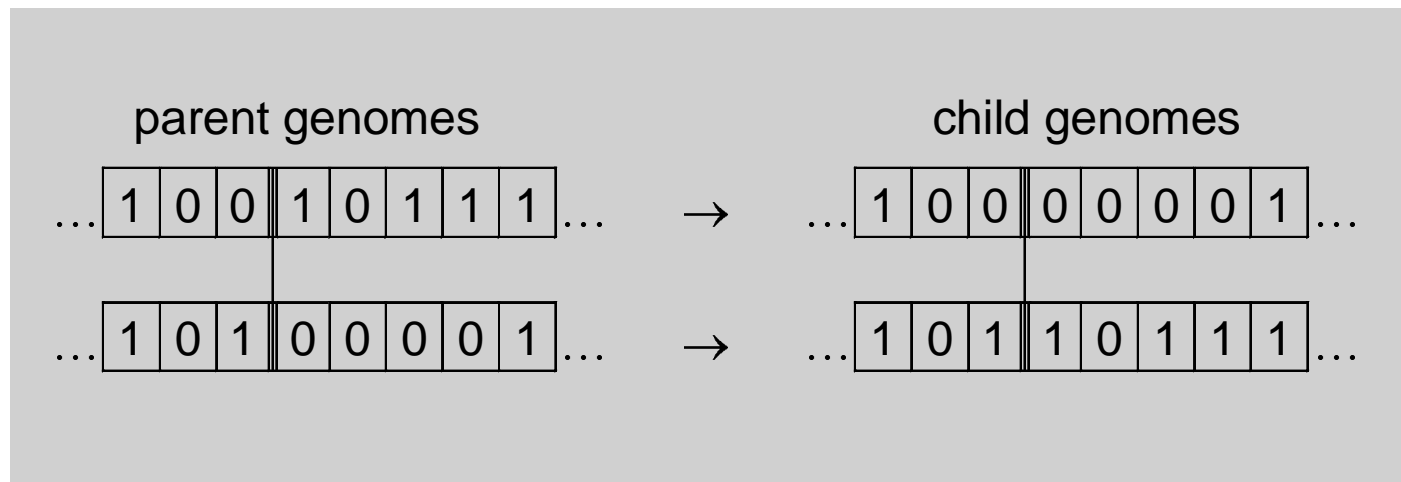


variation:  
spin the wheel only  
for certain genomes  
(e.g. fitness = 0)

circle = total fitness of population  
coloured pieces = fitness of one  
strategy in population

# Crossover

## 1-point crossover



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# Some general remarks on GA

imitation of basic ideas of natural evolution

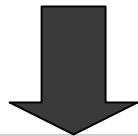
but, biological evolution is much more complex

efficiency aspects of

chosen encoding scheme (e.g. binary code vs. gray code)

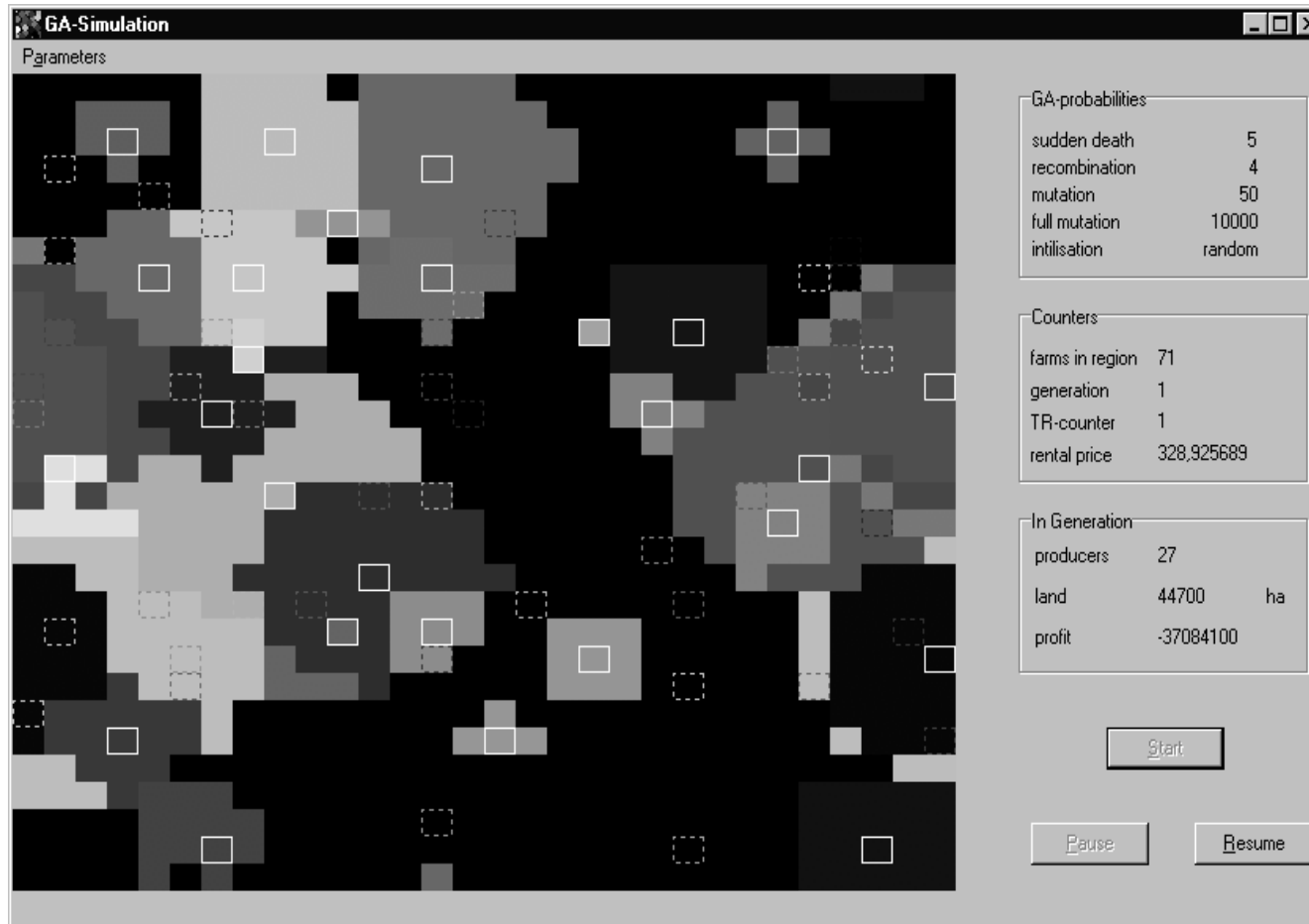
fitness function

implementation of operators (e.g. selection)



extend GA models reflect more complex reality

# Example: land allocation model



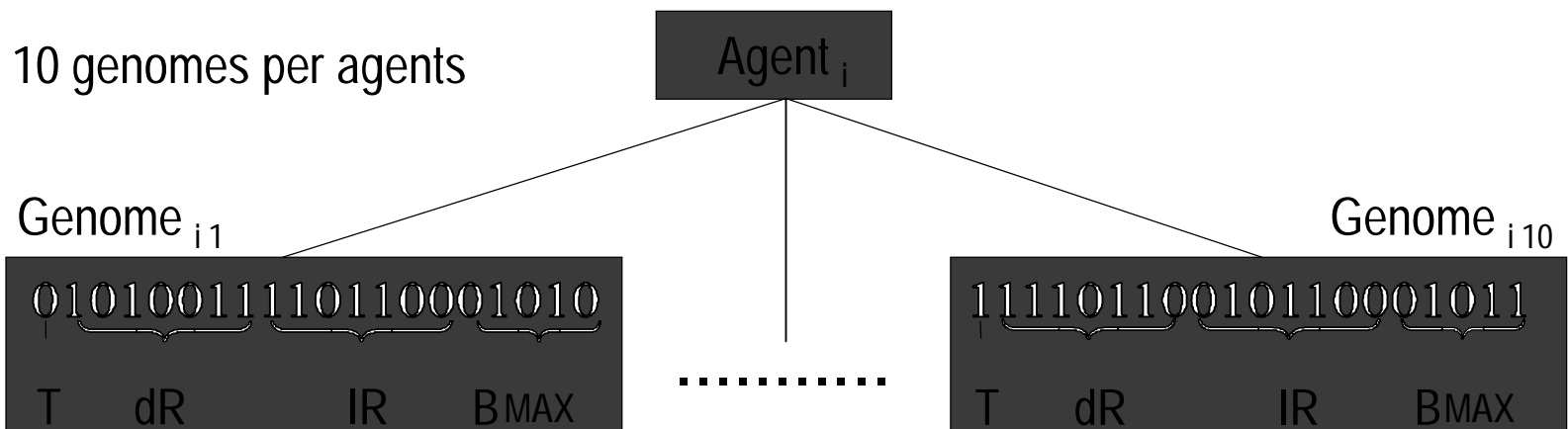
standard economics  $\Leftrightarrow$  economic applications  $\Leftrightarrow$  GA  $\Leftrightarrow$  model  $\Leftrightarrow$

# Multiple GA

## Allows

agents develop strategies adopted to location and neighbourhood

agents to have homogeneous populations of strategies, but the population of all agents to have heterogeneous strategies



# Behaviour of agents

4 strategy parameters of agent  $i$

$T_i$ : participate, yes - no

$IR_i$ : initial rent offer

$dR_i$ : rent differentiation coefficient

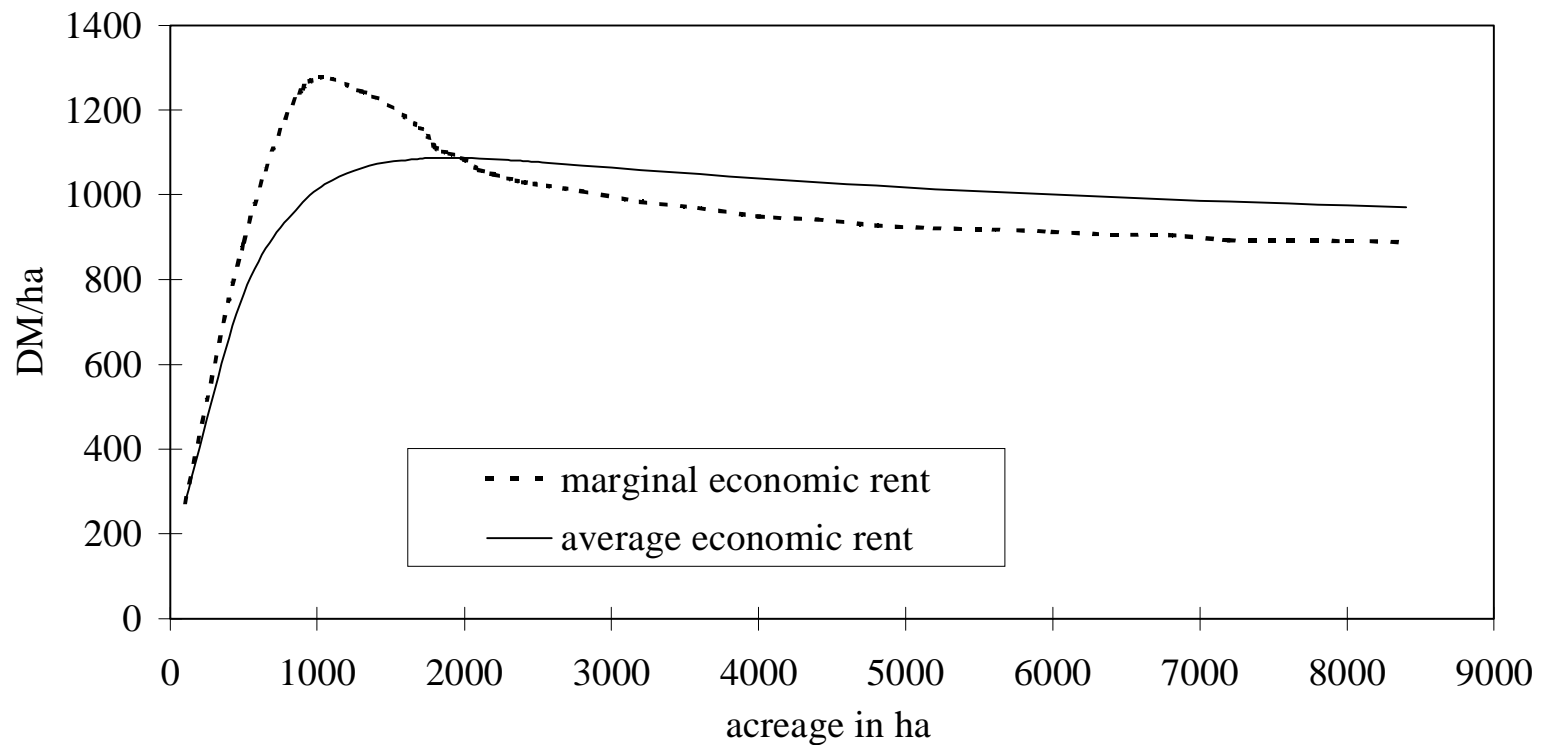
$B_{MAXi}$ : max. desired area of a farm

coded on a genome

rent offer of agent  $i$ :

$$P_i = \begin{cases} IR_i - dR_i \cdot B_i - TC_i(\cdot) & \text{for } T_i = 1 \text{ and } B_i < B_{\max,i} \\ \text{no bid} & \text{for } T_i = 0 \text{ or } B_i \geq B_{\max,i} \end{cases}$$

# Economic rent function



Source: own calculations, after Peter (1993)

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# 3 Scenario

## Scenario 1 - unlimited market access

region size: 57600 ha

~ 200 farm agents

transport costs of 20 DM/ha and km distance

## Scenario 2 - limited market access, large region

region size: 90000 ha

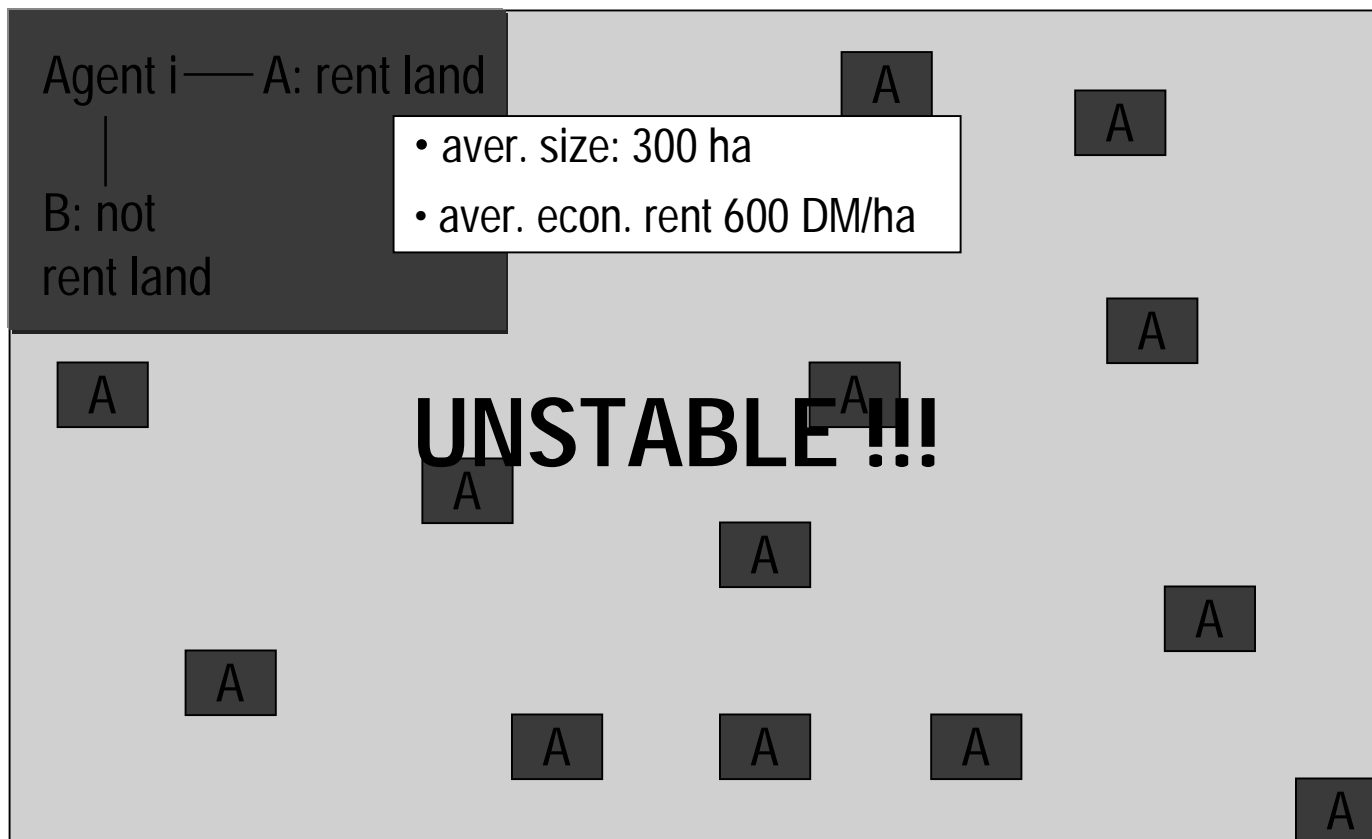
~ 43 farm agents

## Scenario 3 - limited market access, small region

region size: 12100 ha

4 farm agents

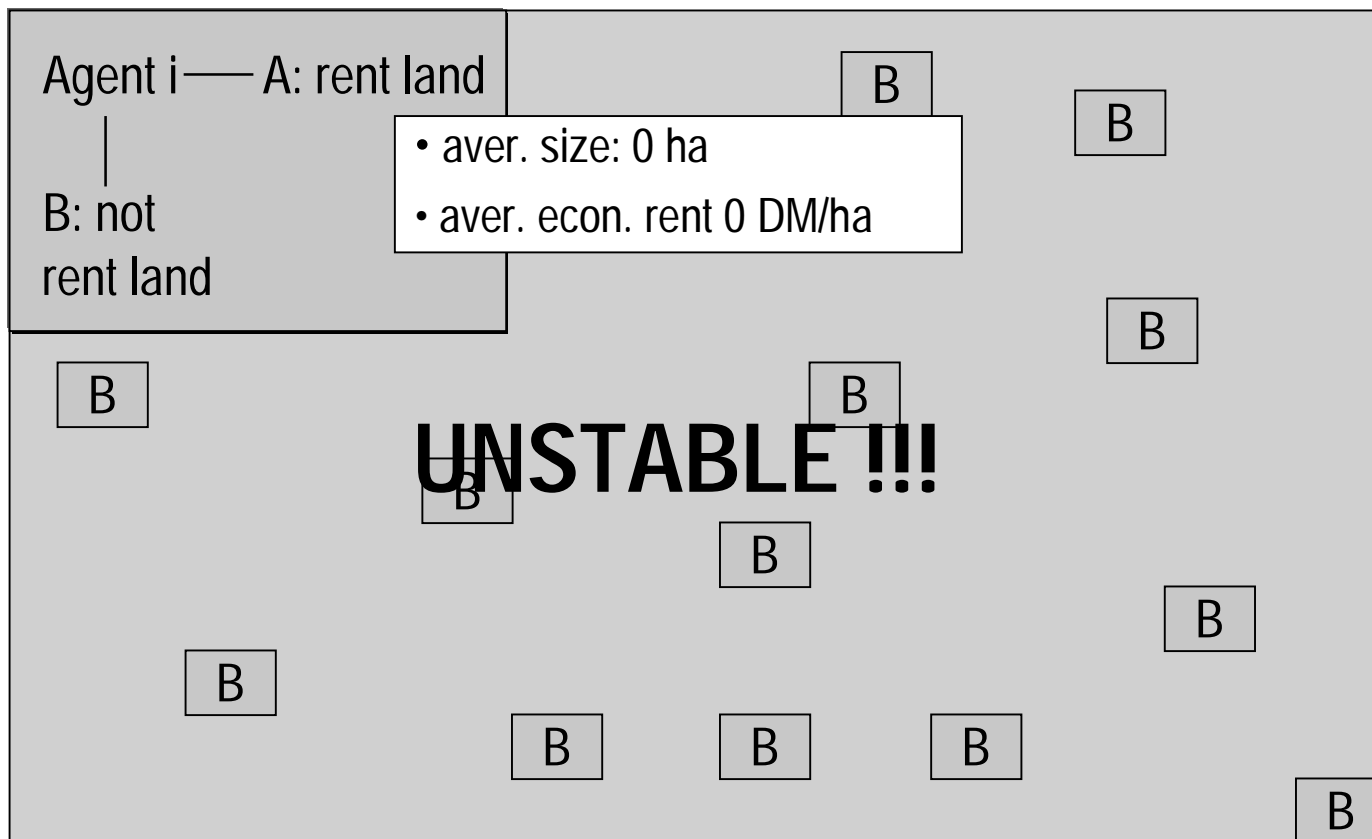
# Equilibrium Considerations



optimum: farm size ~ 2000 ha, ec. rent 1087 DM/ha

standard economics  $\Rightarrow$  economic applications  $\Rightarrow$  GA  $\Rightarrow$  model  $\Rightarrow$  results  $\Rightarrow$

# Equilibrium Considerations

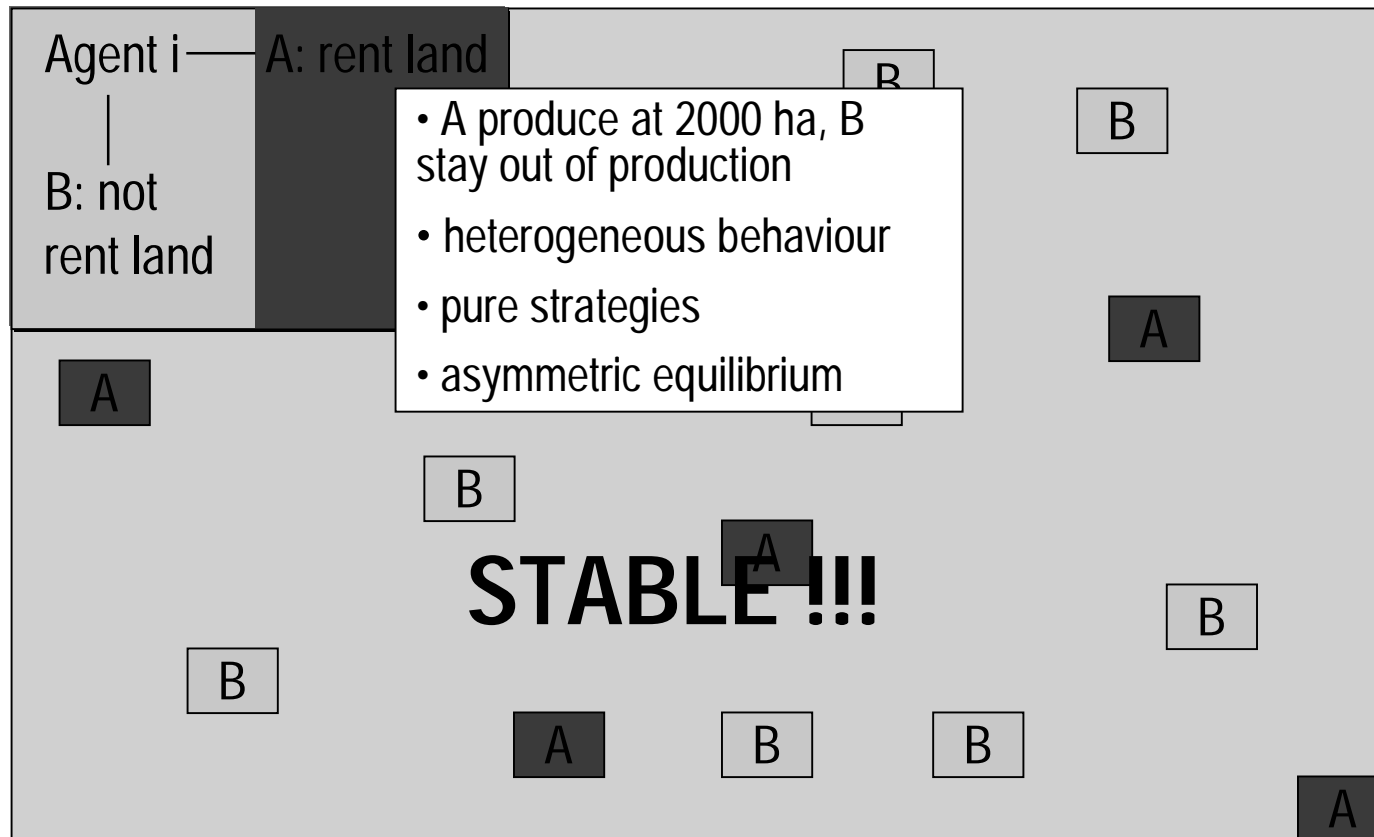


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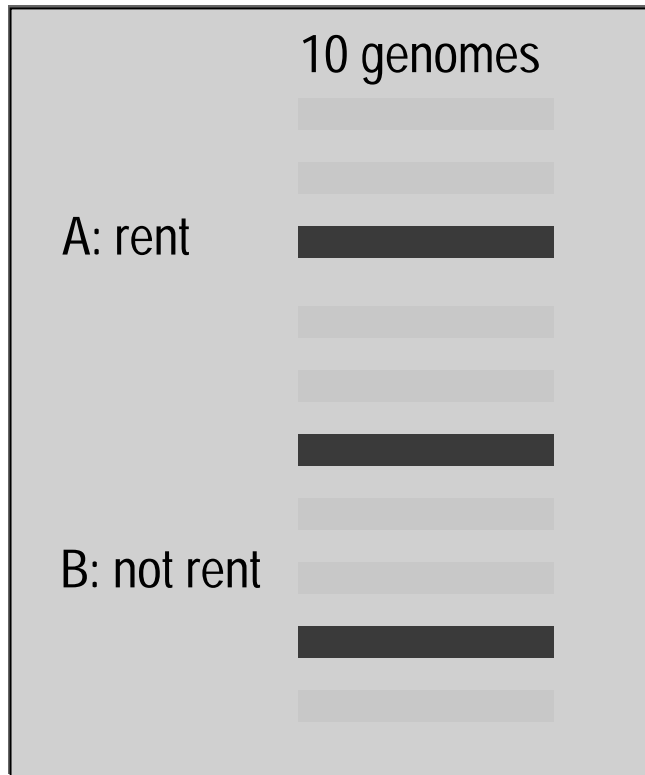


optimum: farm size ~ 2000 ha, ec. rent 1087 DM/ha

standard economics  $\Leftrightarrow$  economic applications  $\Leftrightarrow$  GA  $\Leftrightarrow$  model  $\Leftrightarrow$  results  $\Leftrightarrow$

# Equilibrium Considerations

Agent i



mixed strategy

probability distribution of A  
or B



equilibrium

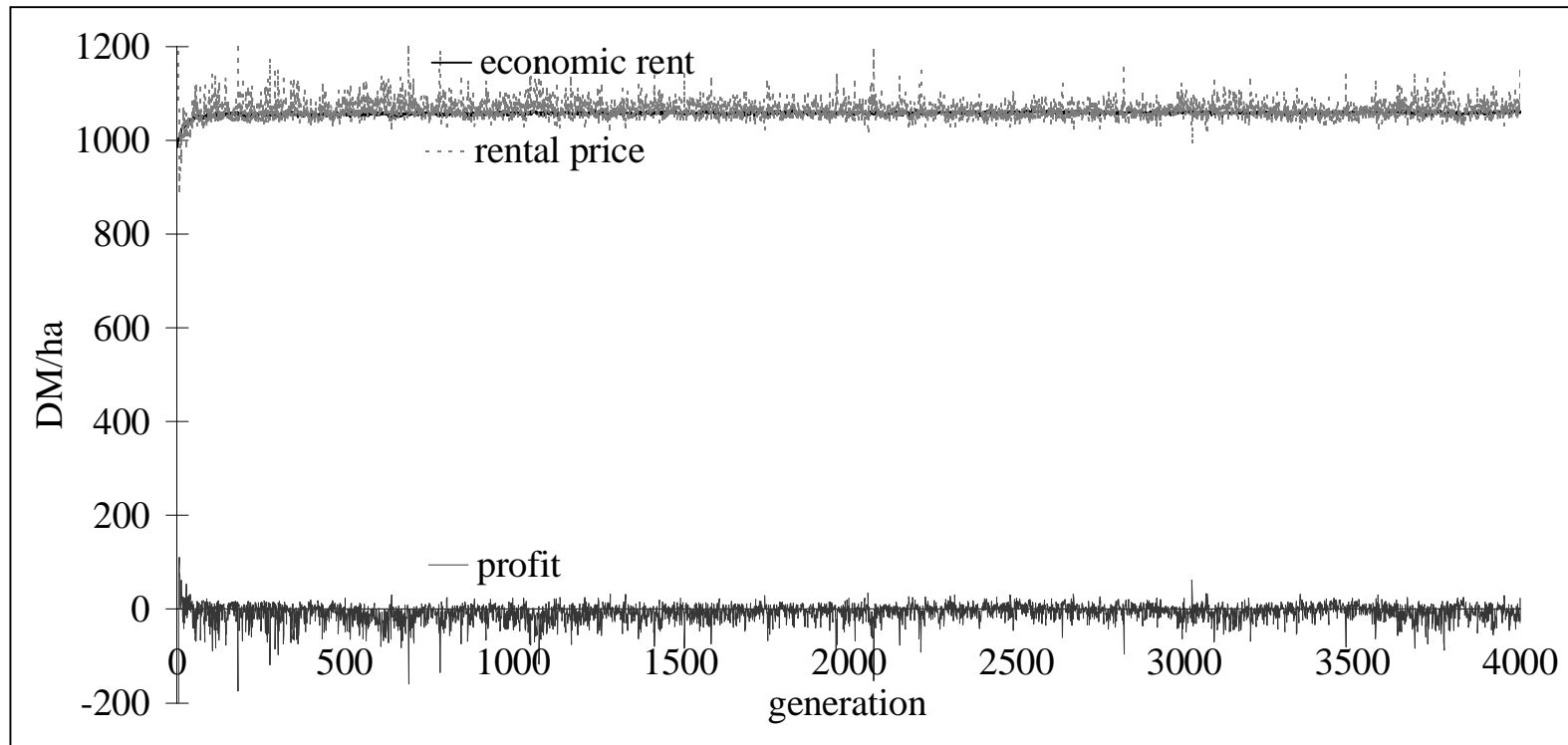
production structure on  
sector level

optimum: farm size ~ 2000 ha, ec. rent 1087 DM/ha

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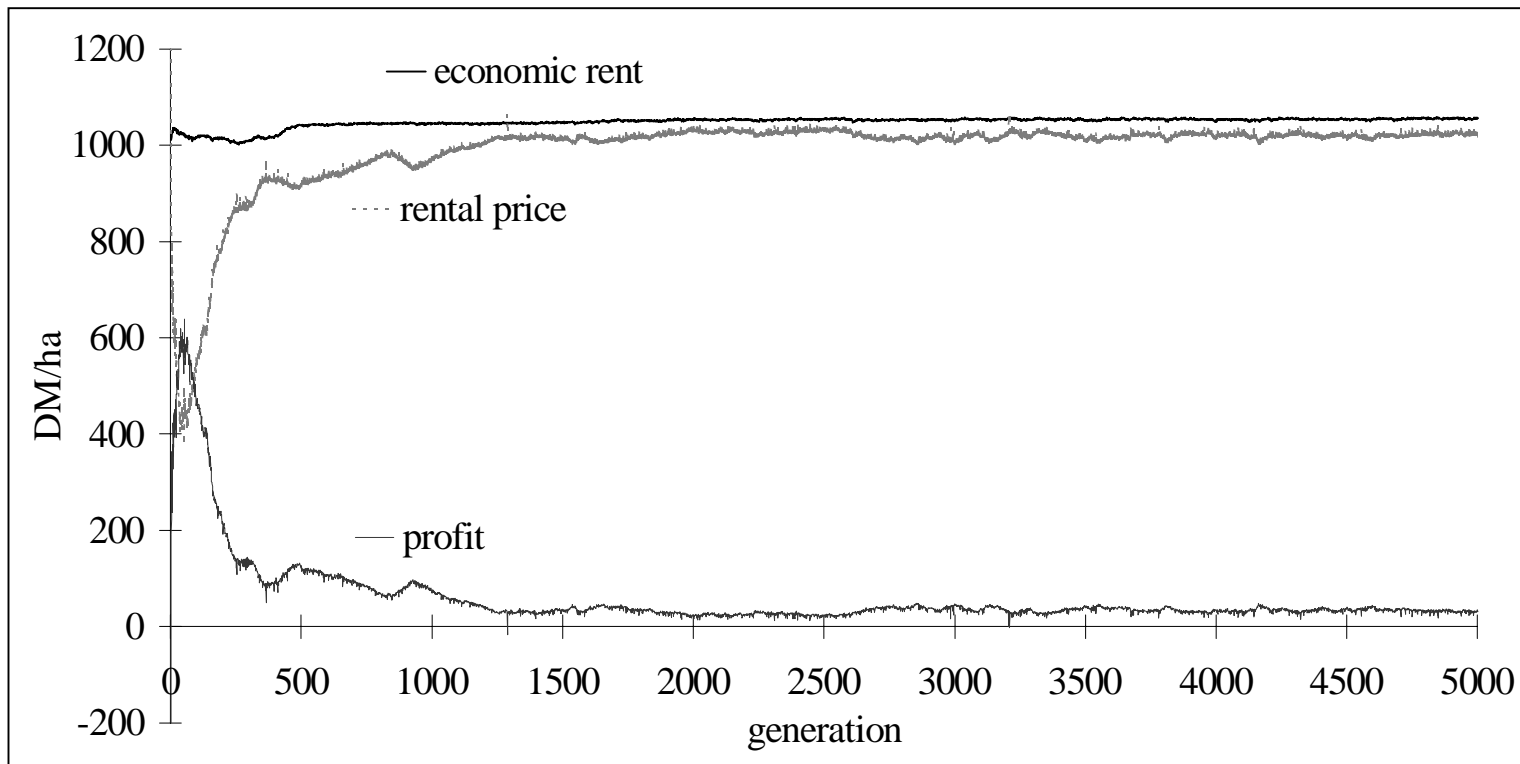
# Scenario 1: results



Unlimited market access: economic rents, rental prices, and profits  
(203 agents, 57600 ha, transportation costs 20 DM per ha and km,  $\alpha = 0.95$ )

standard economics  $\Rightarrow$  economic applications  $\Rightarrow$  GA  $\Rightarrow$  model  $\Rightarrow$  results  $\Rightarrow$

# Scenario 2: results



Limited market access, large region: economic rents, rental prices, and profits  
(43 agents, 90000 ha, transportation costs 20 DM per ha and km,  $\alpha = 0.95$ )

standard economics  $\Leftrightarrow$  economic applications  $\Leftrightarrow$  GA  $\Leftrightarrow$  model  $\Leftrightarrow$  results  $\Leftrightarrow$

# Scenario 2: results

Theoretical and realized profits depending on transportation costs (TC) in DM per ha and km, data in ha or DM per ha)

No.	TC	region size (ha)	$\beta$	simulation results generations 3000 to 5000			calculated figures <sup>a)</sup>	
				average acreage	eco-nomic rent	rental price	profit $\Pi/B$	$W/B - \partial W / \partial B$ for $B = 2200$ ha
1	0	90000	0.95	2288	1117	1104	13	14
2	20	90000	0.95	2267	1054	1020	34	36
3		90000	0.95	2956 <sup>b)</sup>	1030 <sup>b)</sup>	961 <sup>b)</sup>	69 <sup>b)</sup>	76 <sup>d)</sup>
4	60	90000	0.95	2240	950	888	62	79
5	120	90000	0.95	2143	806	662	144	144
6	200	90000	0.95	1927	667	482	185	231
7	20	6400	0.95	3168 <sup>c)</sup>	1052 <sup>c)</sup>	551 <sup>c)</sup>	501 <sup>c)</sup>	76 <sup>f)</sup>
8		12100	0.95	3000 <sup>d)</sup>	1062 <sup>d)</sup>	544 <sup>d)</sup>	517 <sup>d)</sup>	76 <sup>f)</sup>
9		12100	0.95	2999 <sup>e)</sup>	1047 <sup>e)</sup>	543 <sup>e)</sup>	504 <sup>e)</sup>	76 <sup>f)</sup>

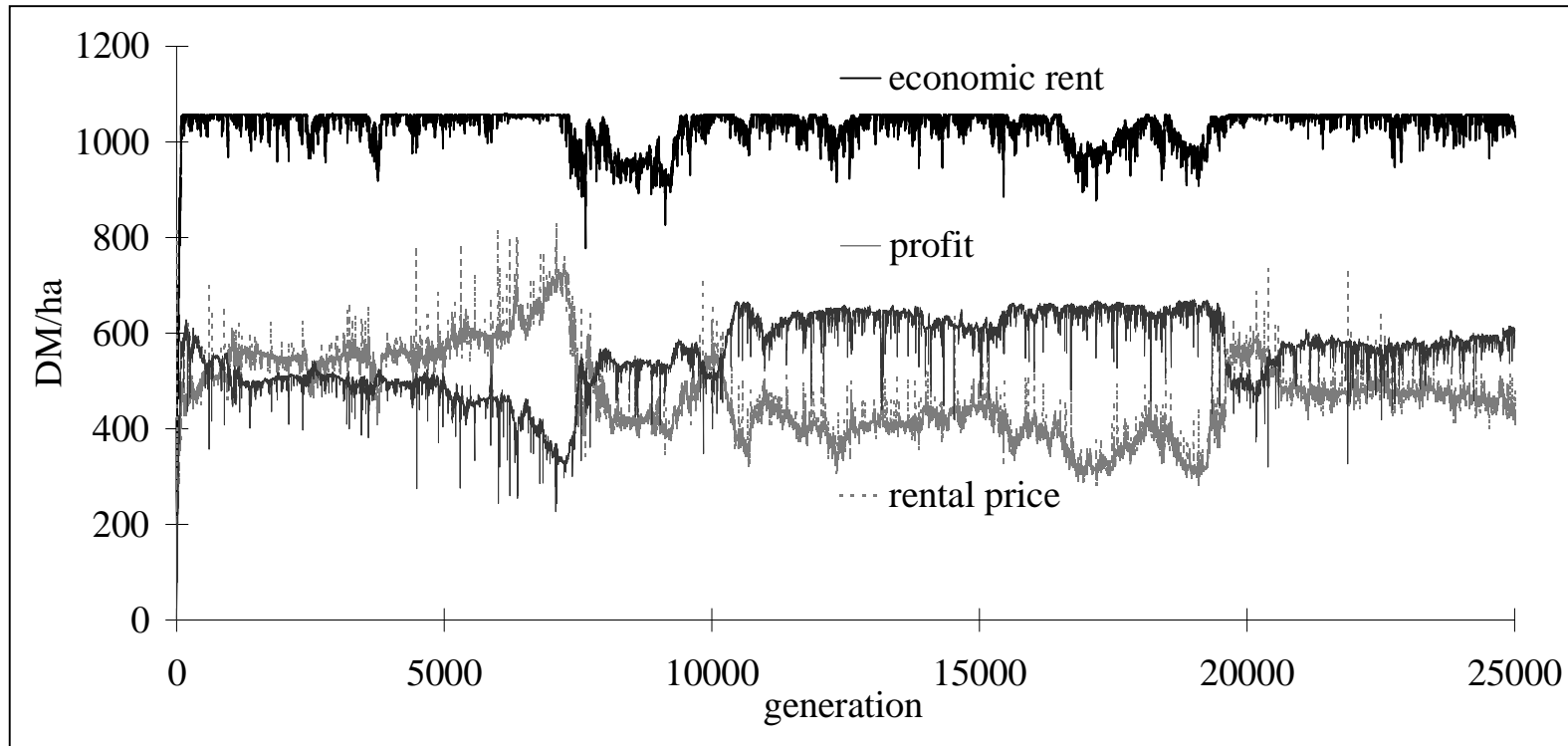
<sup>a)</sup> Calculated differences between marginal and average economic rent (W) according to Figure 6 for an acreage of 2200 ha and an ideal location of plots.

<sup>b)</sup> Periods 2000 - 25000. <sup>c)</sup> Periods 7000 - 13000. <sup>d)</sup> Periods 3000 - 10000. <sup>e)</sup> Periods 2000 - 25000. <sup>f)</sup>  $B=3000$  ha.

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# Scenario 3: results



Limited market access, small region: economic rents, rental prices, and profits  
(4 agents, 12100 ha, transportation costs 20 DM per ha and km)

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# Final remarks

results of Scenario 1 comply with comparative static equilibrium conditions

results of Scenario 2 are less obvious

oligopolistic market behaviour does only emerge under very restrictive conditions (Scenario 3)

# Final remarks

## validity of the model

dynamic aspects were neglected (frictions)

differences between social and biological processes

GA are a crude simplification and represent naive behaviour

danger to create artifacts

behaviour of parallel GA is very hard to study

## further use:

GA cannot yet replace conventional models

GA can serve as an extension of conventional models