#### Elements from Evolutionary Dynamics for Elementary Sustainable Economy Models

#### Sido Mylius

Methodology and Modelling unit Netherlands Environmental Assessment Agency (PBL)

GSD workshop 21–24 January 2009

Netherlands Environmental Assessment Agency

#### Outline

#### Setting

#### Evolutionary dynamics Replicator dynamics

Adaptive dynamics

Environmental feedback

An evolutionist's view

Netherlands Environmental Assessment Agency

・ロット (雪) ( ) ( ) ( ) ( )

## Sustainable Economy

A biologist's perspective

- $Sustainability \Rightarrow$  Linking economic processes to environmental processes (biotic & abiotic)
  - Economy Rationality & anticipation: Strategic behaviour Biology Mutation (random) & selection: Feedback with environment

Sustainability  $\approx$  Persistence

▲ロト★御と★臣と★臣と 臣 のの

Netherlands Environmental Assessment Agency

## Ecology and evolution

Subjects, processes

Nothing in biology makes sense except in the light of evolution



The Ecological Theatre and the Evolutionary Play

Hutchinson

イロト イポト イヨト イヨト

Netherlands Environmental Assessment Agency

Replicator dynamics Adaptive dynamics

## **Replicator dynamics**

Ingredients

- Reproduction (clonal)
- Mutation
- Selection
- Constant fitness
- Infinitely large, well-mixed population, ...

Netherlands Environmental Assessment Agency

Replicator dynamics Adaptive dynamics

## Quasispecies equation

Eigen & Schuster

$$\dot{x}_i = \sum_{j=1}^n \mu_{ji} f_j x_j - \phi(\mathbf{x}) x_i$$

- where  $x_i \equiv \text{frequency of type } i$ 
  - $\mu_{ji} \equiv$  mutation probability of type *j* to *i*
  - $f_i \equiv fitness of type i$
  - $\phi(\mathbf{x}) \equiv$  average fitness  $\sum_{i=1}^{n} f_i x_i$

Netherlands Environmental Assessment Agency

3

< ロ > < 同 > < 回 > < 回 > < □ > <

#### Characteristics

Simplex dynamics

- Quadratically nonlinear dynamical system
- Standard eigenvalue problem
- Unique, globally stable equilibrium
- In general not maximizing fitness (mutation-selection balance)

Netherlands Environmental Assessment Agency

(日)

.

Replicator dynamics Adaptive dynamics

## Adaptive dynamics

Ingredients

#### Reproduction

- Mutation
- Fitness depends on individual trait value and its environment

Netherlands Environmental Assessment Agency

## Adaptive dynamics

Ingredients

- Reproduction
- Mutation

Netherlands Environmental Assessment Agency

(日)

×

## Adaptive dynamics

Ingredients

- Reproduction
- Mutation
- Selection  $\leftarrow$  interaction between individuals and environment
- Fitness depends on individual trait value and its environment

Netherlands Environmental Assessment Agency

(日)

×

#### Canonical equation

Dieckmann & Law

$$\frac{d\hat{s}}{dt} = \mu(\hat{s}) \frac{\sigma_0^2(\hat{s})}{2} n(\hat{s}) \partial_1 f(\hat{s}, \hat{s})$$

- ŝ mean of distribution of trait value s where  $\equiv$ 
  - $\mu(s)$  $\equiv$ mutation probability
  - $\sigma_0^2(s)$  $\equiv$ variance of mutation distribution
  - n(s) equilibrium population size  $\equiv$
  - f(s',s)fitness of s'-individuals in s-population  $\equiv$

Netherlands Environmental Assessment Agency

イロト 不得 トイヨト イヨト

×

Replicator dynamics Adaptive dynamics

#### Changing fitness landscapes

- Separation of time scales
- Small mutational steps
- Invasion implies fixation
- Trait Substitution Sequence (jump process)



Netherlands Environmental Assessment Agency

イロト イポト イヨト イヨト

Replicator dynamics Adaptive dynamics

#### Changing fitness landscapes

- Separation of time scales
- Small mutational steps
- Invasion implies fixation
- Trait Substitution Sequence (jump process)



Netherlands Environmental Assessment Agency

イロト イポト イヨト イヨト

#### Feedback through environment

Fitness measure

Fitness should be dependent of:

- x The trait being reproduced
- *E* The environment in which reproduction takes place

Invasion fitness Long-term growth rate of a rare mutant with trait value *x* in an environment set by a resident with trait *y* 

Notation:

 $\sigma(x,E(y))$ 

Netherlands Environmental Assessment Agency

イロト イポト イヨト イヨト

## Evolutionary optimization

Environmental feedback

Consider:

- Life-history trait x
- Constant environmental condition E
- Density dependence; unique solution  $E = \eta(x)$

Feedback rules:

- 1. If density dependence reduces life-time offspring production:  $\hat{x}$  is evolutionarily steady iff  $x \mapsto R_0(x, V)$  is maximal for  $x = \hat{x}$
- 2. If density dependence uniformly increases mortality rate:  $\hat{x}$  is evolutionarily steady iff  $x \mapsto r(x, V)$  is maximal for  $x = \hat{x}$

## Density dependence

One-dimensional *E* and monotonic feedback rule:

1. If *E* is one-dimensional and  $E \mapsto R_0(x, E)$  is increasing (decreasing): Then  $\hat{x}$  is evolutionarily steady iff  $x \mapsto \eta(x)$  is minimal (maximal) for  $x = \hat{x}$ 

Interpretation The type that can keep its position under the worst environment cannot be invaded by any other type

Important Optimization approaches are only valid when the eco-evolutionary feedbacks are of a very special kind

Netherlands Environmental Assessment Agency



Economic indicators

# Biology Evolutionary optimization criteria depend on environmental feedback

#### Economy Economic indicators: GDP, GNP?

#### Sustainability indicators shaped by eco-environmental links?

- Different from taxing external costs
- Reverse engineering?
- Which constraints, regulations could yield sustainability optimization?

Netherlands Environmental Assessment Agency

э.



Economic indicators

## Biology Evolutionary optimization criteria depend on environmental feedback

Economy Economic indicators: GDP, GNP?

Sustainability indicators shaped by eco-environmental links?

- Different from taxing external costs
- Reverse engineering?
- Which constraints, regulations could yield sustainability optimization?

Netherlands Environmental Assessment Agency

イロト (雪) (ヨ) (ヨ)

#### References

Sigmund Games of Life: Explorations in Ecology, Evolution, and Behaviour. Oxford UP, 1993.
Nowak Evolutionary Dynamics: Exploring the Equations of Life. Harvard UP, 2006.
Metz, Mylius & Diekmann "When does evolution optimize? Evol. Ecol. Res. 10:629–654, 2008.
Dercole & Rinaldi Analysis of Evolutionary Processes: The Adaptive Dynamics Approach and Its Applications. Princeton

Dieckmann & Metz (eds.) *Elements of Adaptive Dynamics.* Cambridge UP, 2011.

UP. 2008.

Sido Mylius Elements from Evolutionary Dynamics

Netherlands Environmental Assessment Agency