

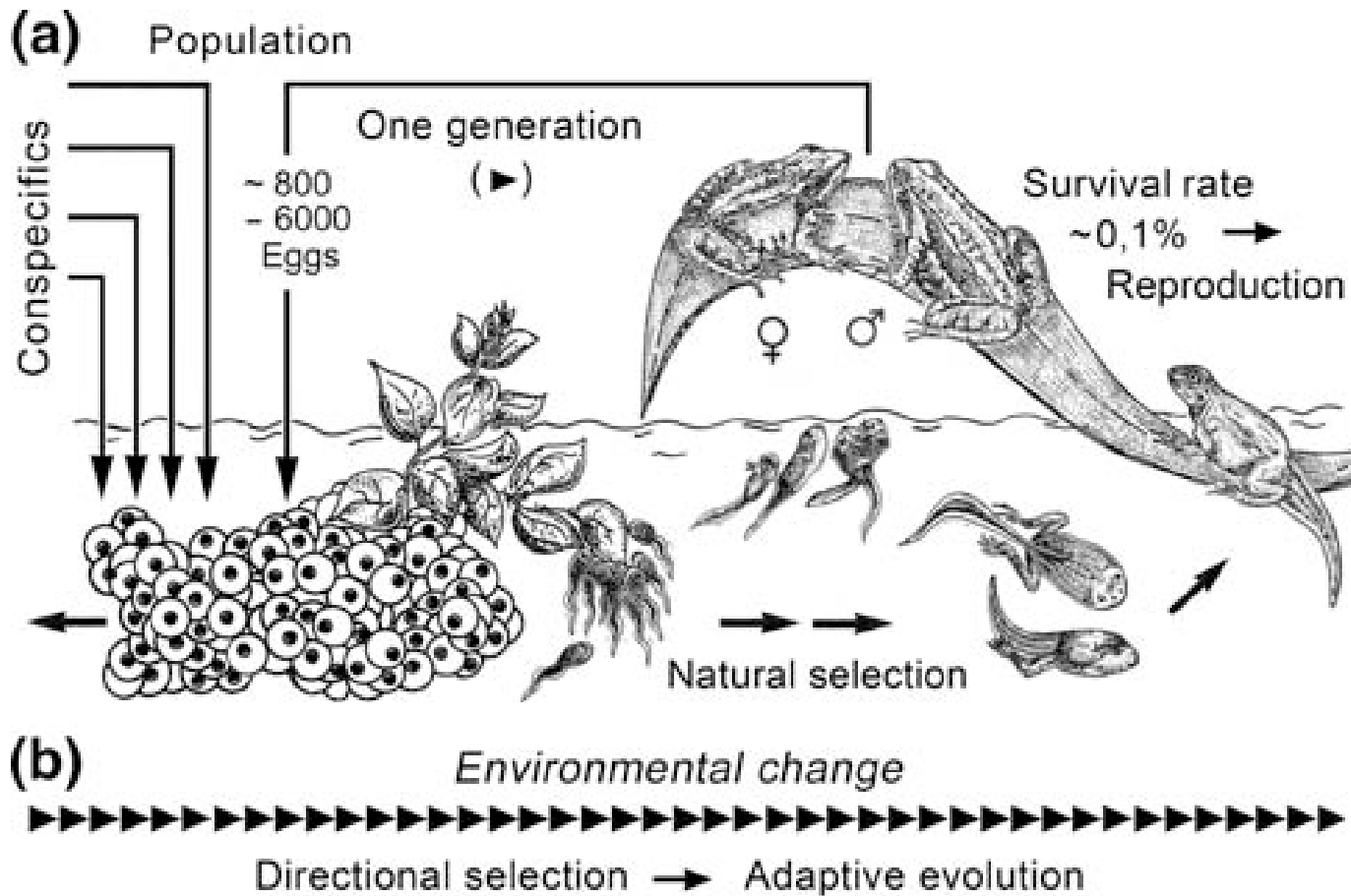
# Symbiosis as a Mechanism for building Complex Adaptive Systems: A Review

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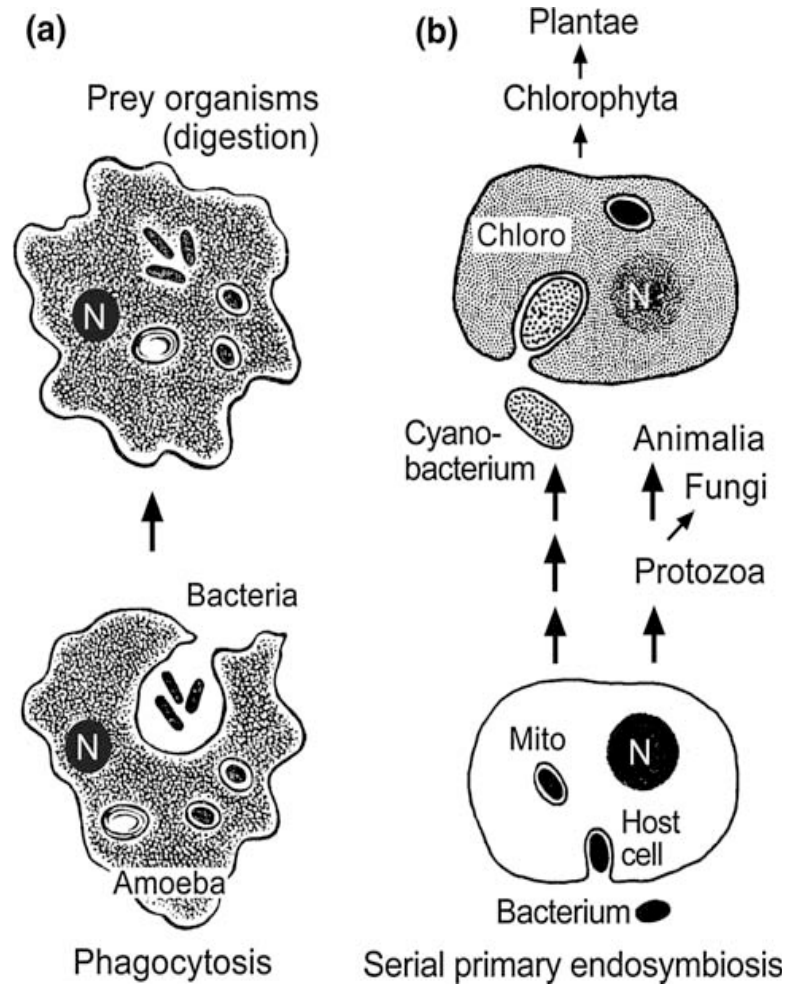
# Principle of Natural Selection

## Kutschera (2009)

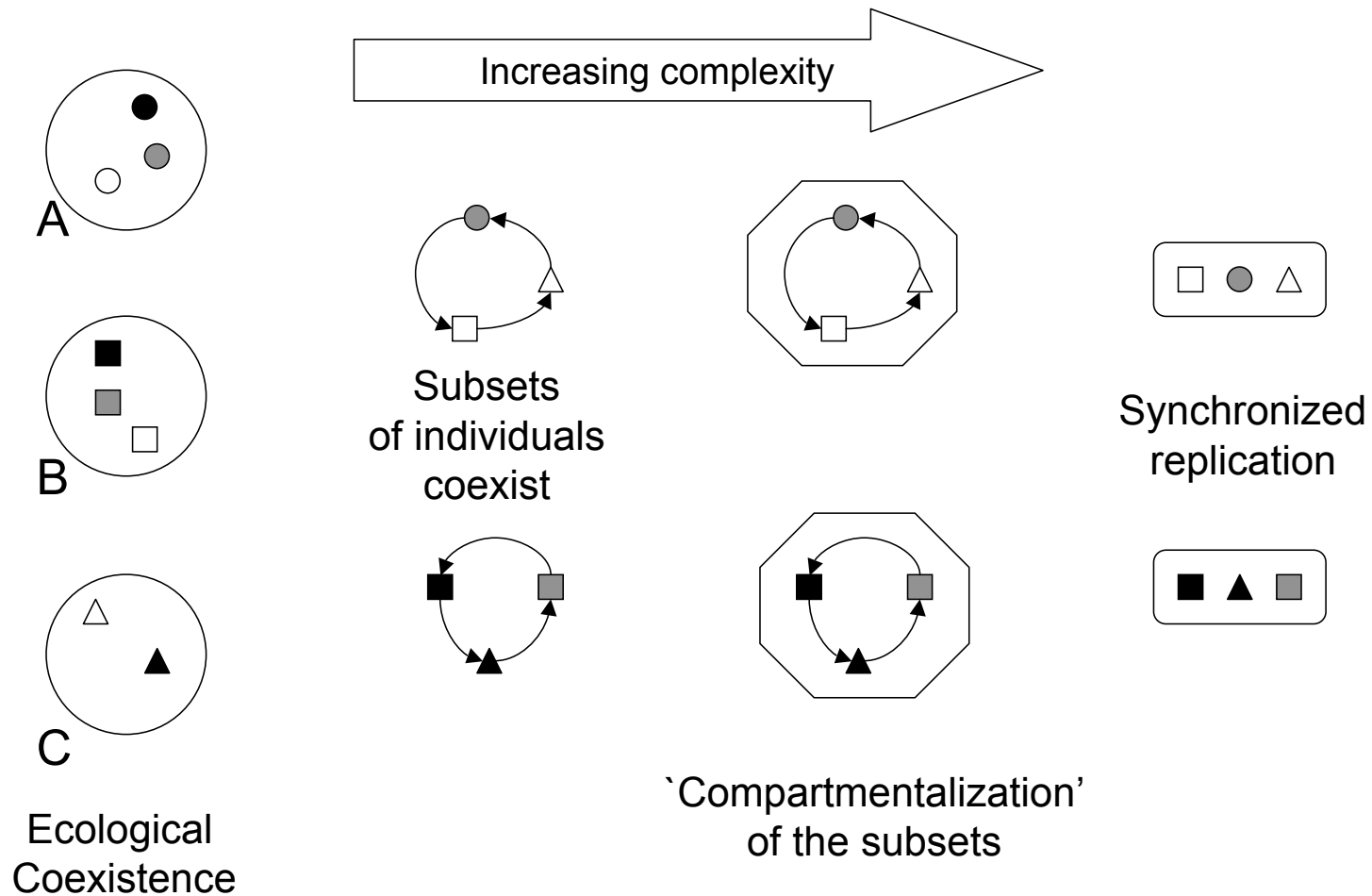


# Serial Primary Endosymbiosis

## Kutschera (2009)



# Abstract Model of Symbiosis: Maynard Smith (1991)



# Continuum of Symbiosis:

Daida *et al.* (1996)

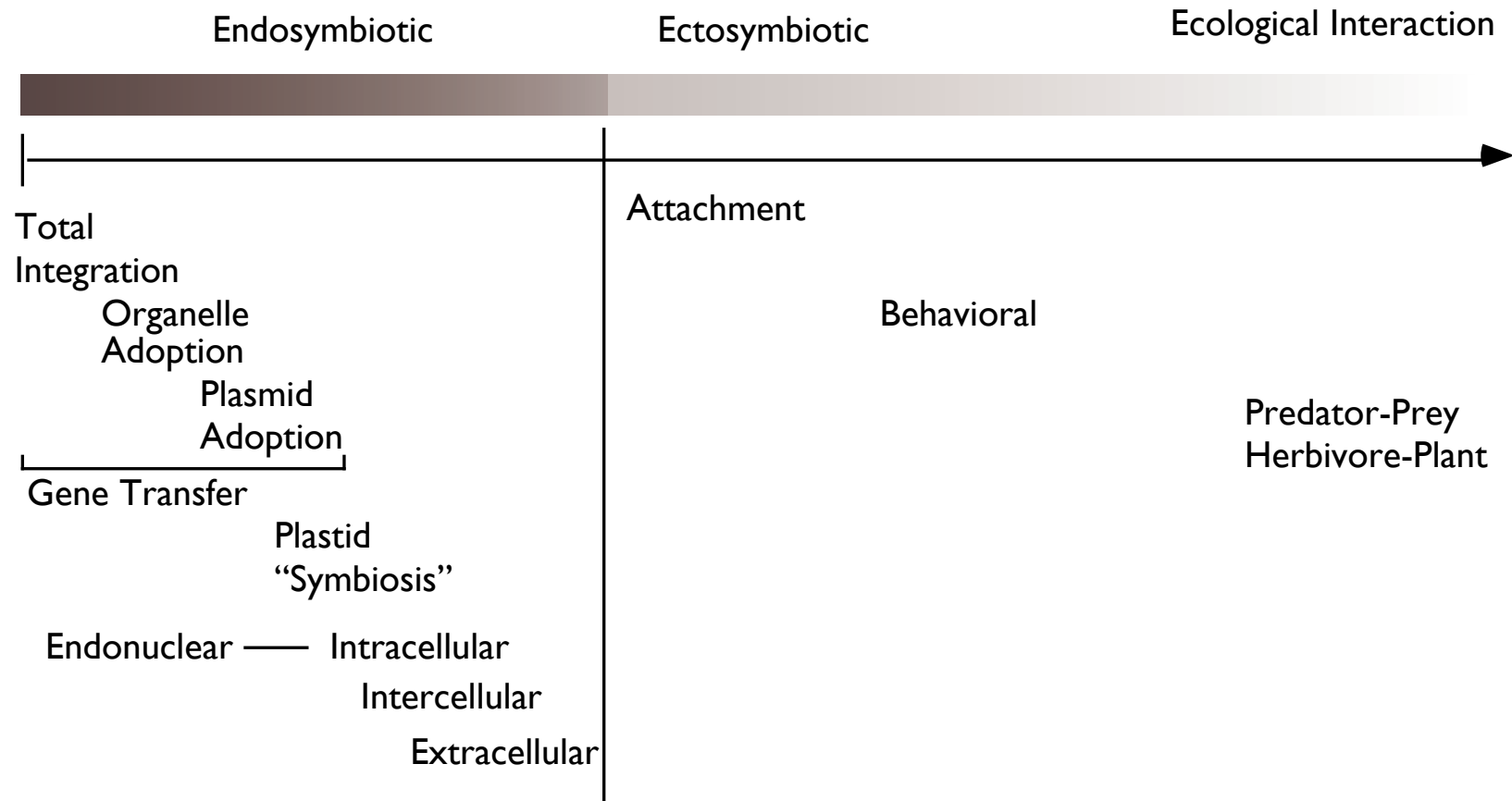


Figure 1. Continuum of interaction between dissimilar species.

# Relationships

Margulis (1991)

- Spatial
  - Degree of physical separation existing between partners
- Temporal
  - Degree of permanence associated with a partnership
- Metabolic
  - Communication between symbionts
- Genetic
  - Degree of alignment between host and symbionts
- Coevolutionary

# Coevolutionary Relations in Symbiosis

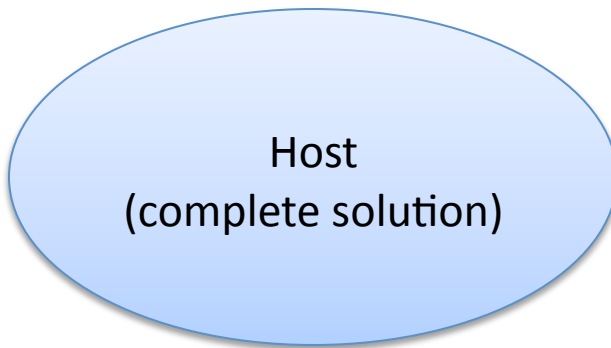
Coevolutionary Relation	Partner A	Partner B
Mutualism	Benefit	Benefit
Competition	Deteriorate	Deteriorate
Amensalism	No change	Deteriorate
Parasitism	Benefit	Deteriorate
Commensalism	No change	Benefit
Altruism	Deteriorate	Benefit

# Some Pragmatics

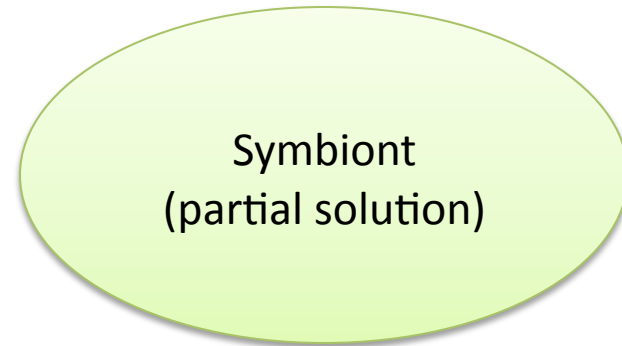
- **Hosts**
  - **Who** gets to become a host ?
- **Symbionts**
  - How is symbiont **context / communication** defined ?
  - **Who** gets to become a symbiont ?
- **External factors**
  - Role of the **wider ecosystem** ?
  - Interaction between **different** hosts ?

# Example Symbiotic Models I: Genetic Relations

# Metabolic/ Genetic Relations: *Wallin et al. (2005)*



Candidate host:  
00000000

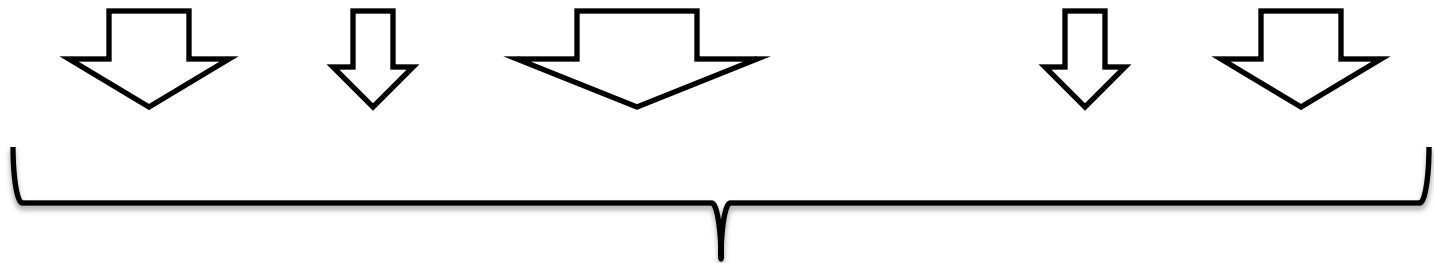


Candidate symbiont:  
<3, 111>

Child following symbiosis: 00011100

# Watson and Pollack (2003)

<b>A</b>	----- <b>1</b> ----- <b>00-1</b> --
<b>B</b>	-- <b>1-0</b> --- <b>0-1</b> -----
<b>A+B</b>	-- <b>1-1</b> --- <b>000-1</b> --



Provide a sample of 'contexts' for elitist comparison of child to parents

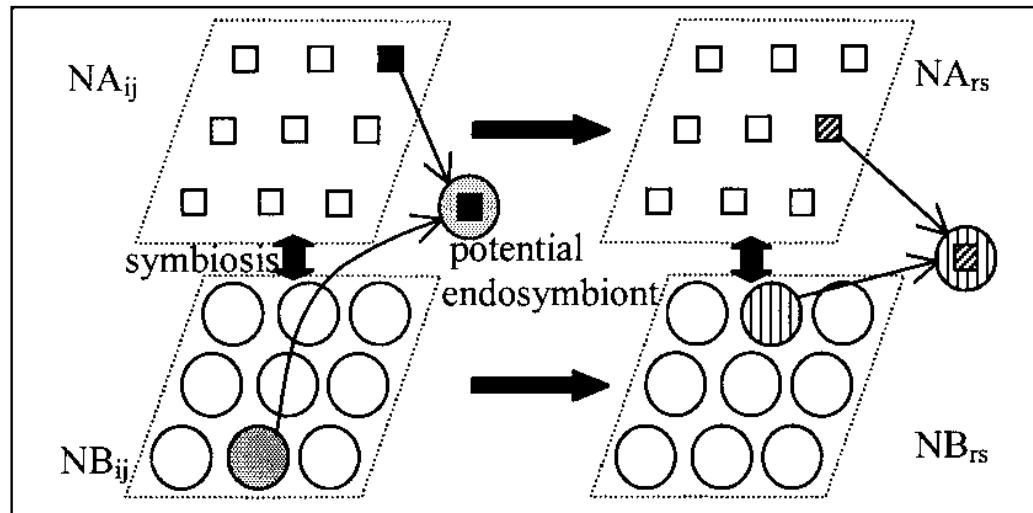
For all contexts:  $F(A+B) \gg F(A), F(B)$

Where ' $\gg$ ' denotes Pareto dominance

# Example Symbiotic Models II: Spatial Relations

# Competition

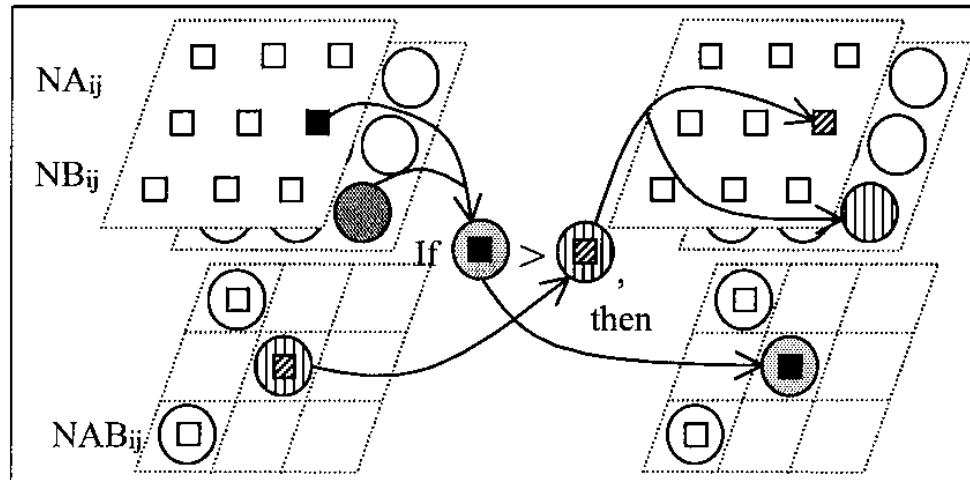
Kim *et al.* (2001)



(a) Cooperation of  $NA_{ij}$  with  $NB_{ij}$  and generation of a potential endosymbiont.

# Replacement – Pt 1

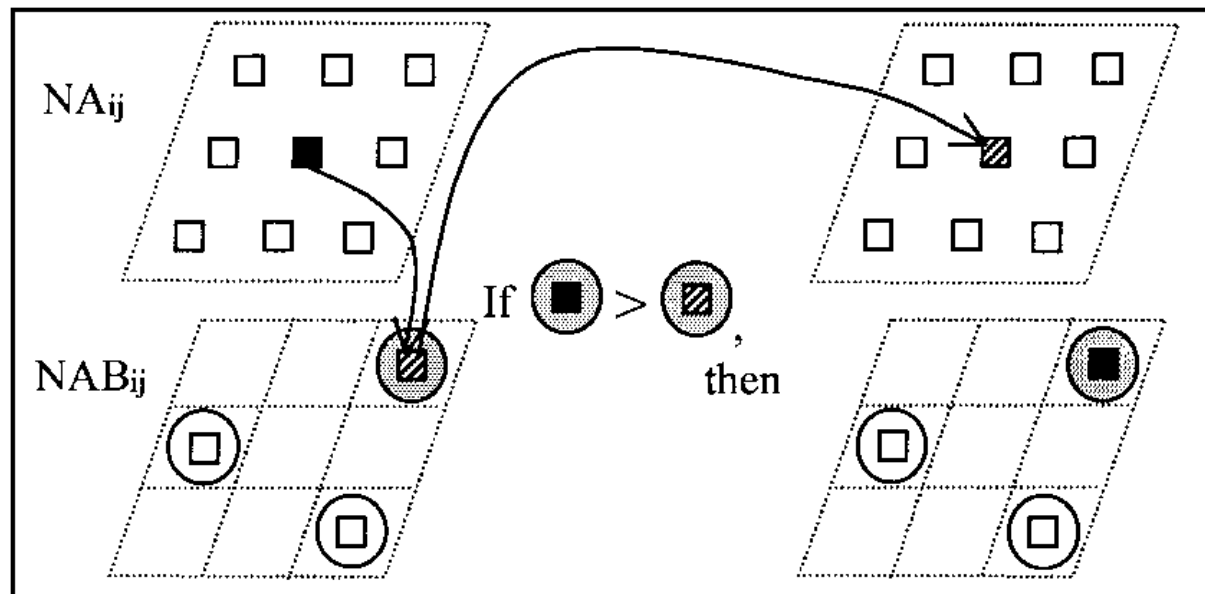
Kim *et al.* (2001)



(b) Competition between the existing endosymbiont and the potential endosymbiont.

# Replacement – Pt 2

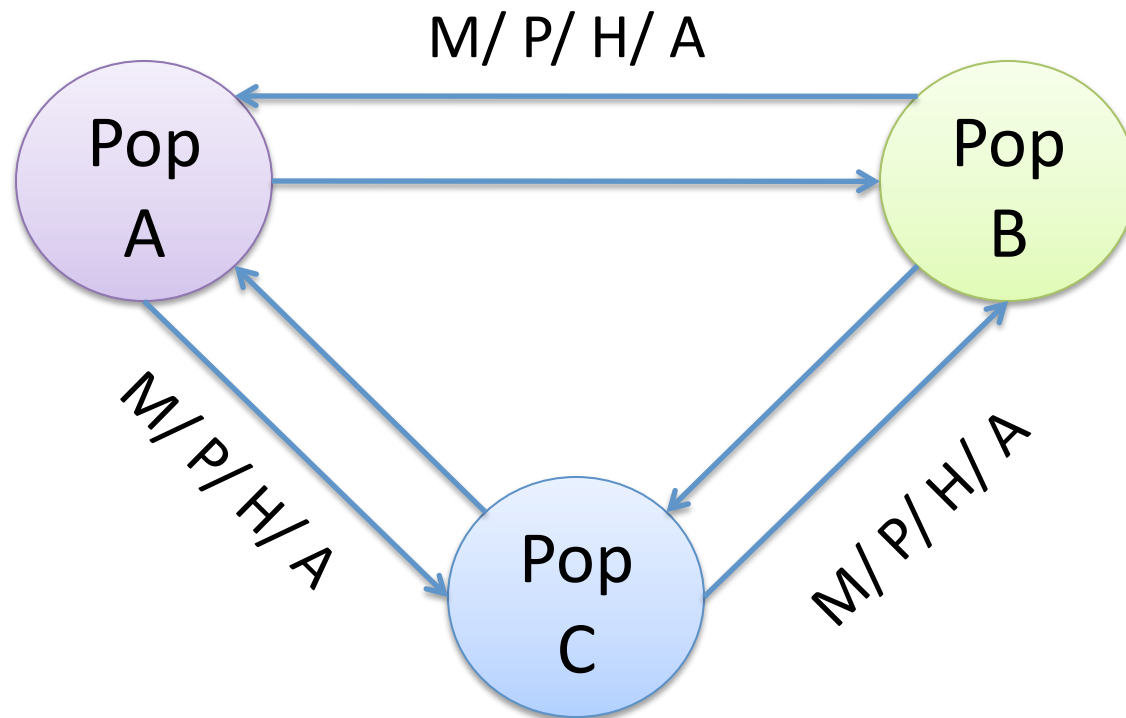
Kim *et al.* (2001)



(c) Competition of  $NA_{ij}$  with  $NAB_{ij}$ .

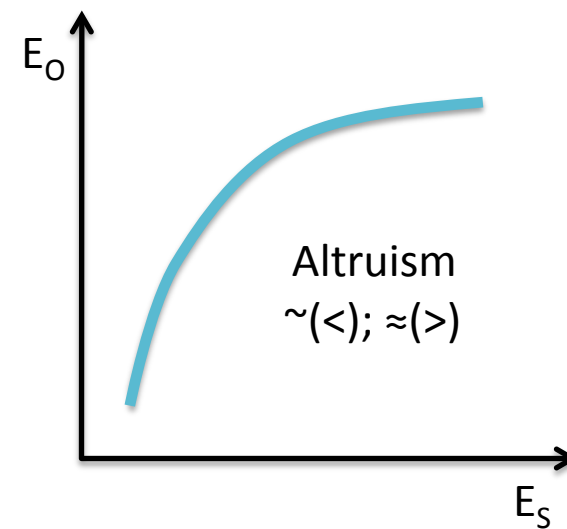
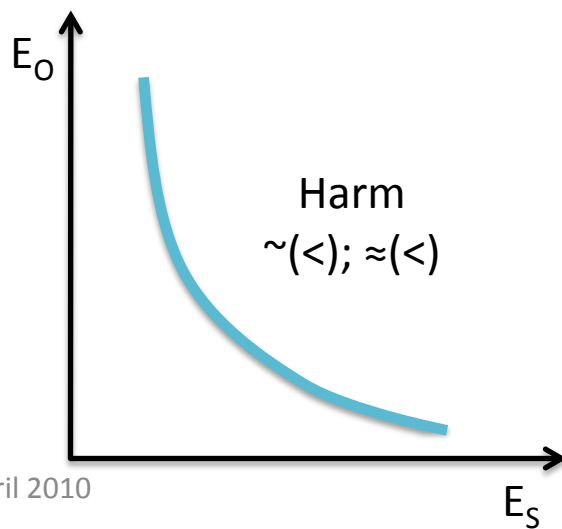
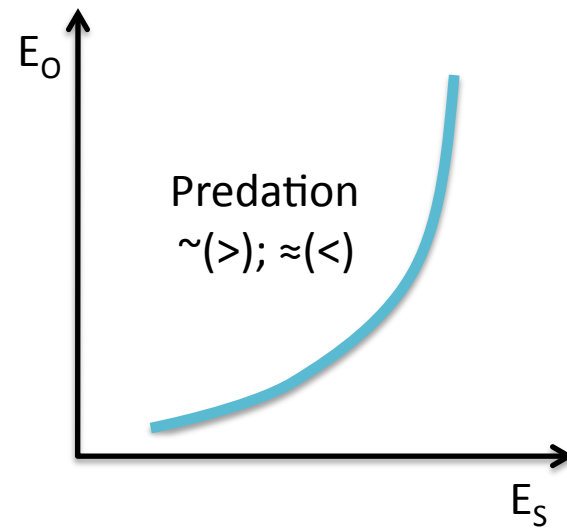
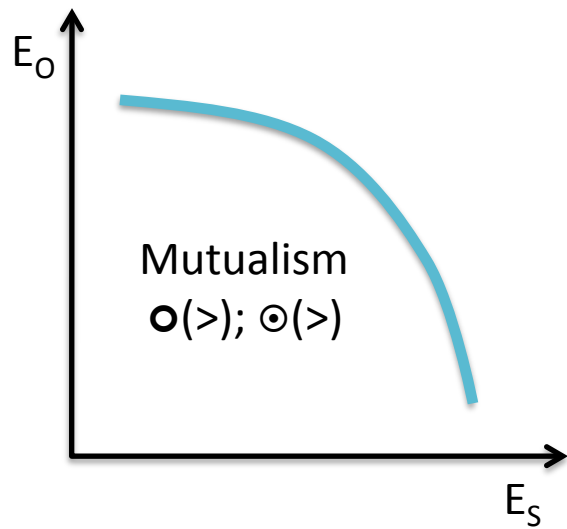
# Example Symbiotic Models III: Coevolutionary Relations

# Symbiotic Pareto Evolution (Eguchi *et al.* (2006))



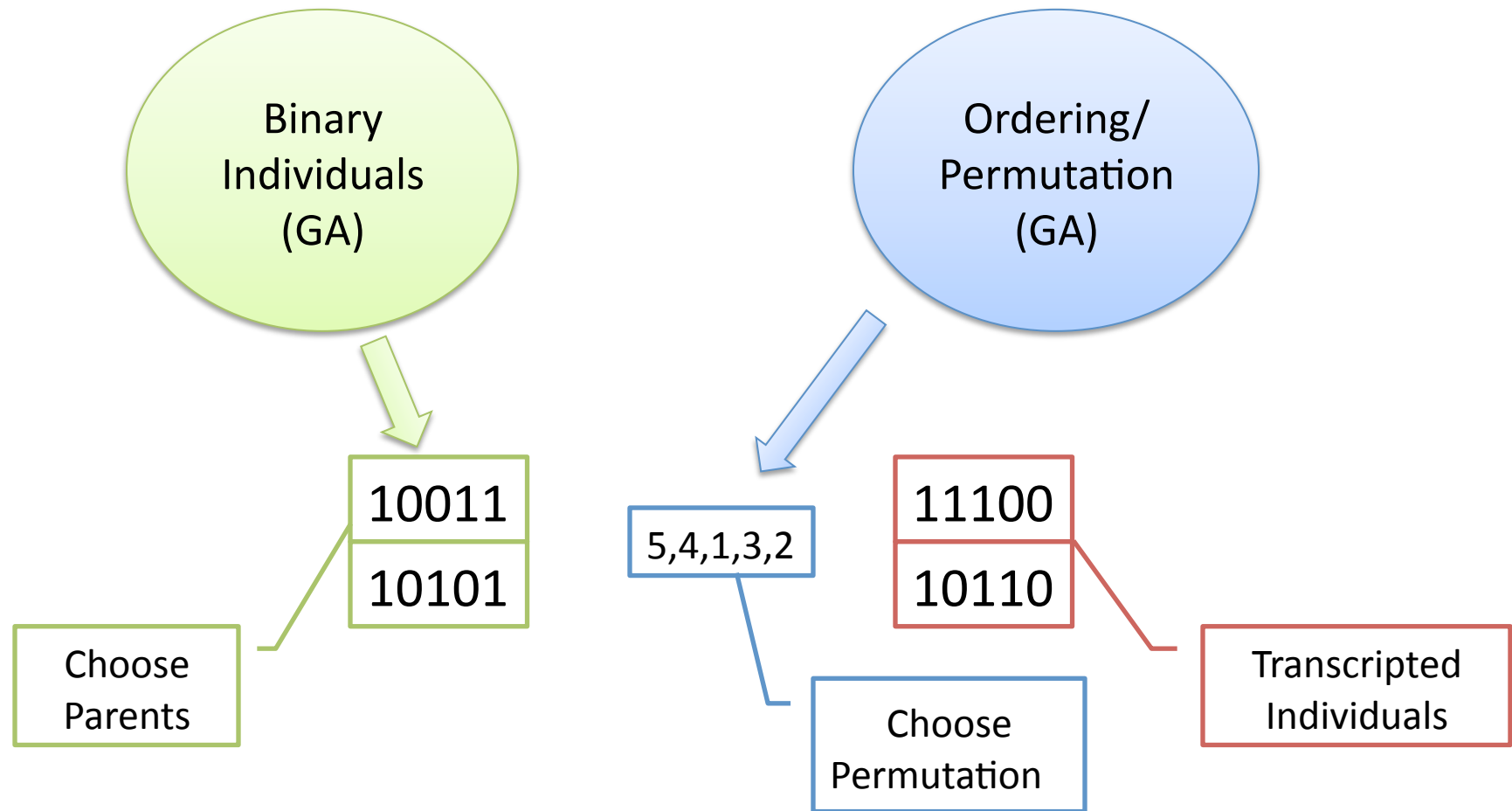
# Symbiotic Pareto Evolution

(Eguchi *et al.* (2006))

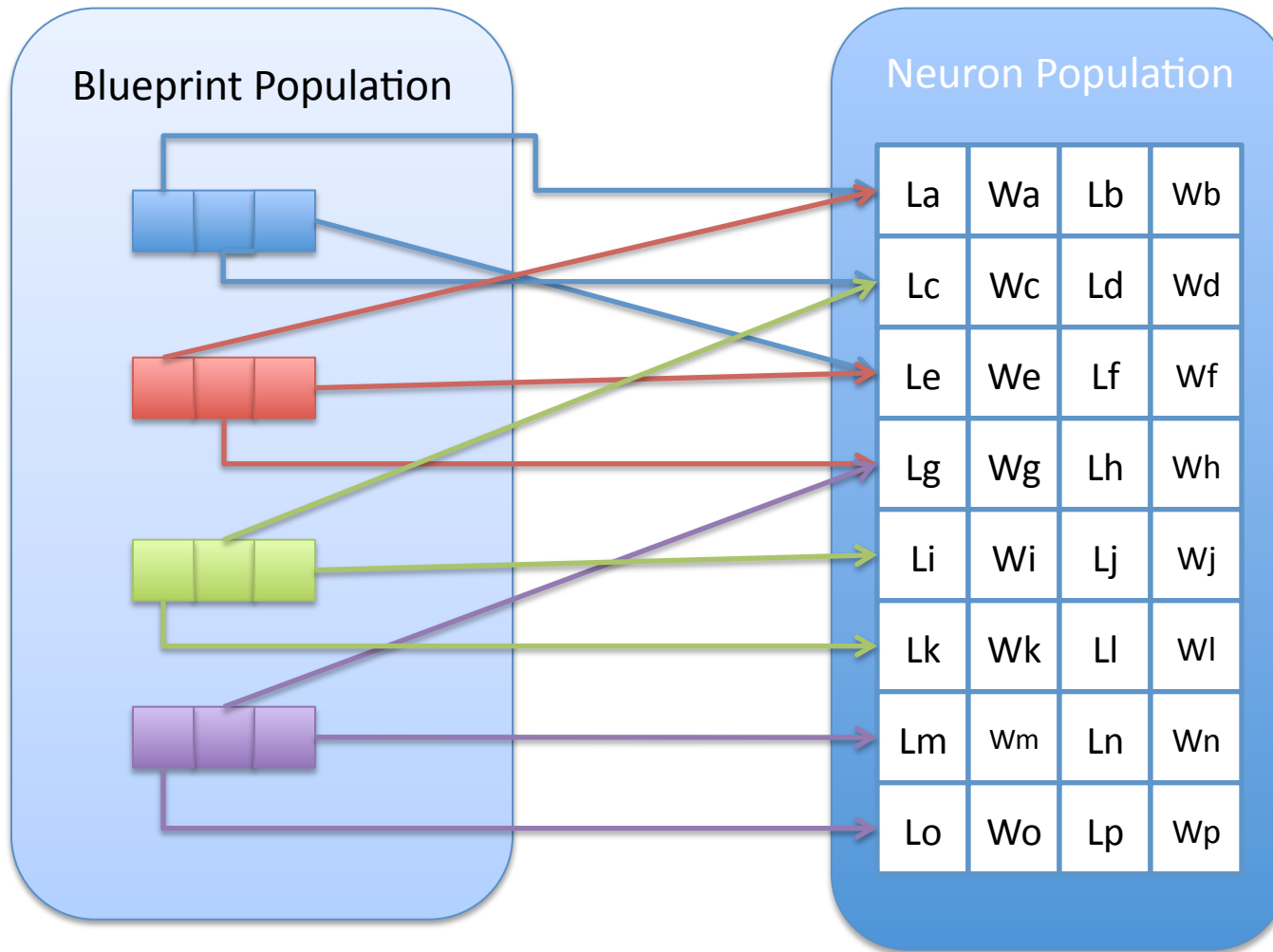


# Example Symbiotic Models IV: Metabolic Relations

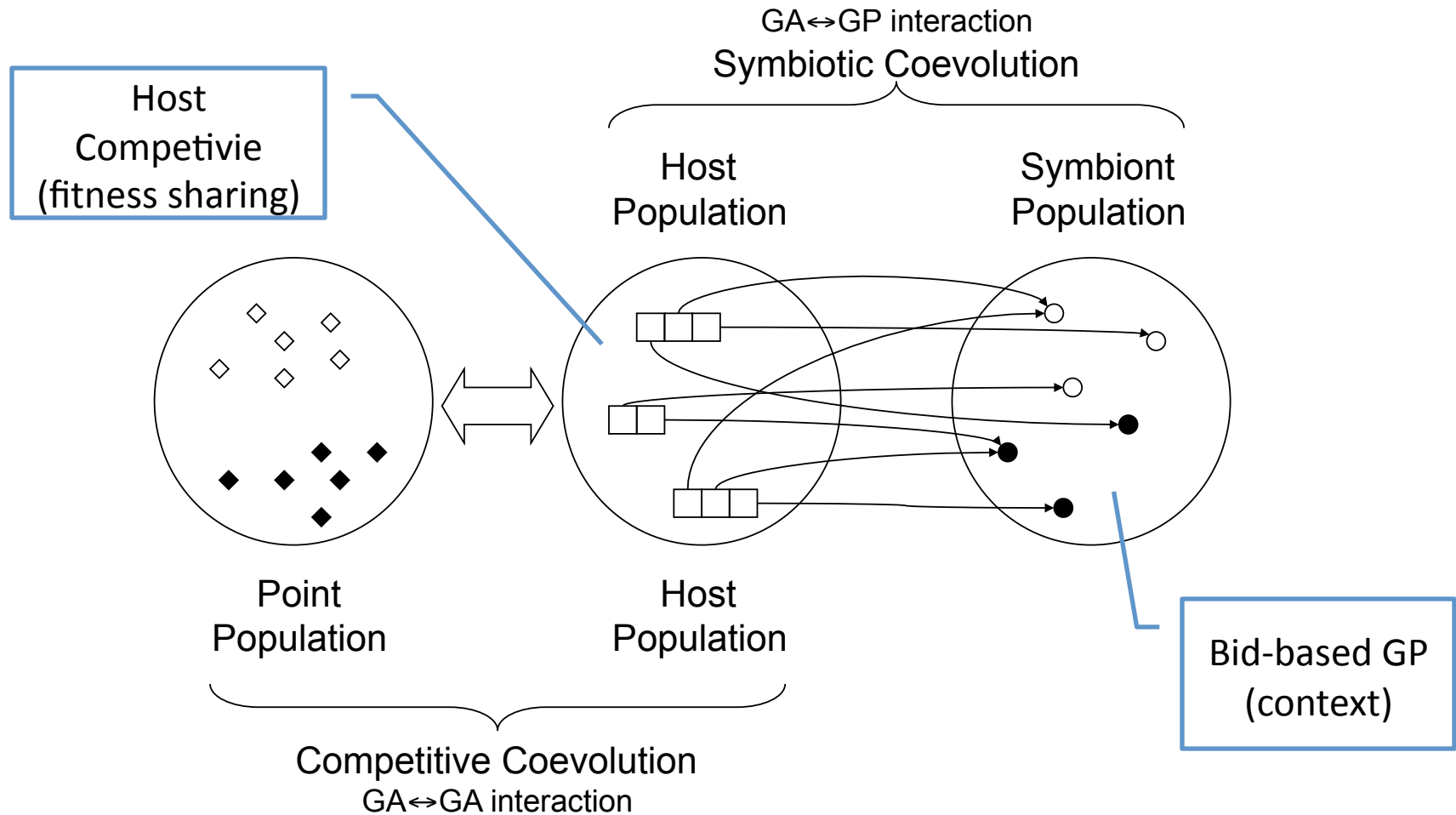
# Multi-Population – Genetic Algorithms: Paredis (1995)



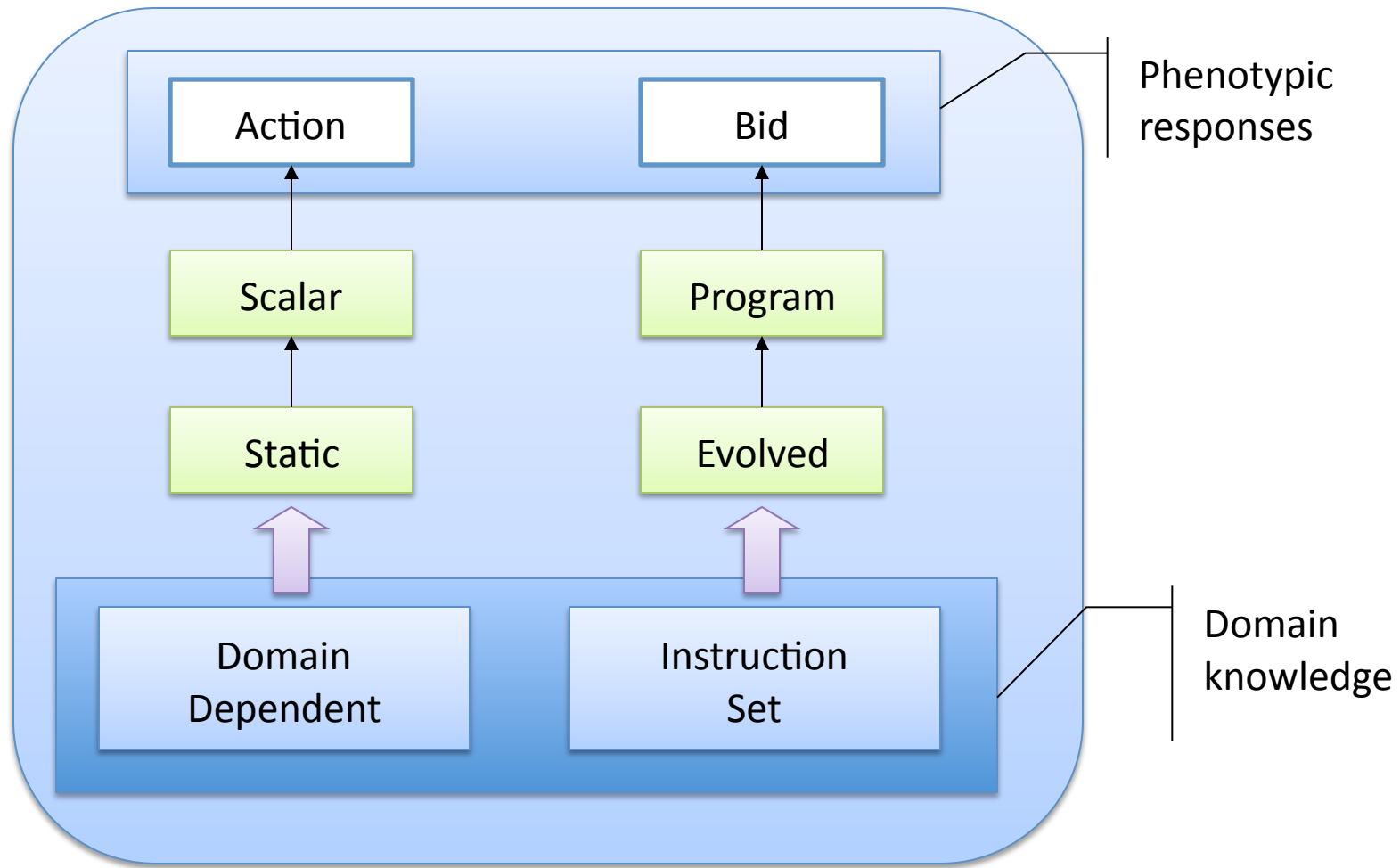
# Multi-Population – Neural Networks: Moriarty and Miikkulainen (1998)



# Metabolic/ Spatial – GP: Lichodziejewski and Heywood (2008)



# Achieving Context – Bid-based GP: Lichodziejewski and Heywood (2008)



# Other Developments

- **Learning Classifier Systems (Temporal)**
  - Bull and Fogarty (1996), Tomlinson and Bull (2005), Baghshah et al. (2007)
- **Host-Parasite Models (Spatial/ Genetic)**
  - Daida et al. (1995)
- **Fuzzy Systems (Coevolutionary/ Genetic)**
  - Hirasawa et al. (2000), Baghshah et al. (2007)
- **Artificial Life**

# Discussion

- **Context**
  - Gene alignment
  - Explicit signaling/ communication
- **Formulating fitness functions**
  - Evaluate fitness at host or the symbiont or both?
  - Mechanism Design
    - Pareto formulations often too brittle in practice
- **Layered Learning**
  - Build ‘complex’ behaviors from ‘simple’ behaviors
- **Contribution to other paradigms**
  - Evolutionary NNs in general
  - Teaming in GP

# References

- Malcolm Heywood and Peter Lichodziejewski (2010) *Symbiogenesis as a Mechanism for building complex adaptive systems: A review.* EvoCOMPLEX. LNCS 6024: 51-60
- Jason Daida et al. (1995) *Symbiogenesis and complex adaptive systems I: Implications of having symbiosis occur in nature.* Proc. of the Annual Conf. on Evolutionary Programming. 177-186.