

*Statistical Analysis of Networks*

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# Coevolution of Networks and Behavior

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# Learning Goals

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- ❖ Understand the logic of the coevolution model.
- ❖ Reasons for using coevolution model.
- ❖ Understand **network** and **behavior** configurations.



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# Introduction

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- ❖ Last week: How do networks change? (network dynamics)
- ❖ This week: a new question...
  - ❖ *How do networks **and** behavior coevolve?*



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# Interdependence

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- ❖ As we have seen, tie formation (i.e. network dynamics) can depend on behavior.
- ❖ Examples:
  - ❖ Homophily (Ego has a preference for being tied to alters with similar / same attribute values)
  - ❖ Receiver & Sender Effects (Ego has a preference for sending ties to those with a particular attribute)



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# Interdependence

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- ❖ However, *behavior* can depend on network properties.
- ❖ Examples:
  - ❖ Assimilation / Contagion (adopting attitudes of those around you)
  - ❖ Isolation (those with no friends may become depressed)



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# Separating Mechanisms

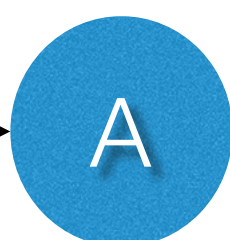
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- ❖ As a consequence, we are trying to separate the mechanisms that generate the networks we observe.
- ❖ Example:
  - ❖ Delinquent individuals **select** delinquent friends.
  - ❖ *Or*, individuals engage in delinquency if their friends do.
  - ❖ In the cross-section, we cannot determine which mechanism is correct (could be either or both).

Say we observe these two  
cross-sections



$t$

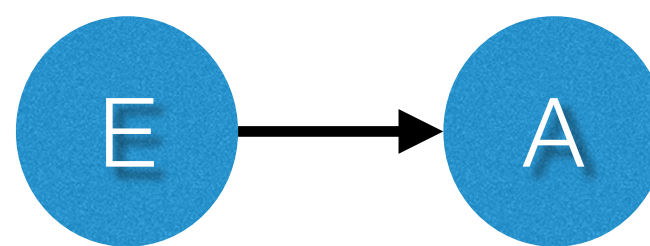


$t + 1$

Say we observe these two  
cross-sections



$t$

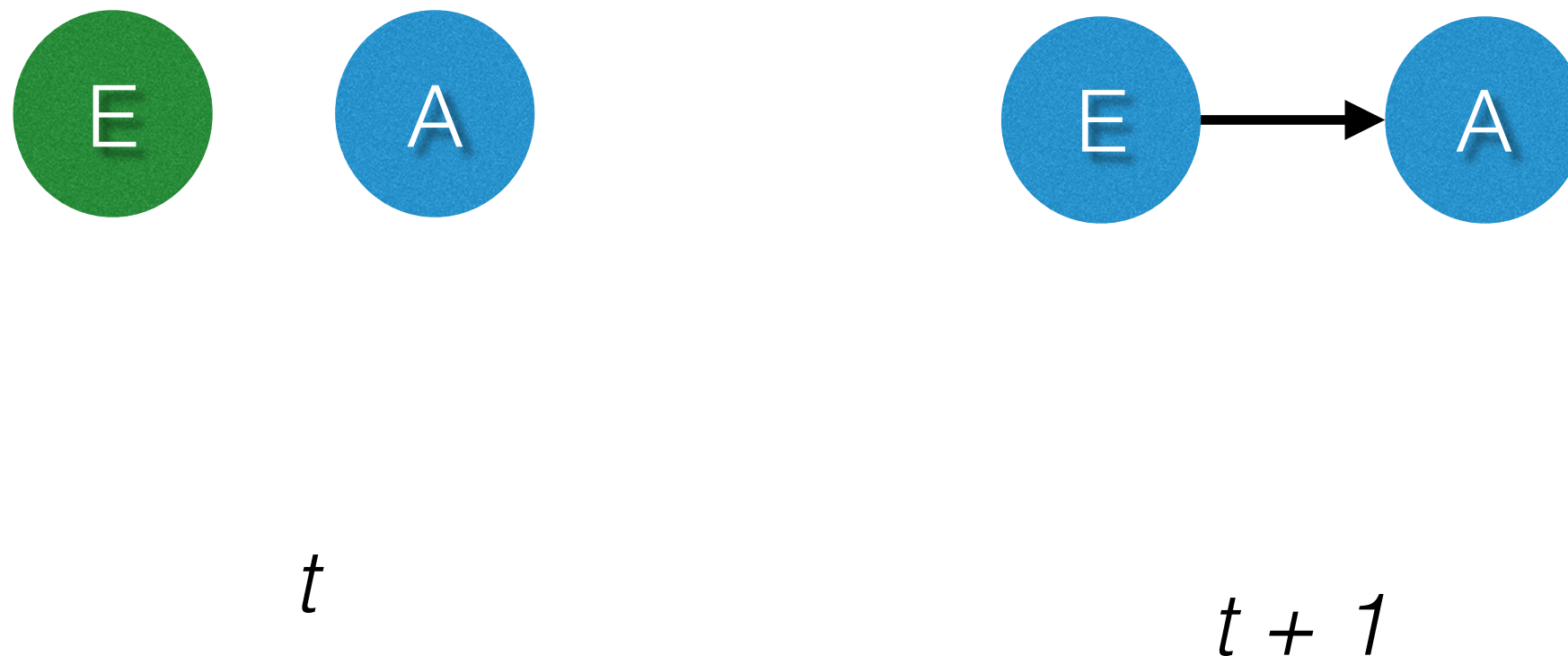


$t + 1$

At time  $t$ , **ego** is a different  
“type” or attribute value than  
**alter** and is not connected to  
**alter**.



Say we observe these two  
cross-sections



At time  $t + 1$ , **ego** is the same  
“type” or attribute value as **alter**  
and is connected to **alter**.

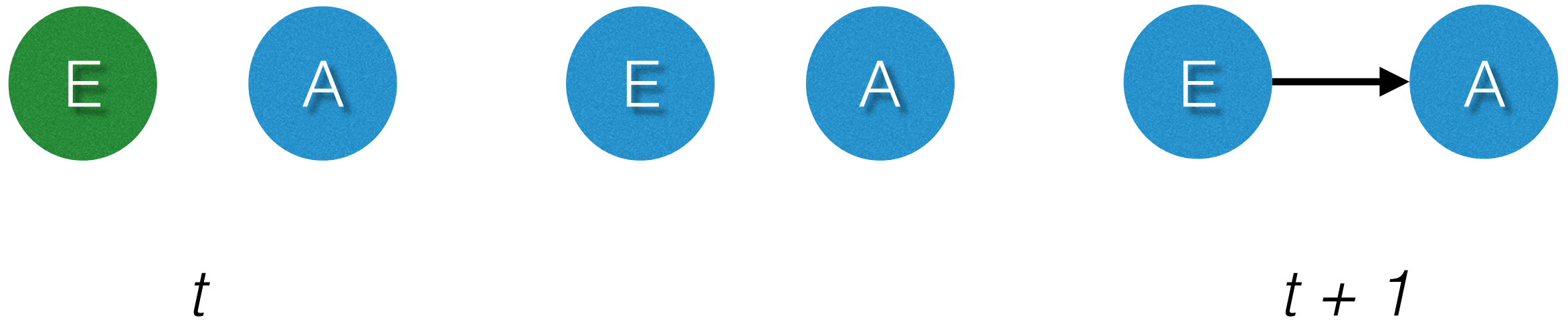


Say we observe these two  
cross-sections



Let's think about the ways that this  
could have occurred (i.e. micro-steps).





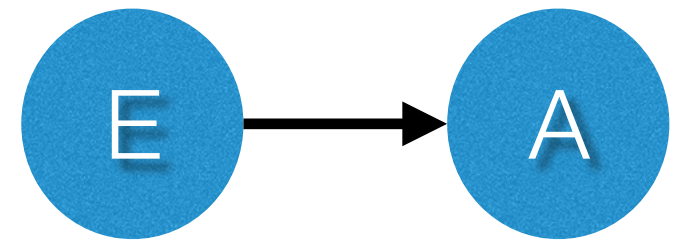
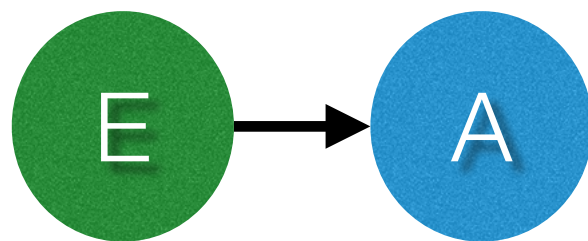
Ego changes his behavior, **then**  
befriends alter.



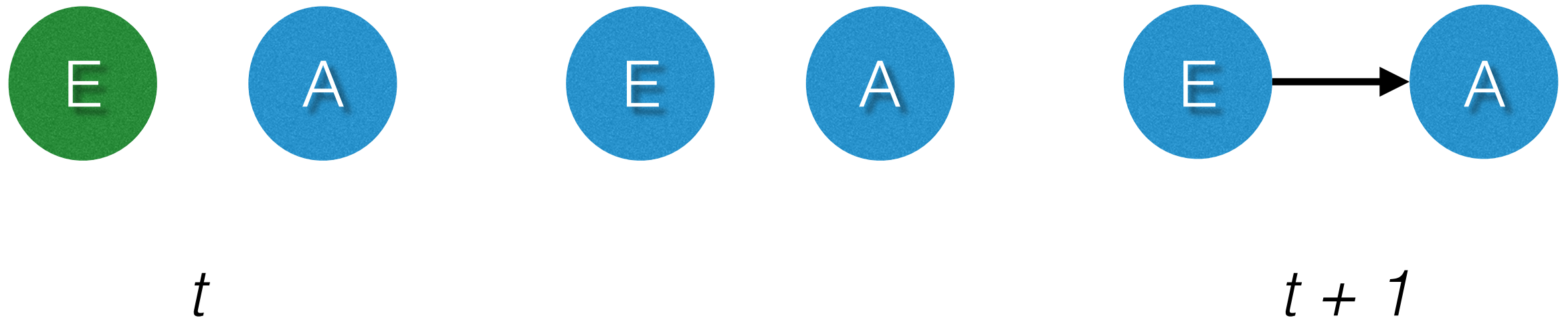
Ego befriends alter, **then** changes his behavior.



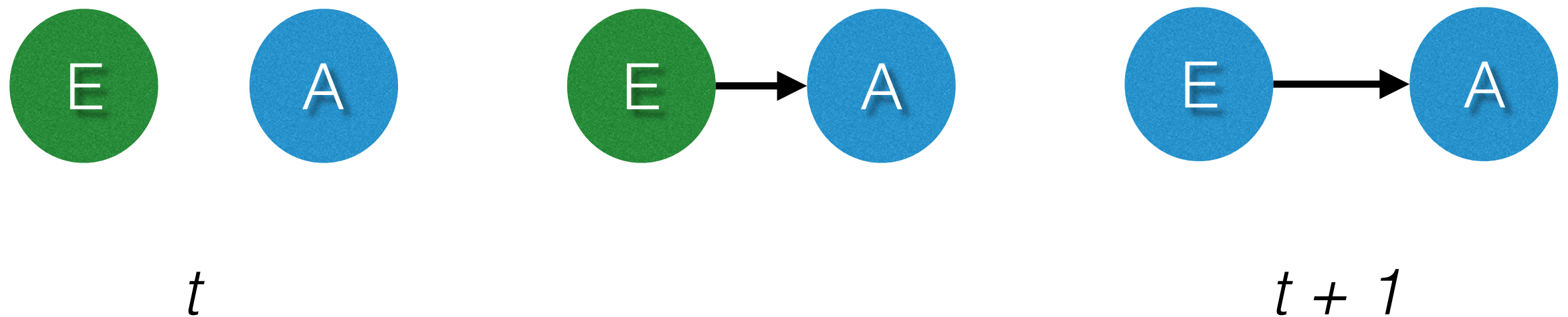
$t$



$t + 1$



We would like a model that shows the coevolution of both the network and behavior.





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# Separating Mechanisms

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- ❖ The basic problem is trying to determine whether the observed network is a consequence of:
  - ❖ The network leading to behavioral alignment
  - ❖ Actors' behavior leading to network alignment
    - ❖ Coevolution models aim to construct a model that can tease these apart.



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# Stochastic Actor-Based Models

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- ❖ We can extend the SABM logic to a behavioral domain.
- ❖ Now, actors control:
  - ❖ Their ties
  - ❖ Their behavior



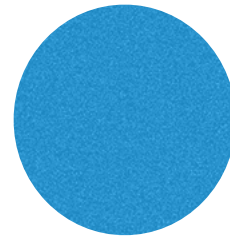
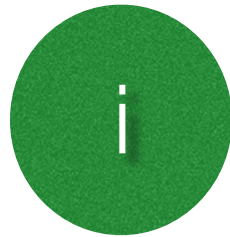
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# Stochastic Actor-Based Models

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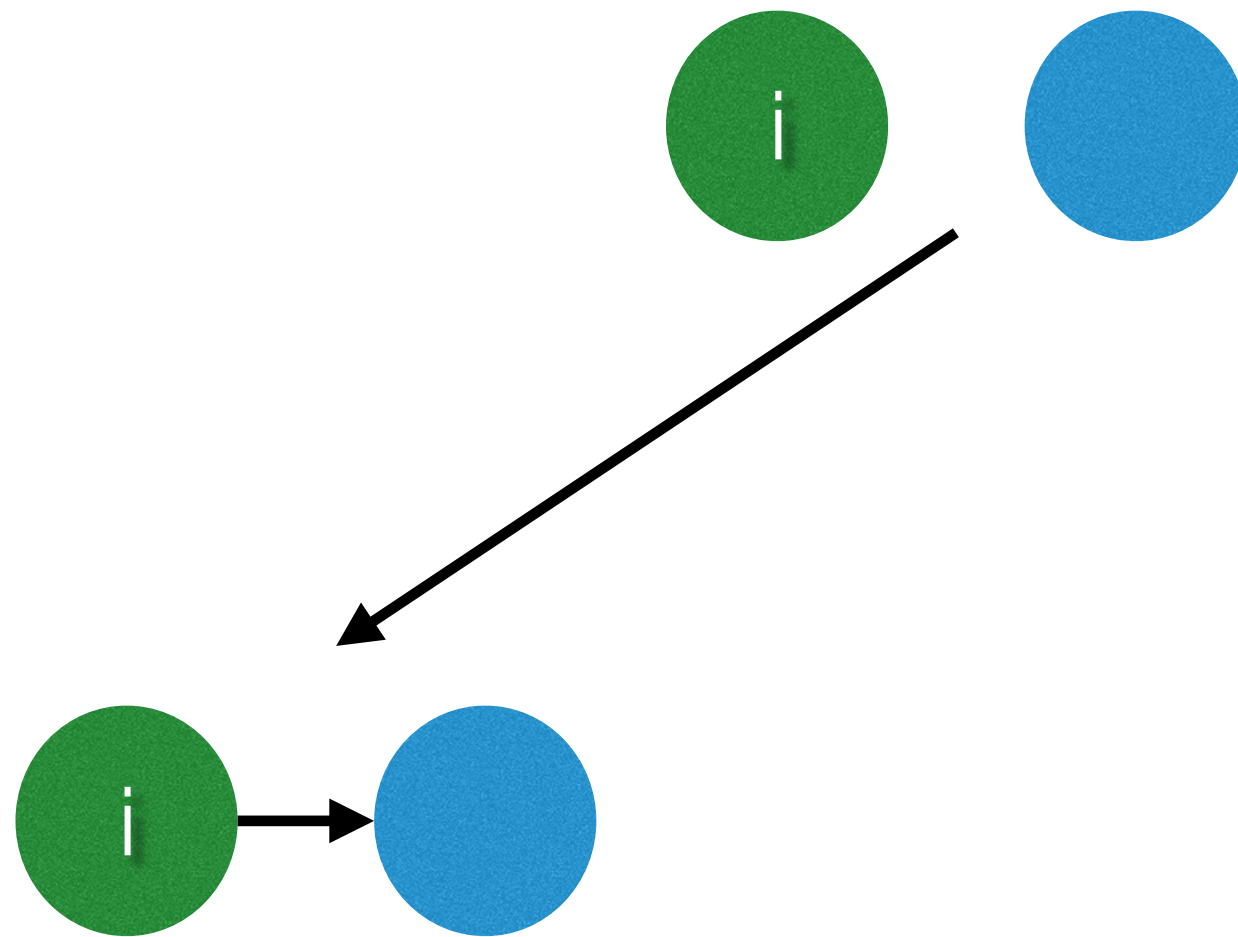
- ❖ We simply extend the functions to include behavior:
  - ❖ **Rate** functions for the network *and* for behavior.
    - ❖ How frequently are individuals changing ties?  
Their behavior?
  - ❖ **Objective** functions for the network and behavior.
    - ❖ What are actors' preferences for their ties? Their behavior?

What can *i* do?



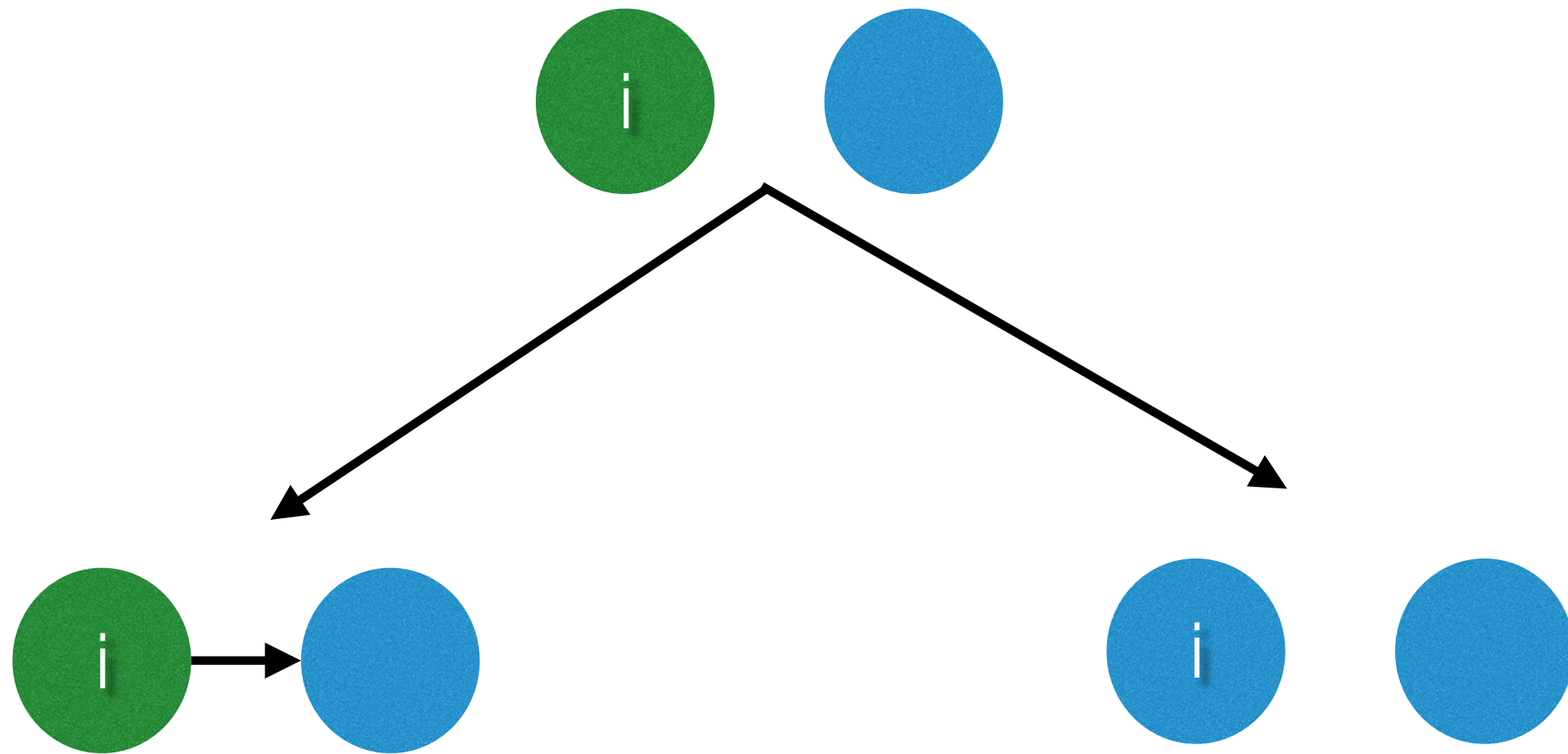


What can  $i$  do?



Change network  
(*network objective function*)

What can  $i$  do?

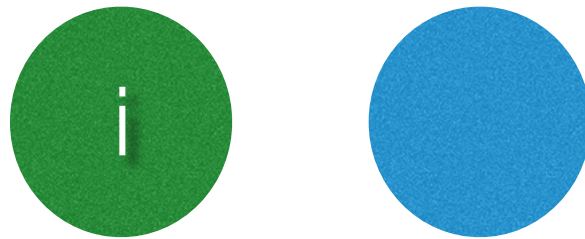


Change network  
(*network objective function*)

Change behavior  
(*behavior objective function*)



What can  $i$  do?



Not making any changes  
(*behavior and network rate functions*)

is still an option as well

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# Objective Function

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- ❖ As before, we want to specify the configurations.
- ❖ But, what is different is that in addition to **network** configurations, we are going to specify **behavioral** configurations.



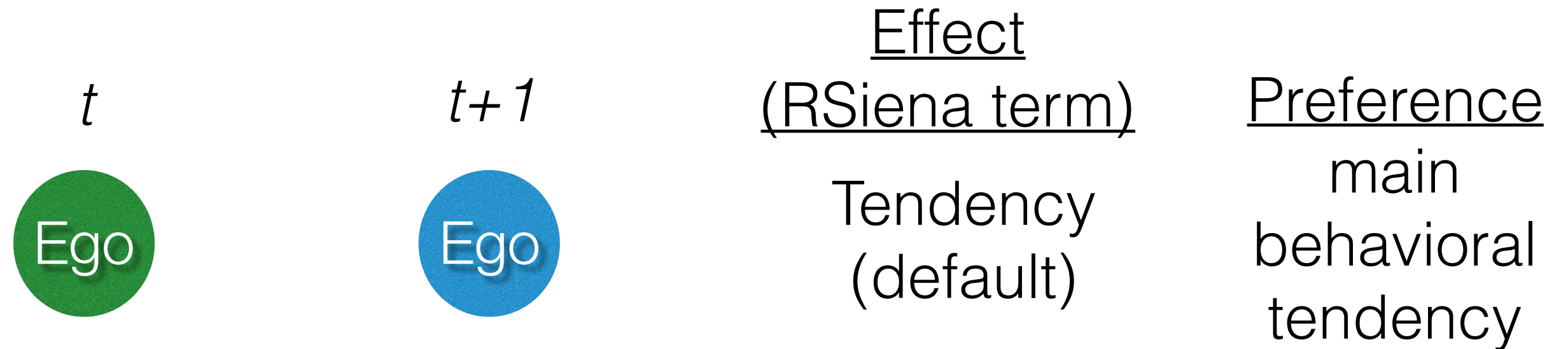
# Basic Effects

		<u>Effect</u>	
$t$	$t+1$	<u>(RSiena term)</u>	<u>Preference</u>

# Basic Effects

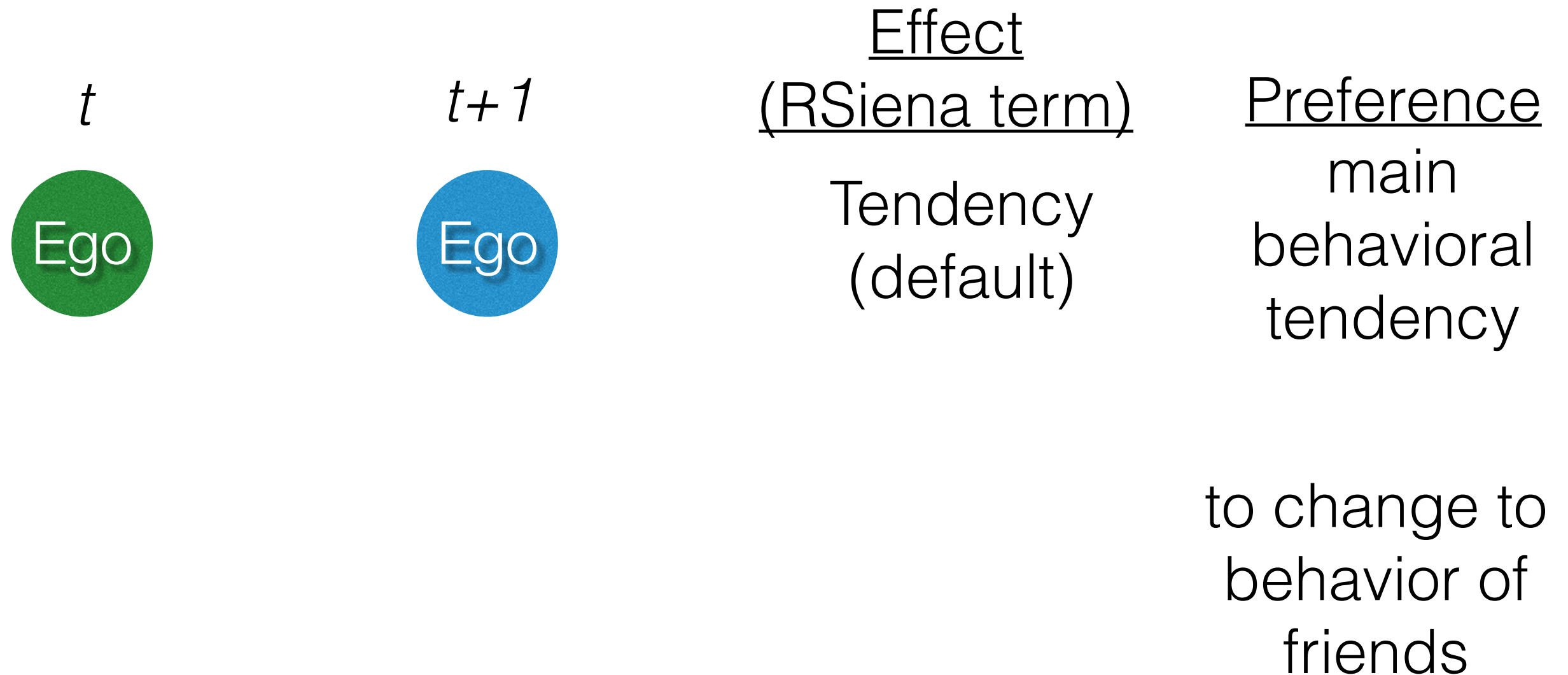
		<u>Effect</u> <u>(RSiena term)</u>	<u>Preference</u> main behavioral tendency
$t$	$t+1$		

# Basic Effects





# Basic Effects



# Basic Effects

$t$



$t+1$

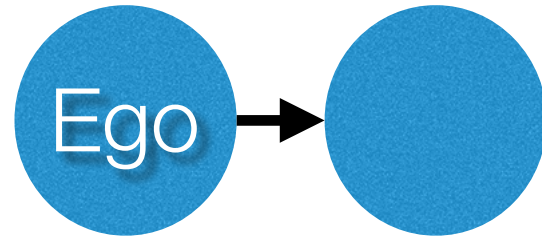
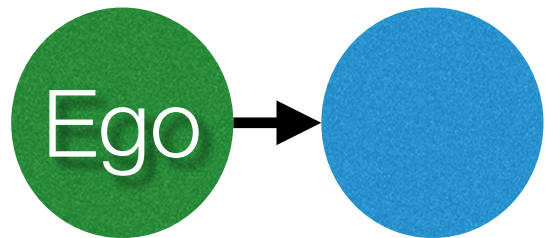


Effect  
(RSiena term)

Tendency  
(default)

Preference

main  
behavioral  
tendency



Similarity  
(avSim or totSim)

to change to  
behavior of  
friends



# Basic Effects

$t$



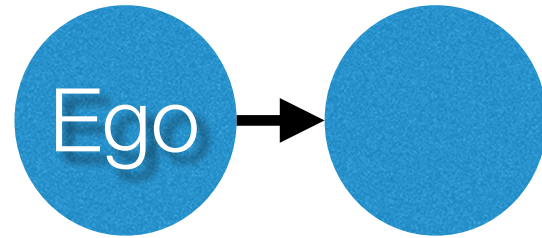
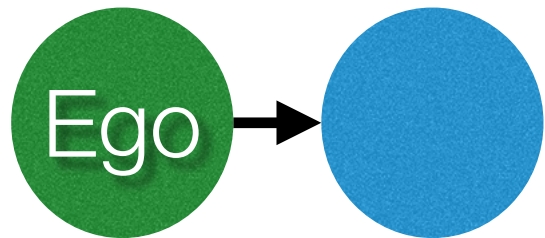
$t+1$



Effect  
(RSiena term)

Tendency  
(default)

Preference  
main  
behavioral  
tendency

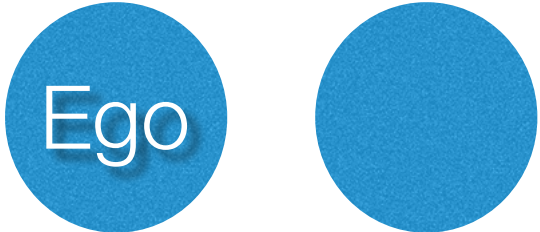
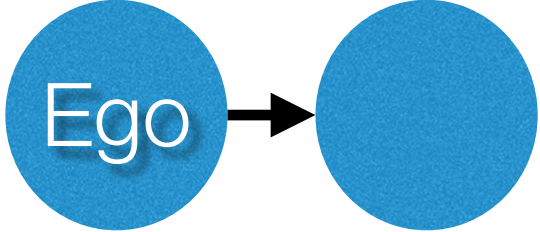
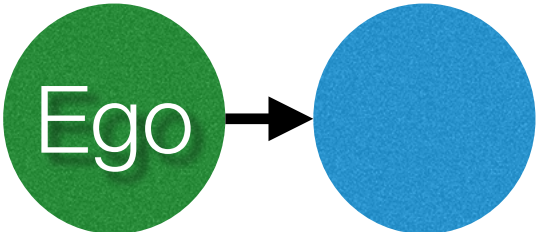
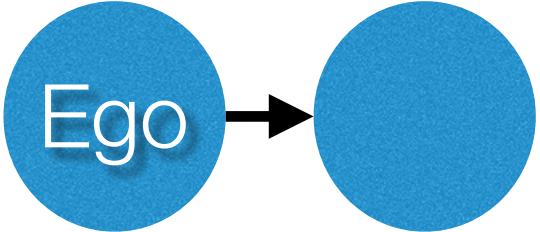


Similarity  
(avSim or totSim)

to change to  
behavior of  
friends

Note the difference from SameX or SimX

# Basic Effects

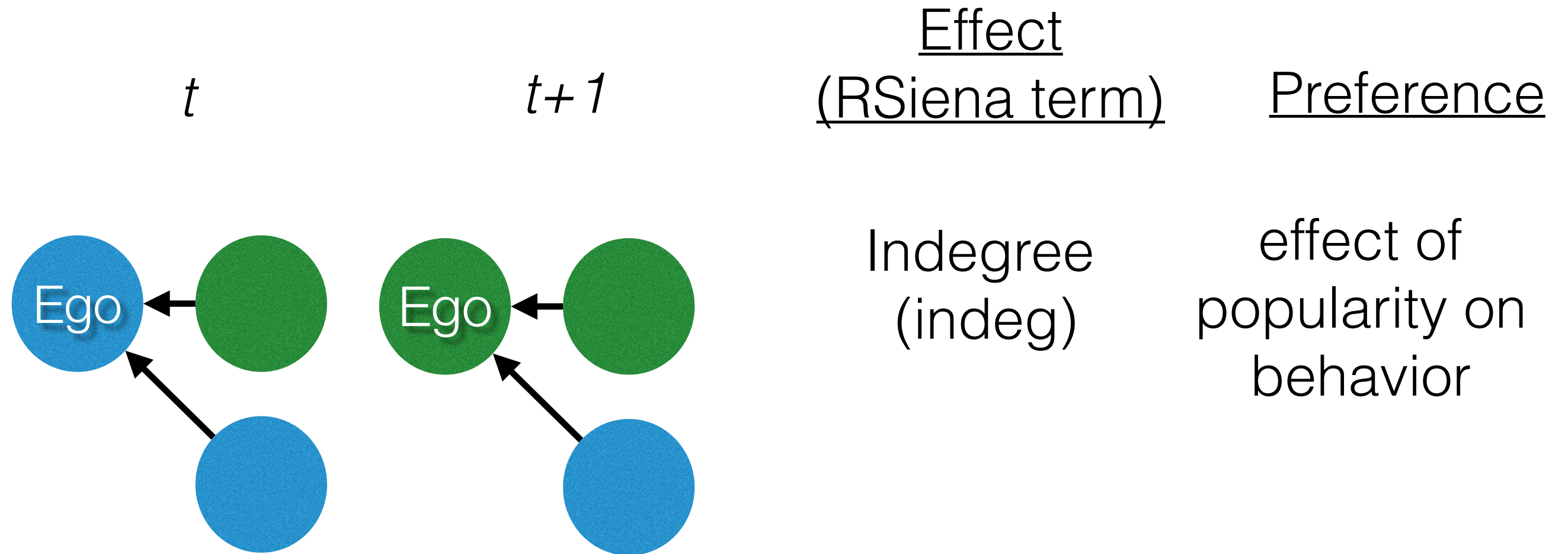
$t$	$t+1$	<u>Effect</u> (RSiena term)	<u>Preference</u>
		Similarity (sameX or simX)	for ties to similar alters
		Similarity (avSim or totSim)	to change to behavior of friends



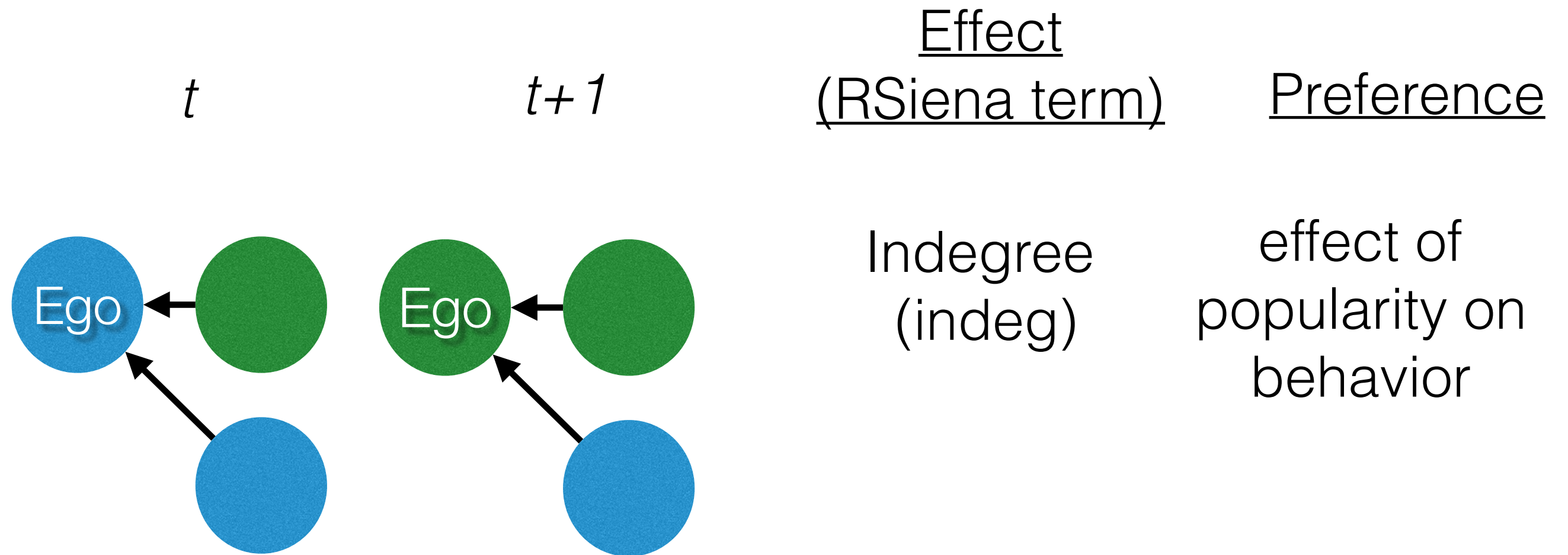
# Interactions w/ Covariates

$t$	$t+1$	<u>Effect</u> <u>(RSiena term)</u>	<u>Preference</u>
			effect of popularity on behavior

# Interactions w/ Covariates



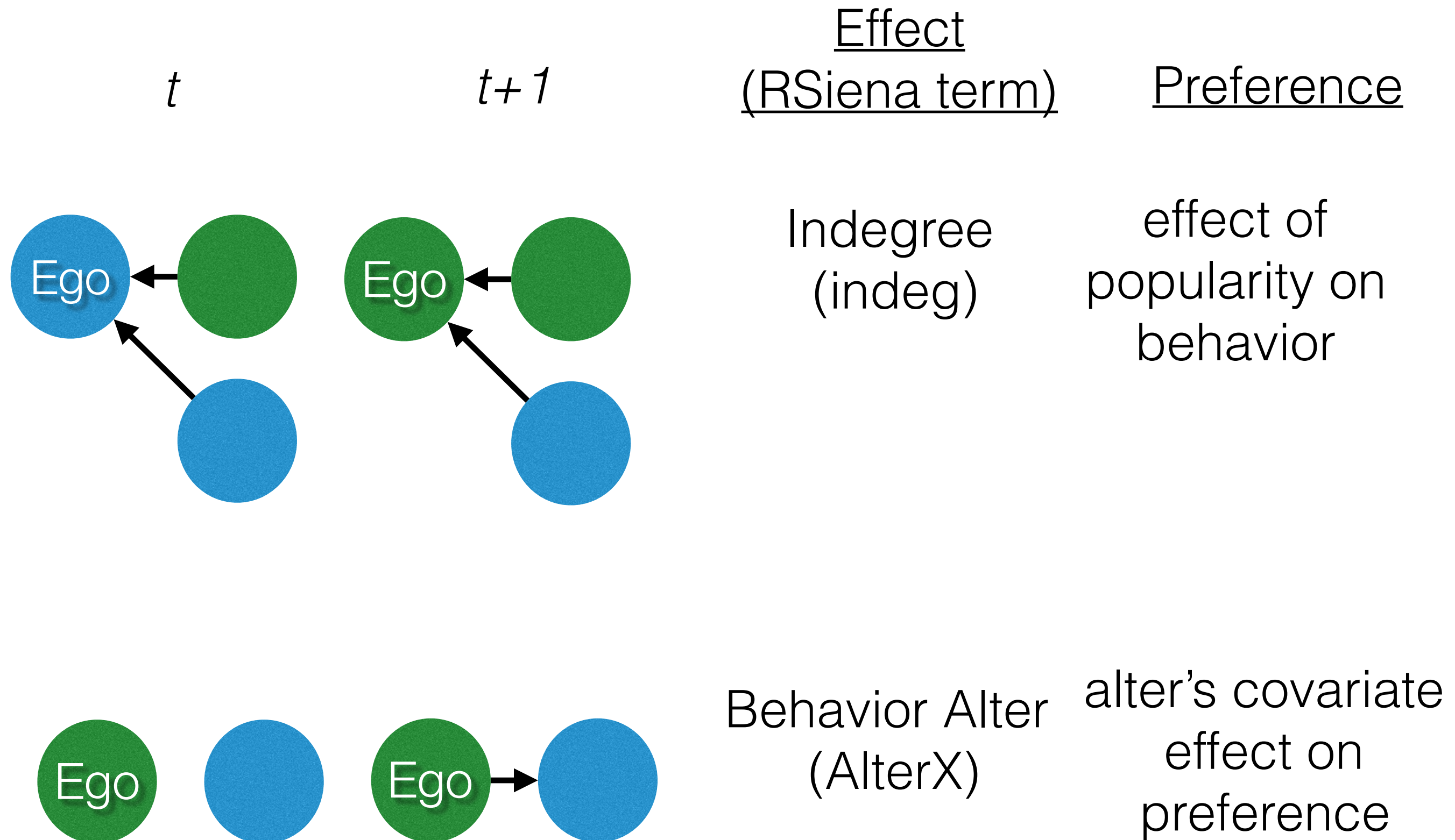
# Interactions w/ Covariates



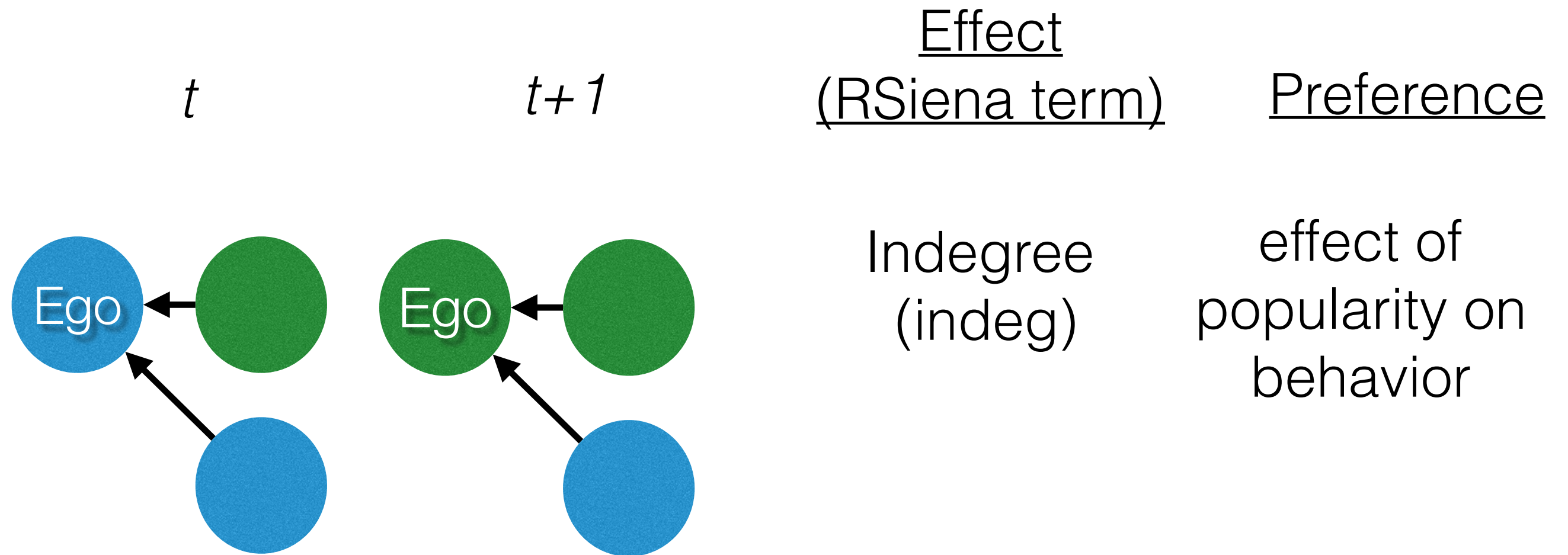
Note the difference from AlterX



# Interactions w/ Covariates



# Interactions w/ Covariates



# Interactions w/ Covariates

$t$

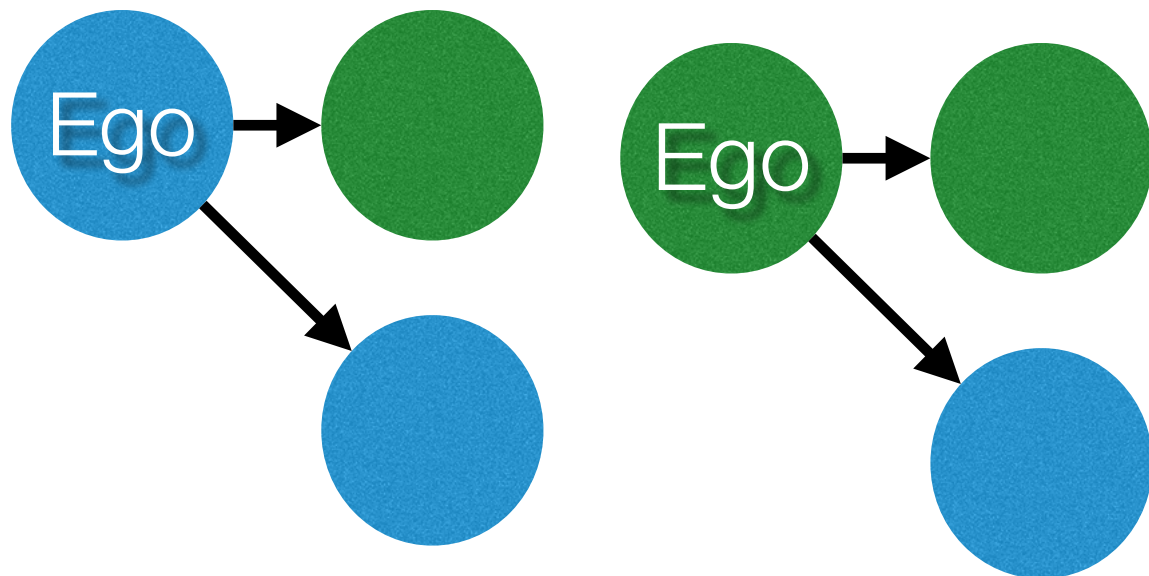
$t+1$

Effect  
(RSiena term)

Preference

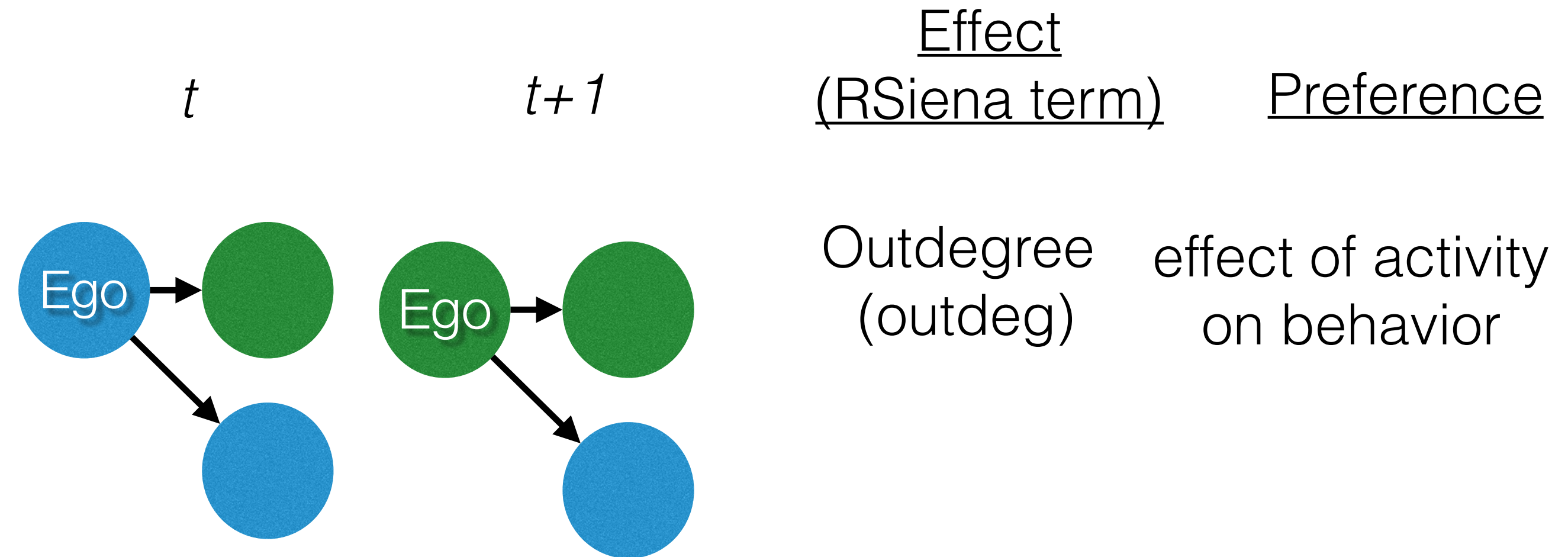
Outdegree  
(outdeg)

effect of activity  
on behavior



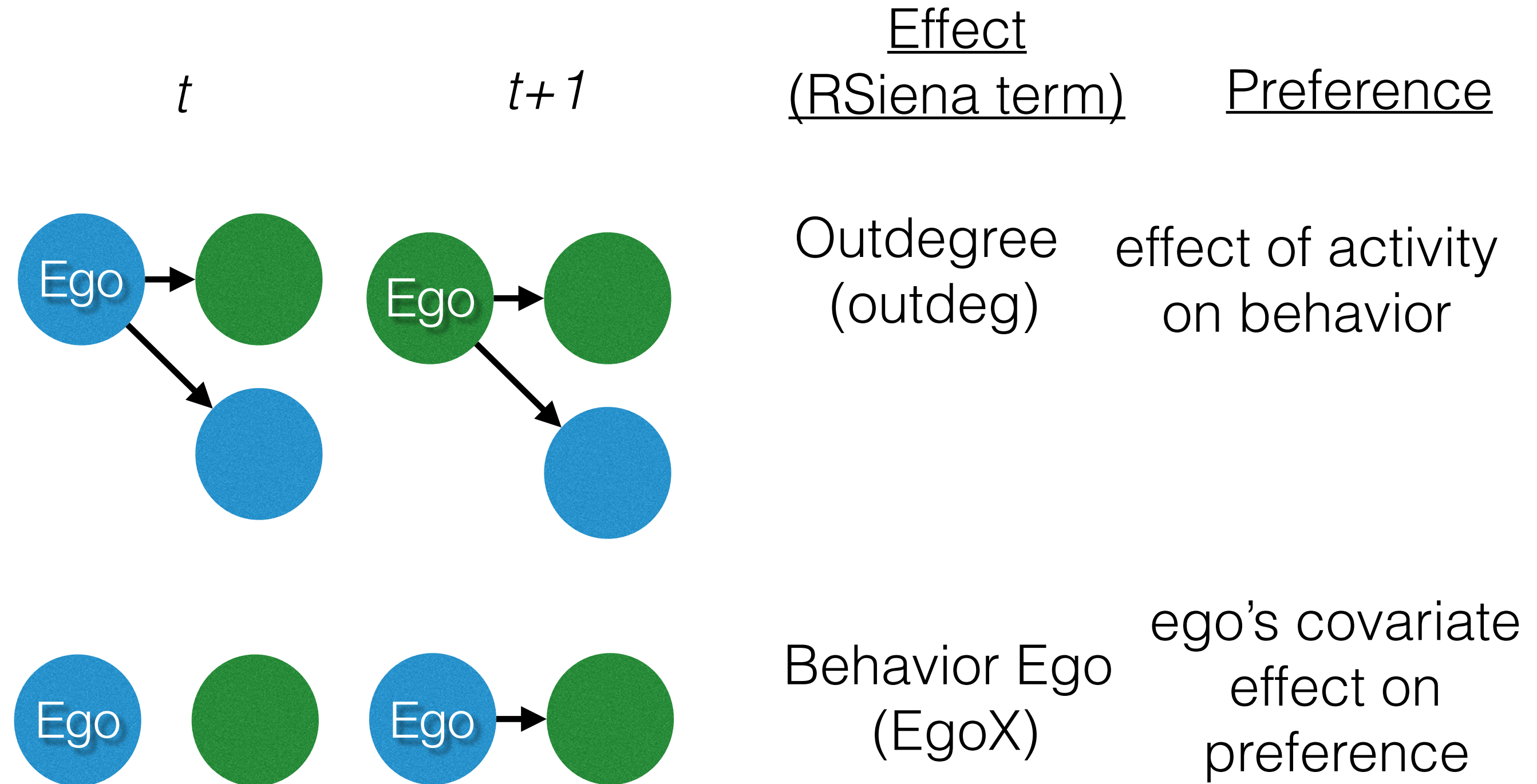


# Interactions w/ Covariates



Note the difference from EgoX

# Interactions w/ Covariates



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# Learning Goals

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- ❖ Understand the logic of the coevolution model.
- ❖ Reasons for using coevolution model.
- ❖ Understand **network** and **behavior** configurations.



Questions?