



REAL LIFE GAMES:  
HOW GAME THEORY SHAPES HUMAN  
DECISIONS

# THE GAME THEORY OF COOPERATION

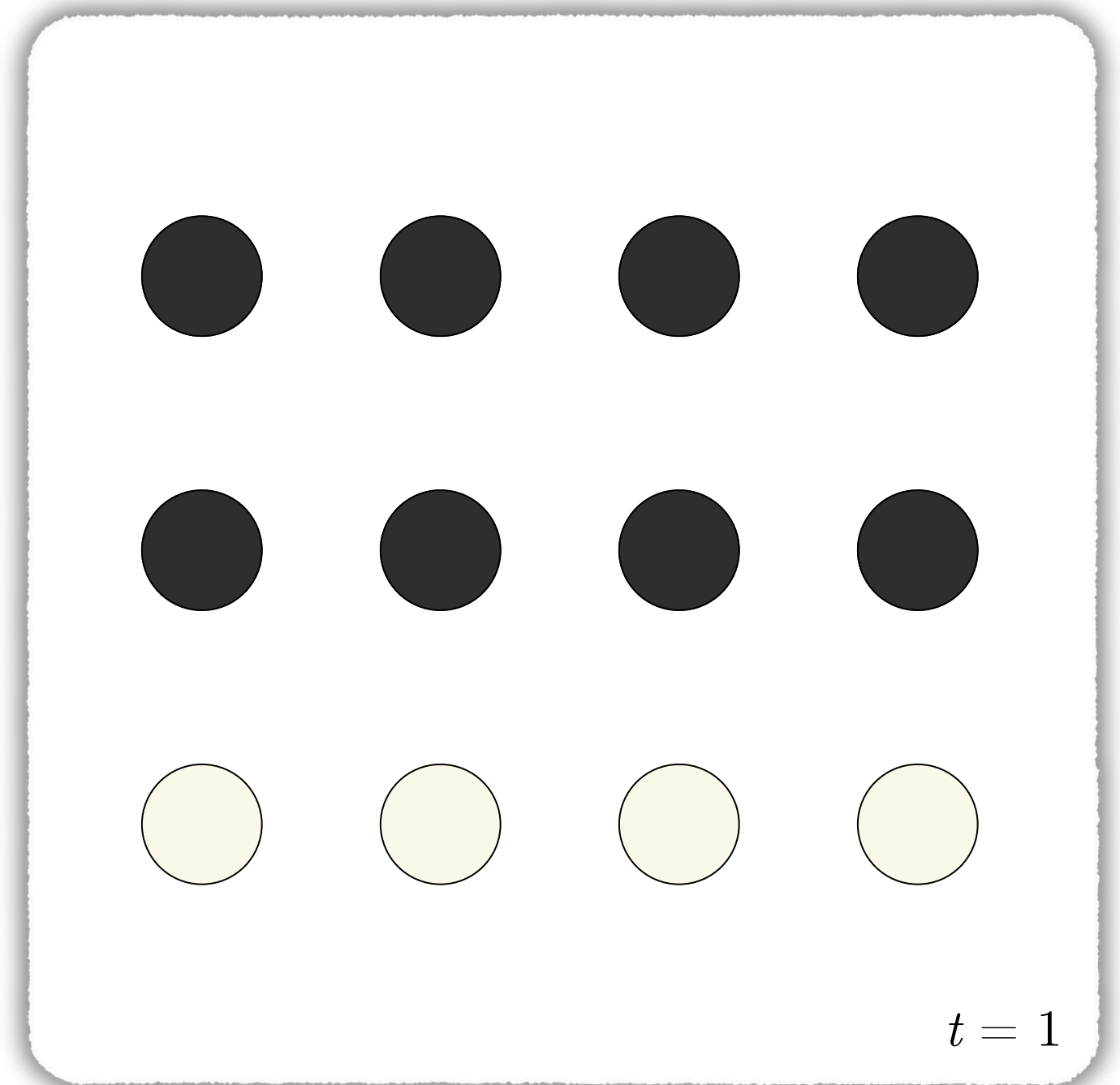
KIN SELECTION & BEYOND

Adrian Haret  
a.haret@lmu.de

We've talked about mixed strategies as one player randomizing between their actions...

# MIXED STRATEGIES AS ACTION FREQUENCIES

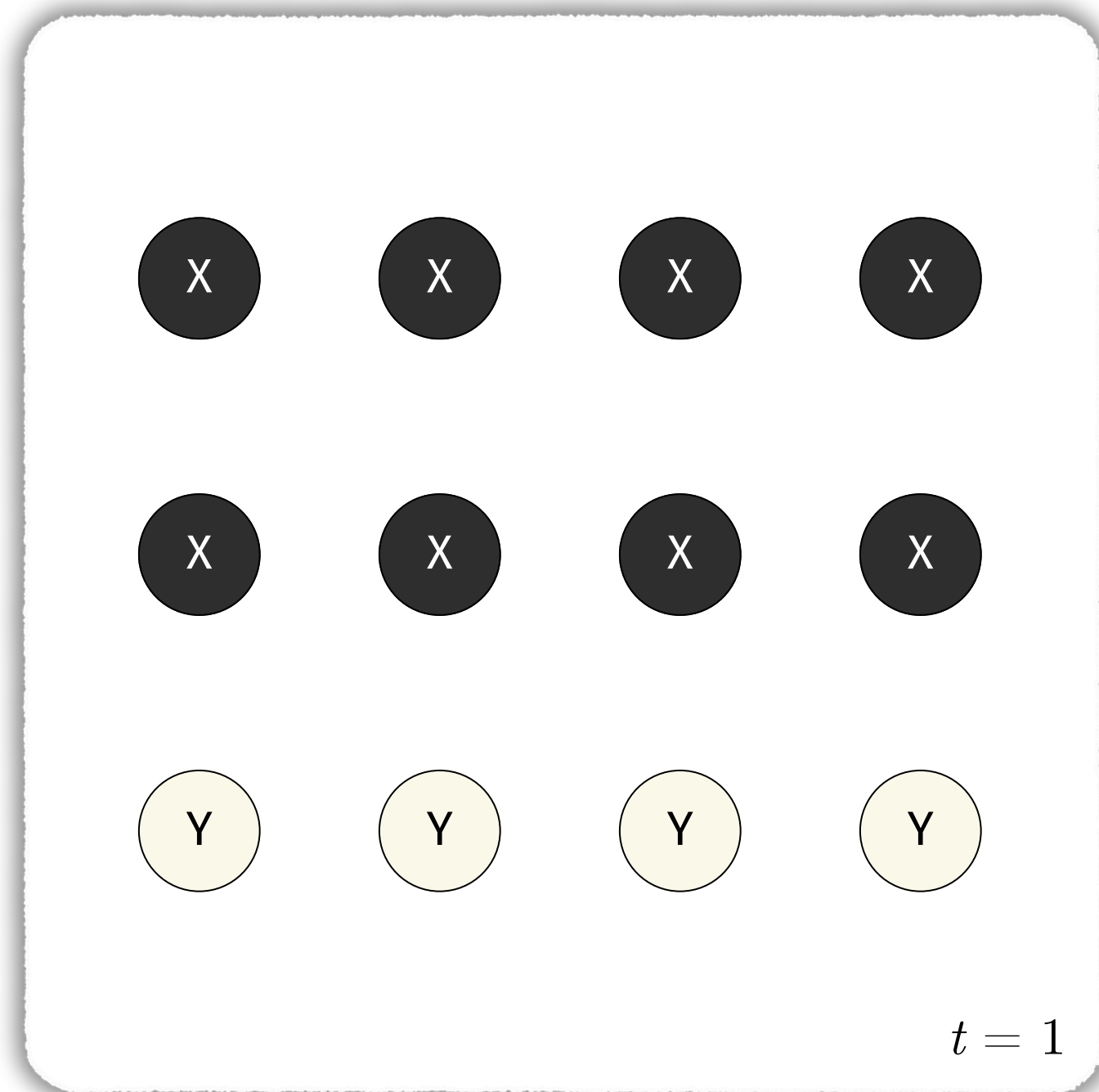
Take a strategy that plays action X with probability  $\frac{2}{3}$  and action Y with probability  $\frac{1}{3}$ .



# MIXED STRATEGIES AS ACTION FREQUENCIES

Take a strategy that plays action X with probability  $\frac{2}{3}$  and action Y with probability  $\frac{1}{3}$ .

We can interpret this as a population in which  $\frac{2}{3}$  of the agents play X, and the rest play Y.

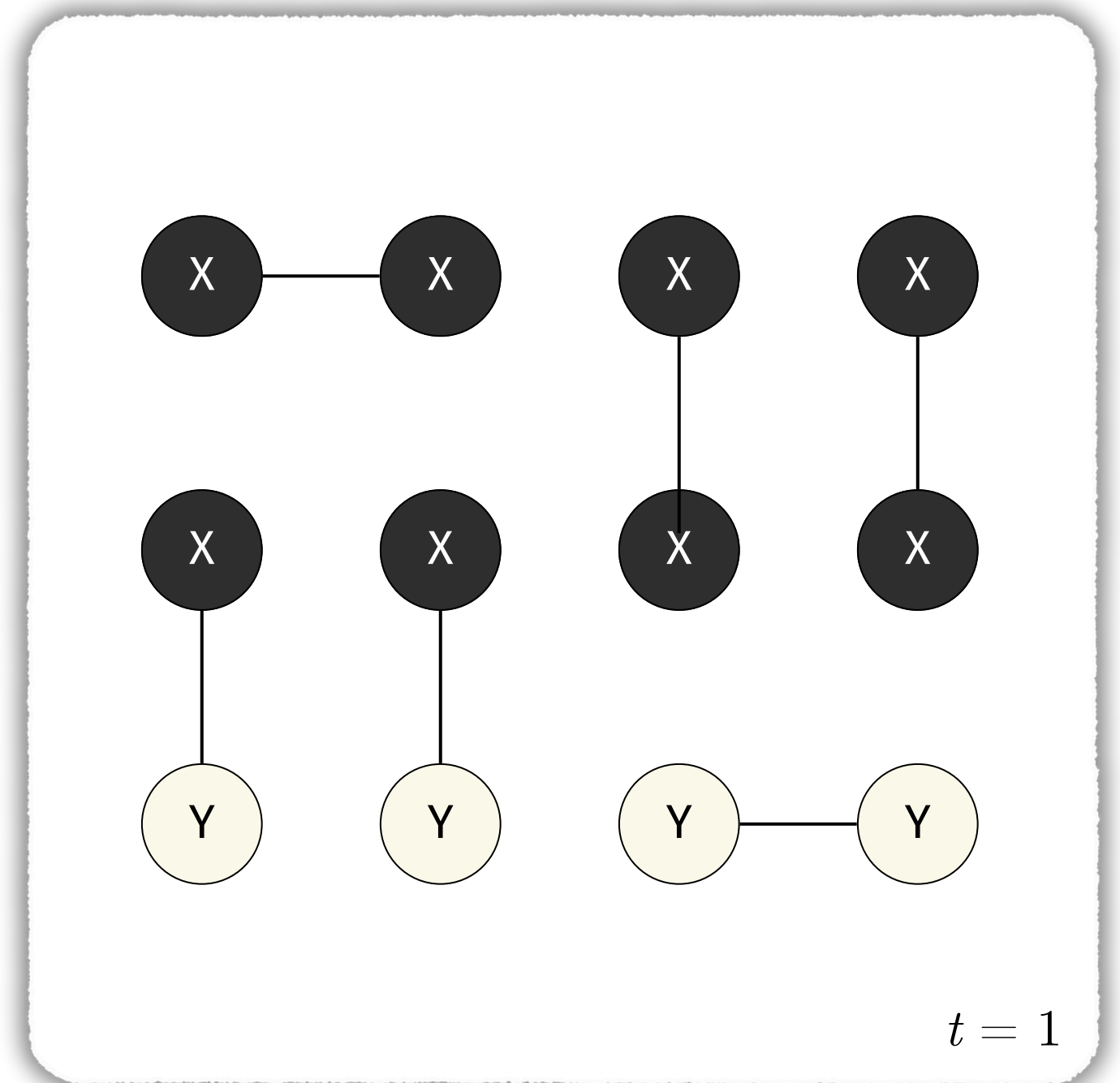


# MIXED STRATEGIES AS ACTION FREQUENCIES

Take a strategy that plays action X with probability  $\frac{2}{3}$  and action Y with probability  $\frac{1}{3}$ .

We can interpret this as a population in which  $\frac{2}{3}$  of the agents play X, and the rest play Y.

Players are paired at random, and play a game.



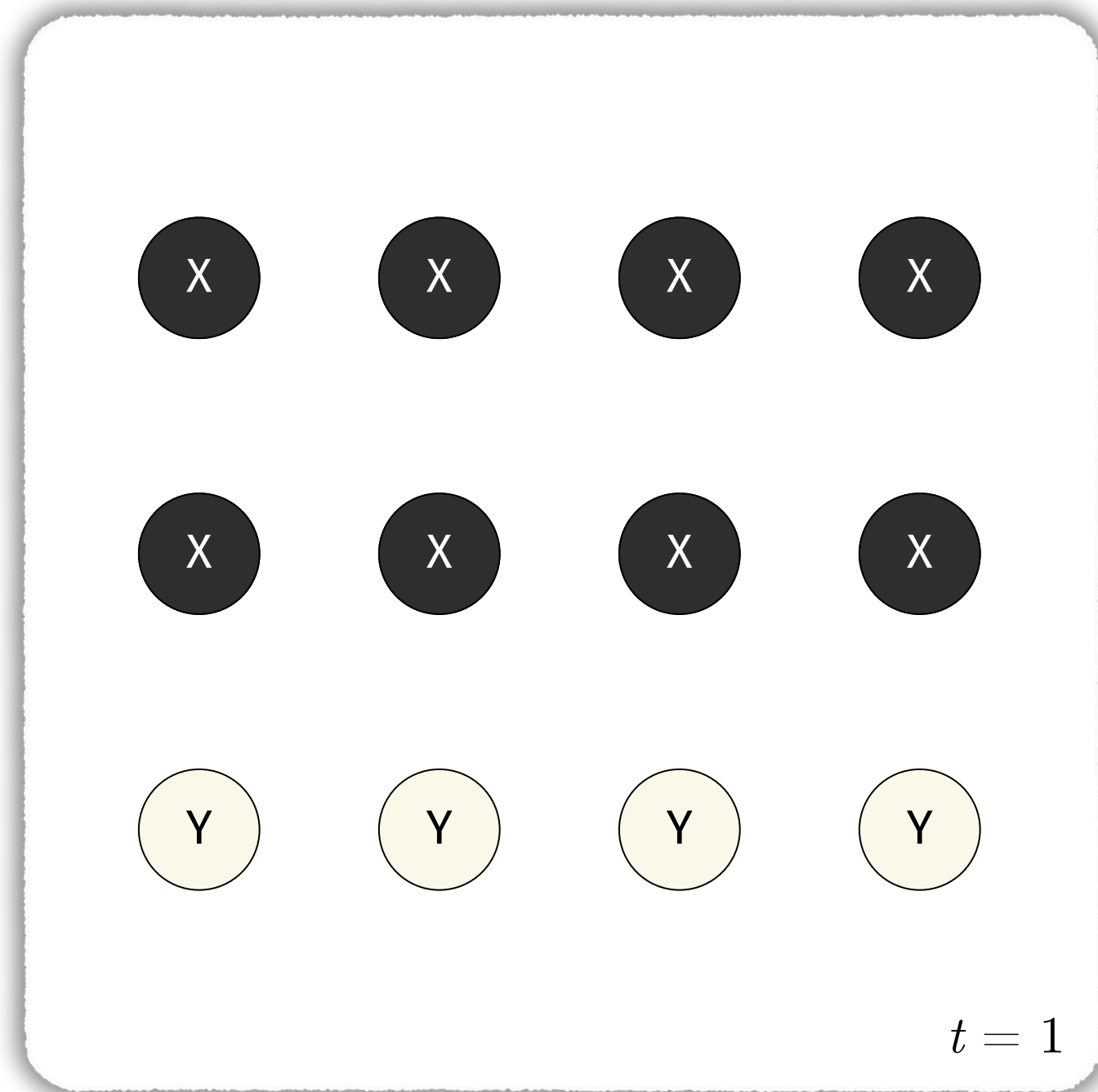
# MIXED STRATEGIES AS ACTION FREQUENCIES

Take a strategy that plays action X with probability  $\frac{2}{3}$  and action Y with probability  $\frac{1}{3}$ .

We can interpret this as a population in which  $\frac{2}{3}$  of the agents play X, and the rest play Y.

Players are paired at random, and play a game.

The payoffs are seen as points that determine the players' fates in the next round.





JOHN MAYNARD-SMITH

Paradoxically, it has turned out that game theory is more readily applied to biology than to the field of economic behaviour for which it was originally designed.

Smith, J. M. (1982). *Evolution and the Theory of Games*. Cambridge University Press.



JOHN MAYNARD-SMITH

Paradoxically, it has turned out that game theory is more readily applied to biology than to the field of economic behaviour for which it was originally designed.

In biology, Darwinian fitness provides a natural [...] scale [for utility].

Smith, J. M. (1982). *Evolution and the Theory of Games*. Cambridge University Press.



JOHN MAYNARD-SMITH

Paradoxically, it has turned out that game theory is more readily applied to biology than to the field of economic behaviour for which it was originally designed.

In biology, Darwinian fitness provides a natural [...] scale [for utility].

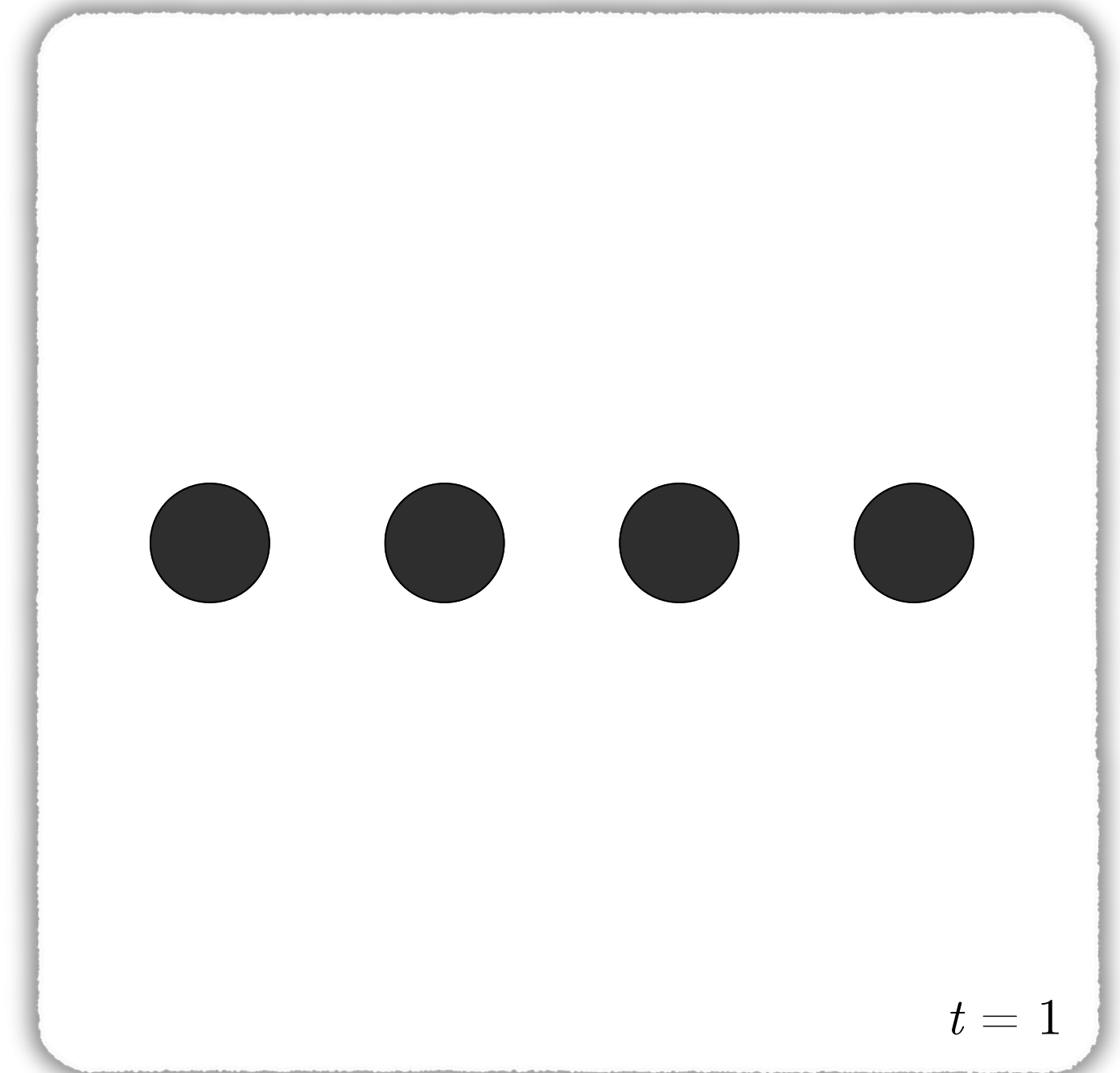
Secondly, and more importantly, in seeking the solution of a game, the concept of human rationality is replaced by that of *evolutionary stability*.

Smith, J. M. (1982). *Evolution and the Theory of Games*. Cambridge University Press.

This makes cooperation in the Prisoner's Dilemma an even starker challenge.

# DO COOPERATORS SURVIVE?

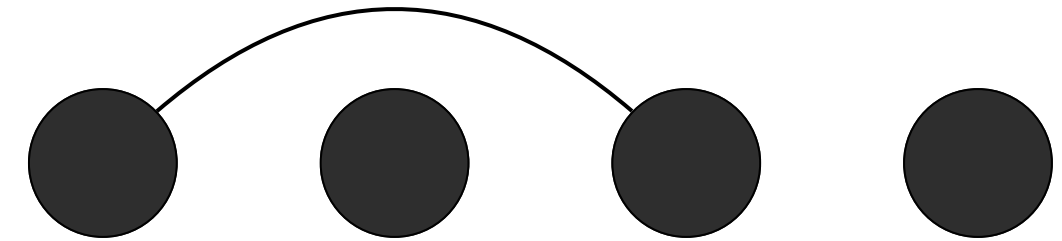
Take a group of individuals.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

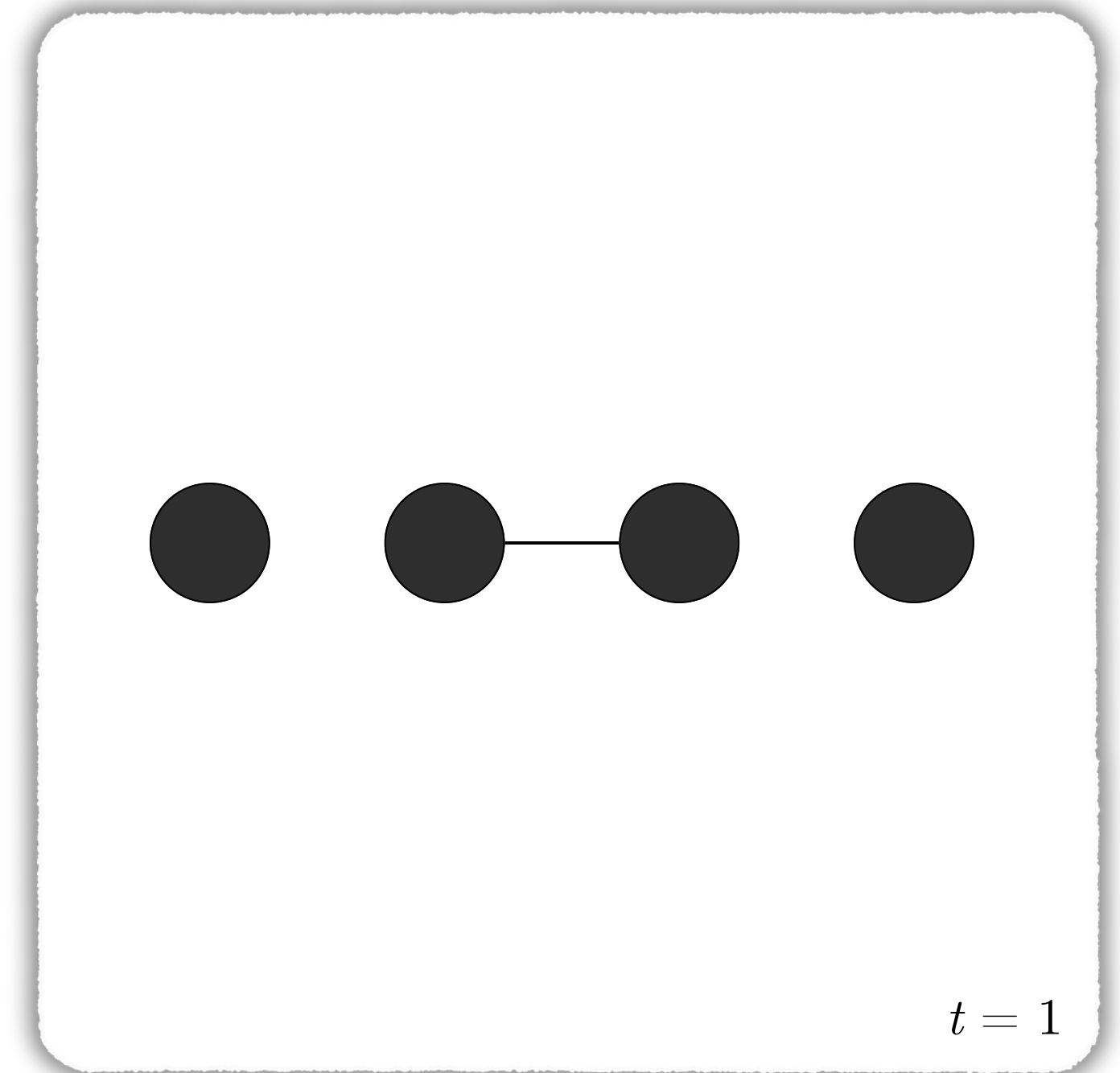


$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.



$t = 1$

# DO COOPERATORS SURVIVE?

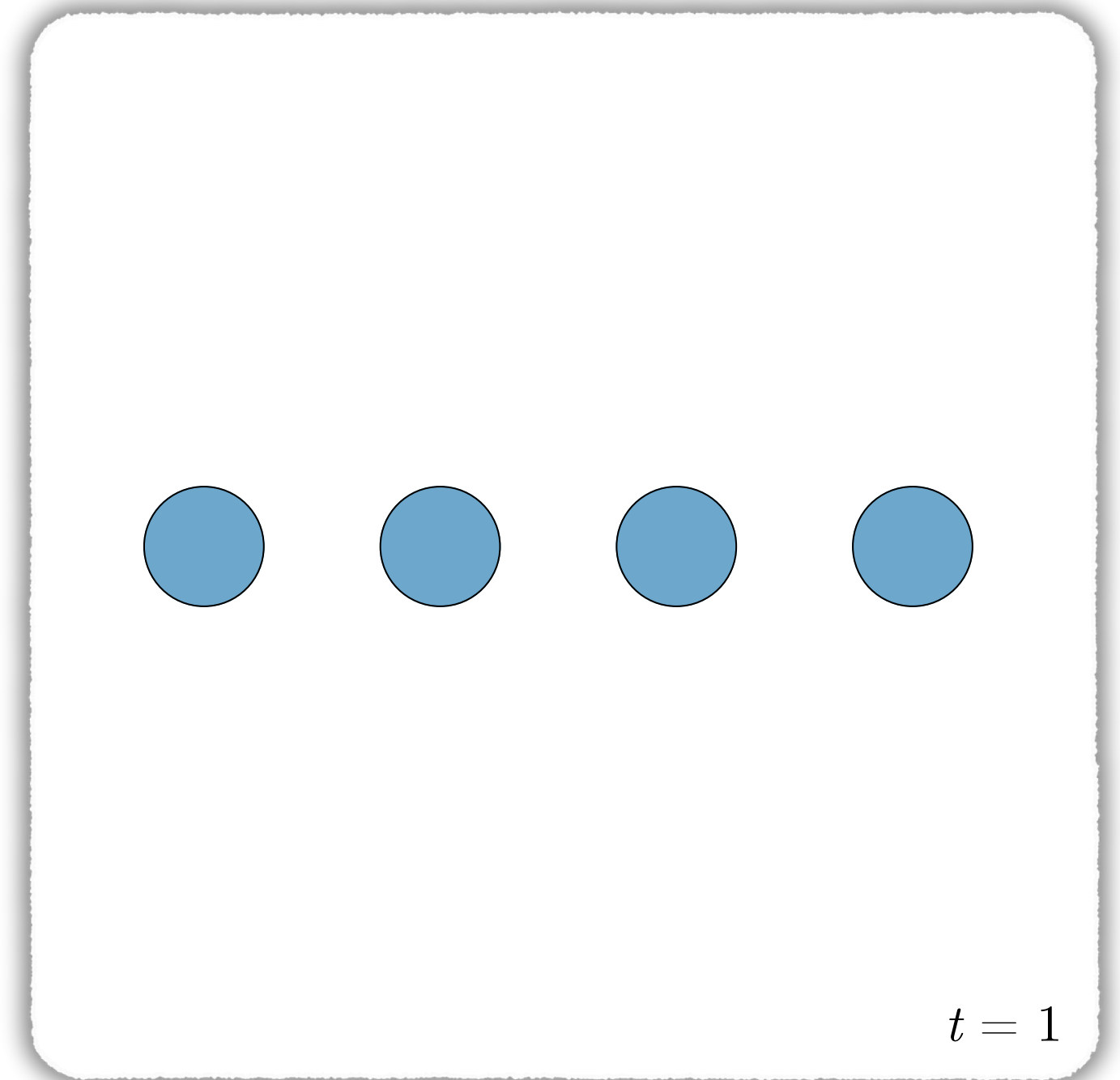
Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

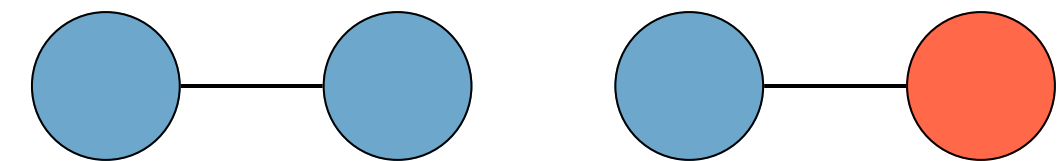
They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

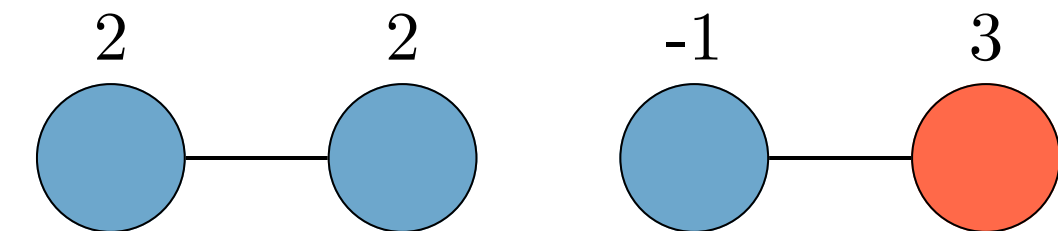
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage.



$t = 1$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

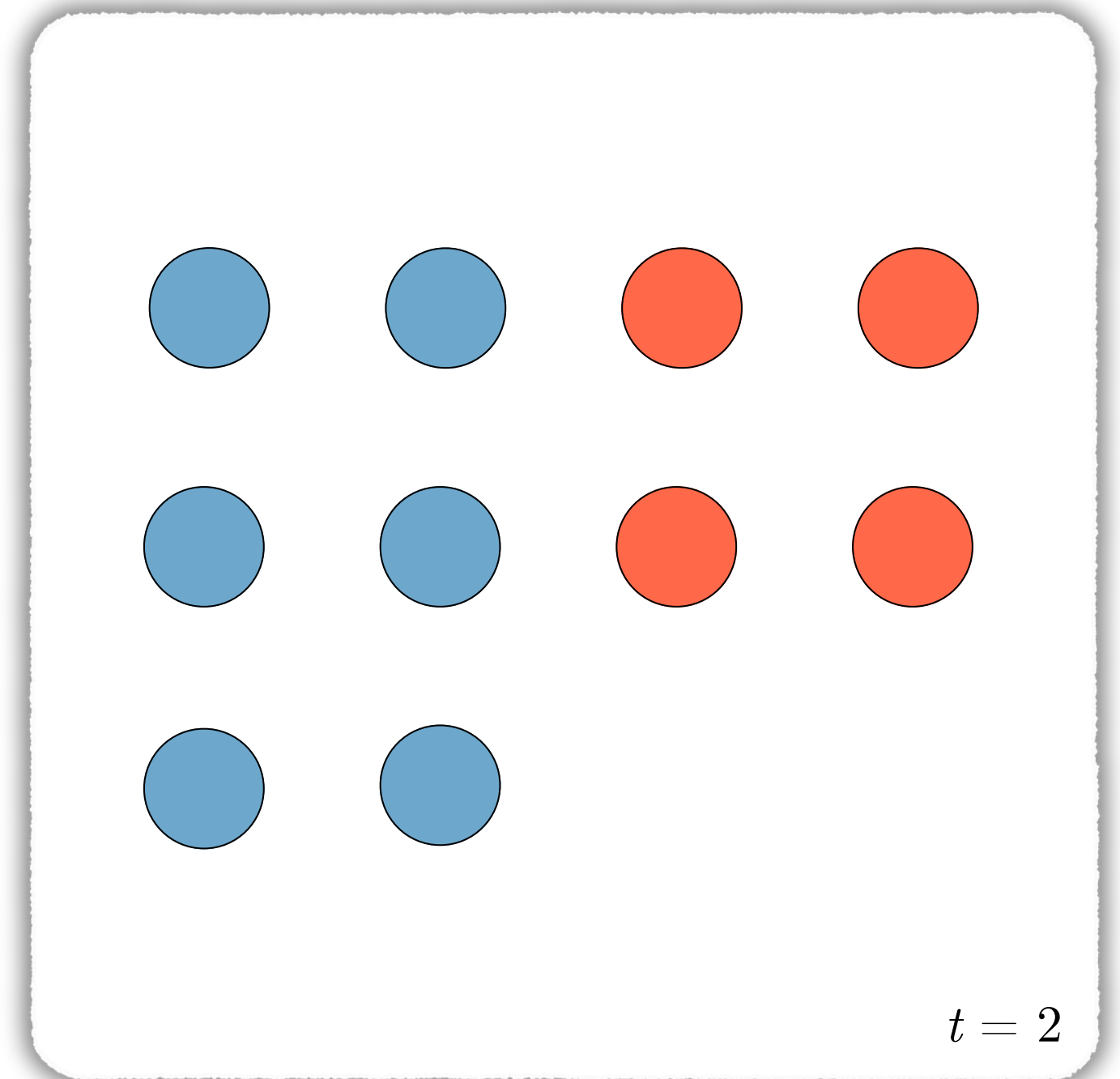
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

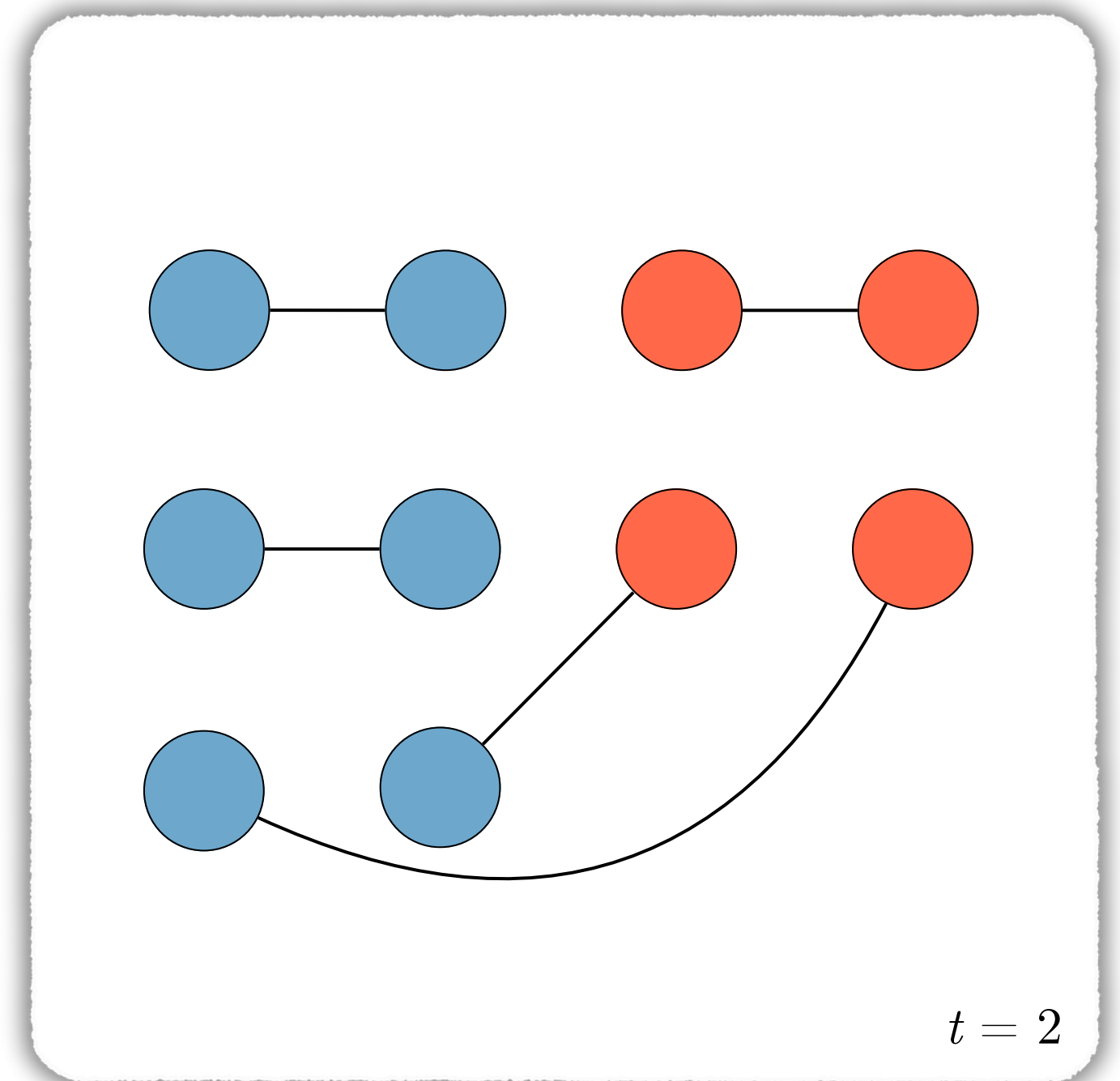
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

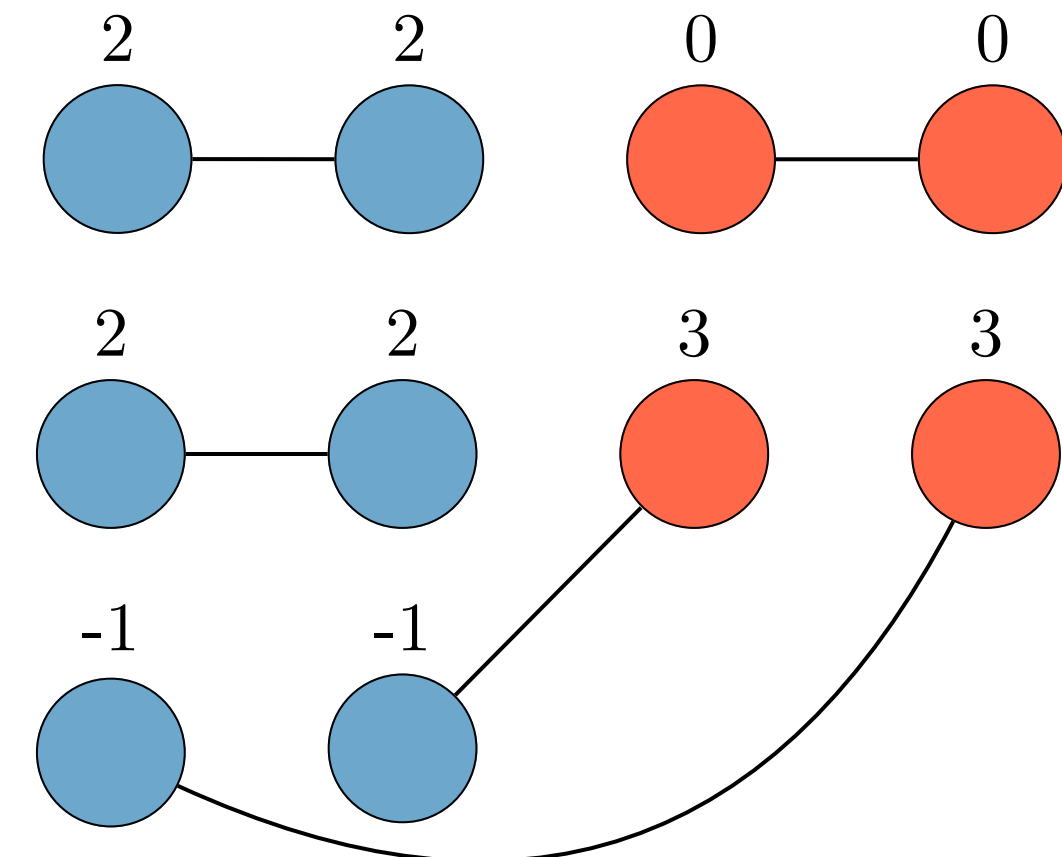
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%.



$t = 2$

# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

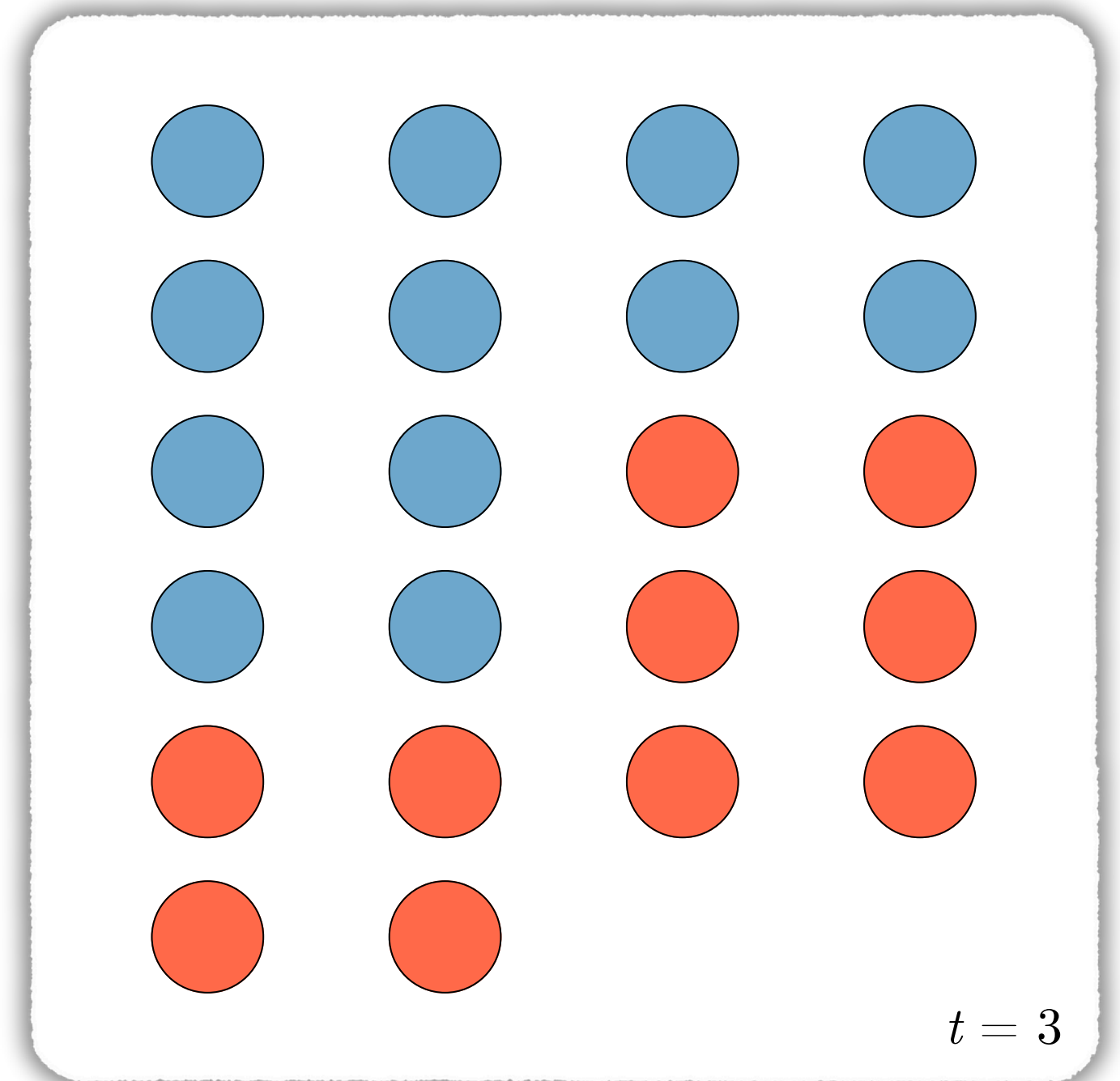
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%. Then 45%.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

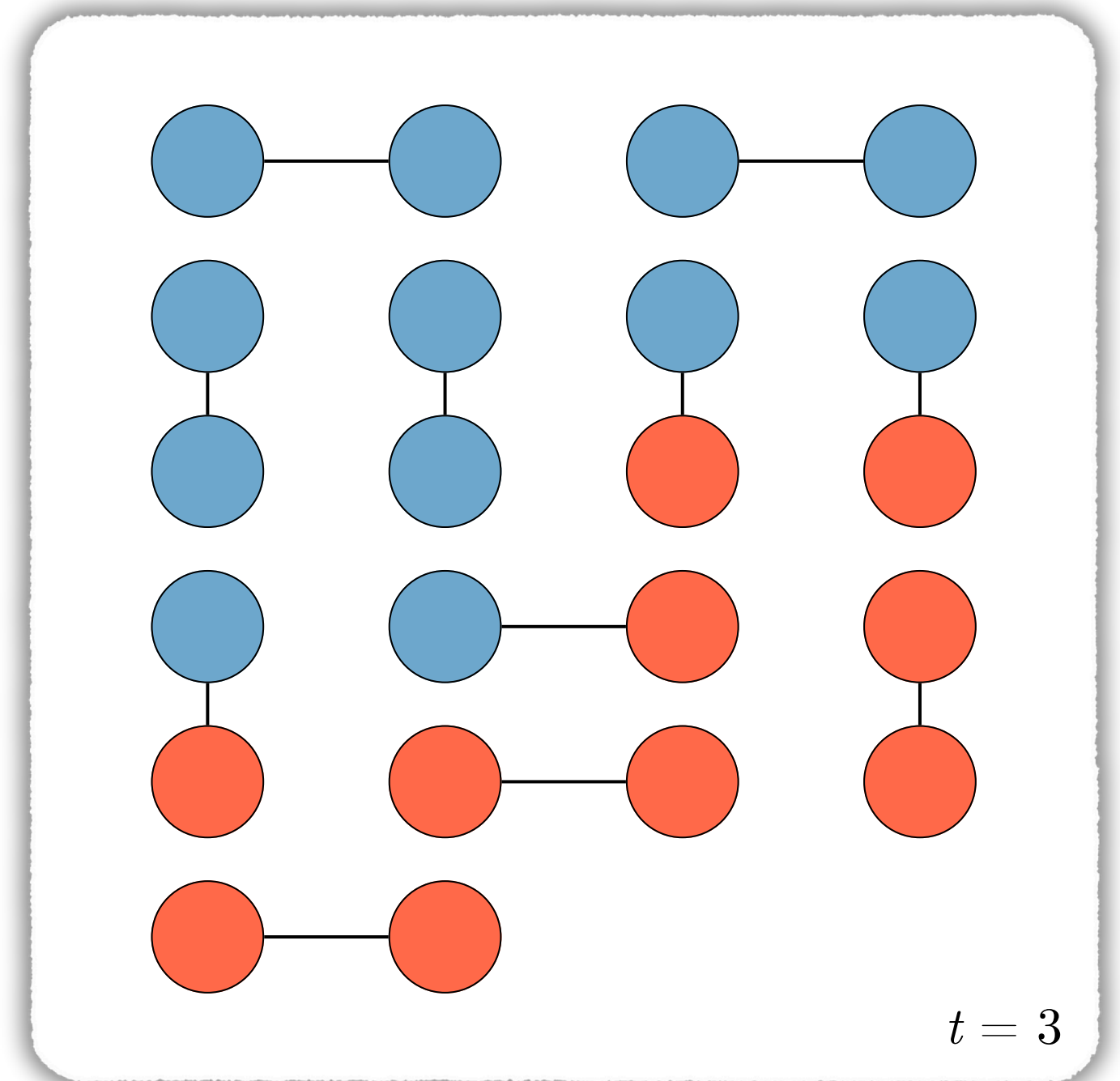
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%. Then 45%.



# DO COOPERATORS SURVIVE?

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

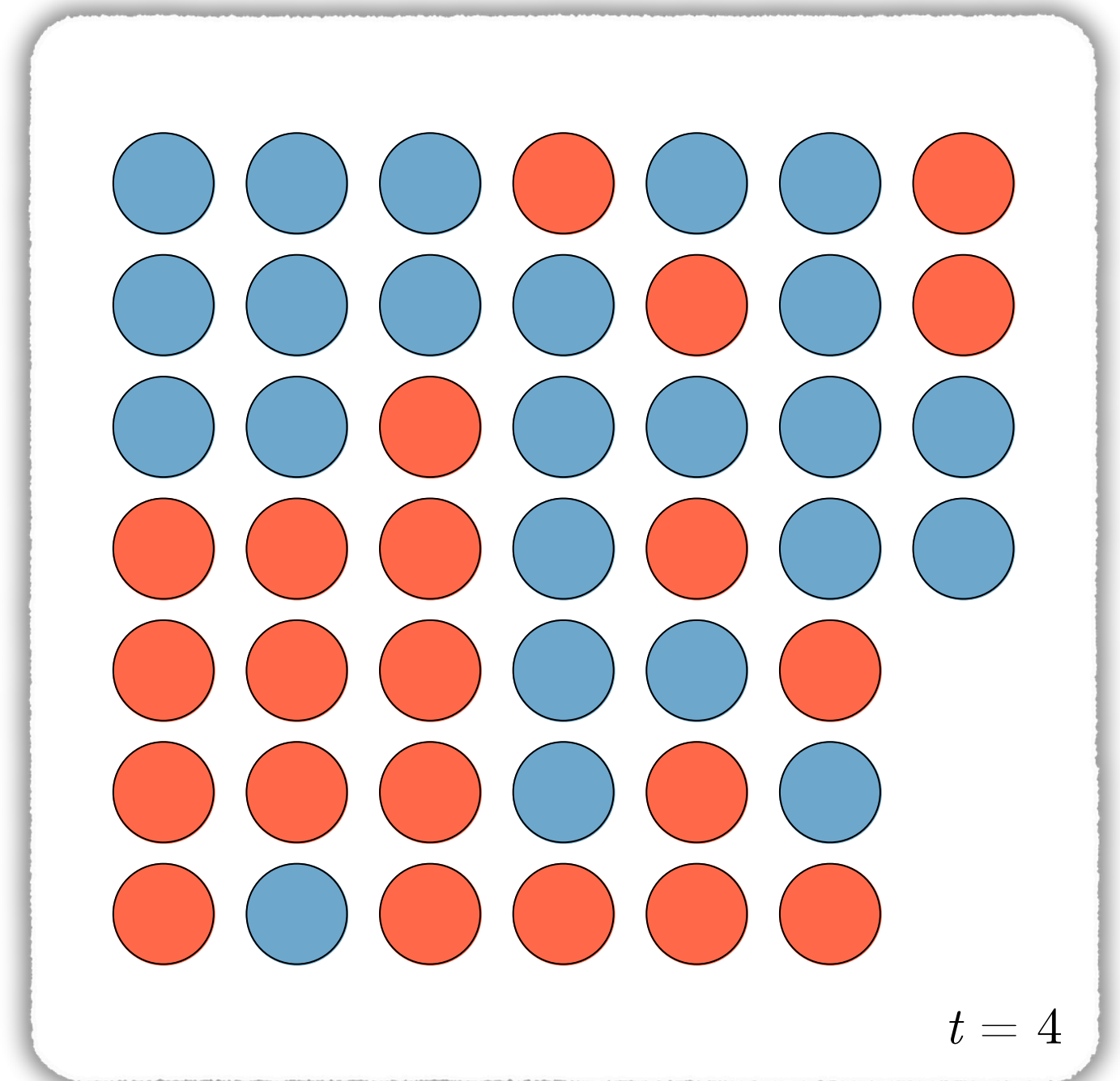
Each individual has a fixed strategy: **cooperate** or **defect**.

Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%. Then 45%. Then 48%...



# DO COOPERATORS SURVIVE? NO.

Take a group of individuals.

They are paired randomly and play a Prisoner's Dilemma.

Each individual has a fixed strategy: **cooperate** or **defect**.

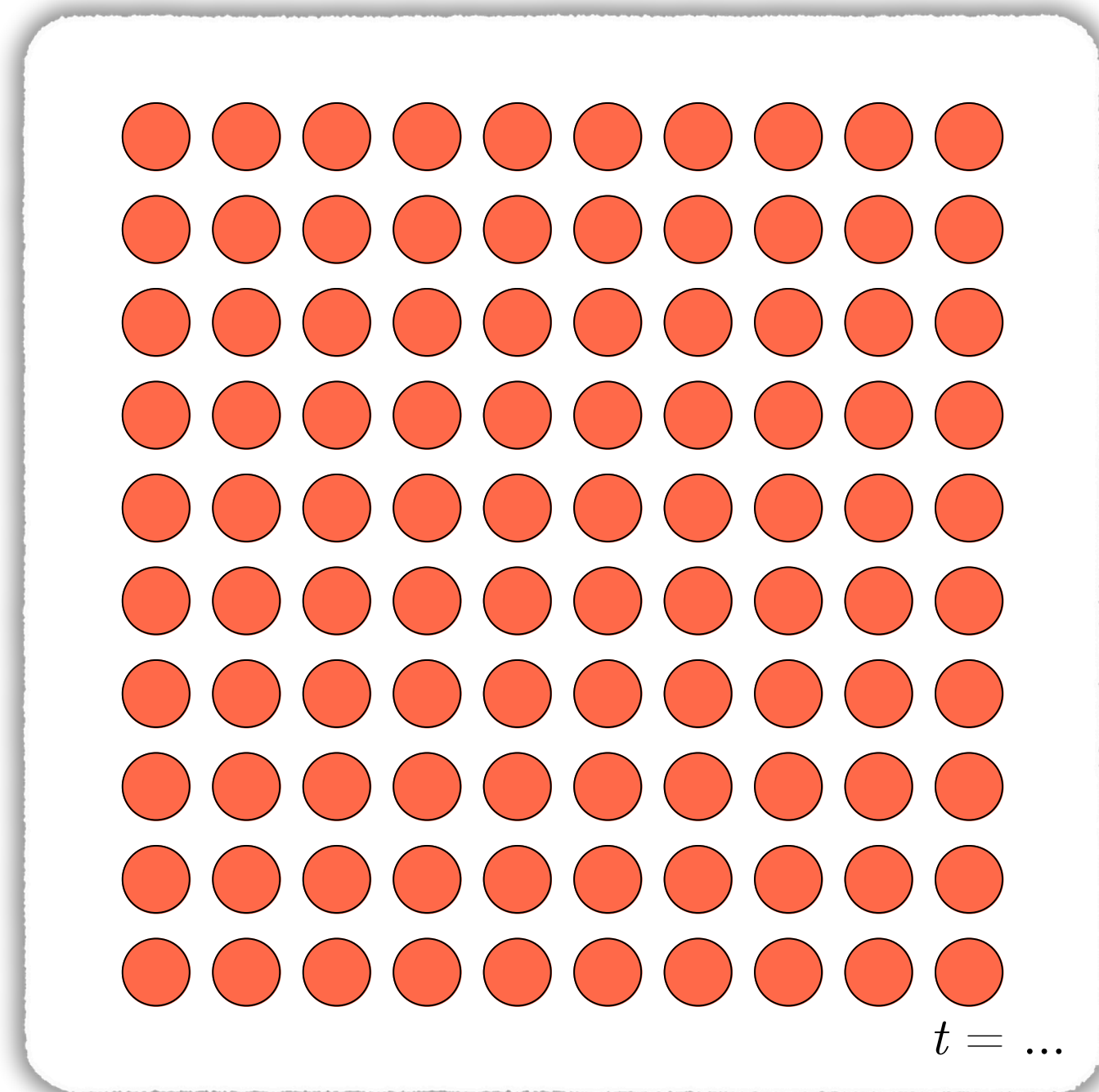
Payoffs determine the number of offspring at next round, with -1 spelling death.

The group is made wholly made up of **cooperators**. But suppose we throw in a **defector**...

Initially, **defectors** make up only a very small proportion: here, 25%.

But they have a reproductive advantage. So at next round they become 40%. Then 45%. Then 48%...

Eventually they inherit the earth.



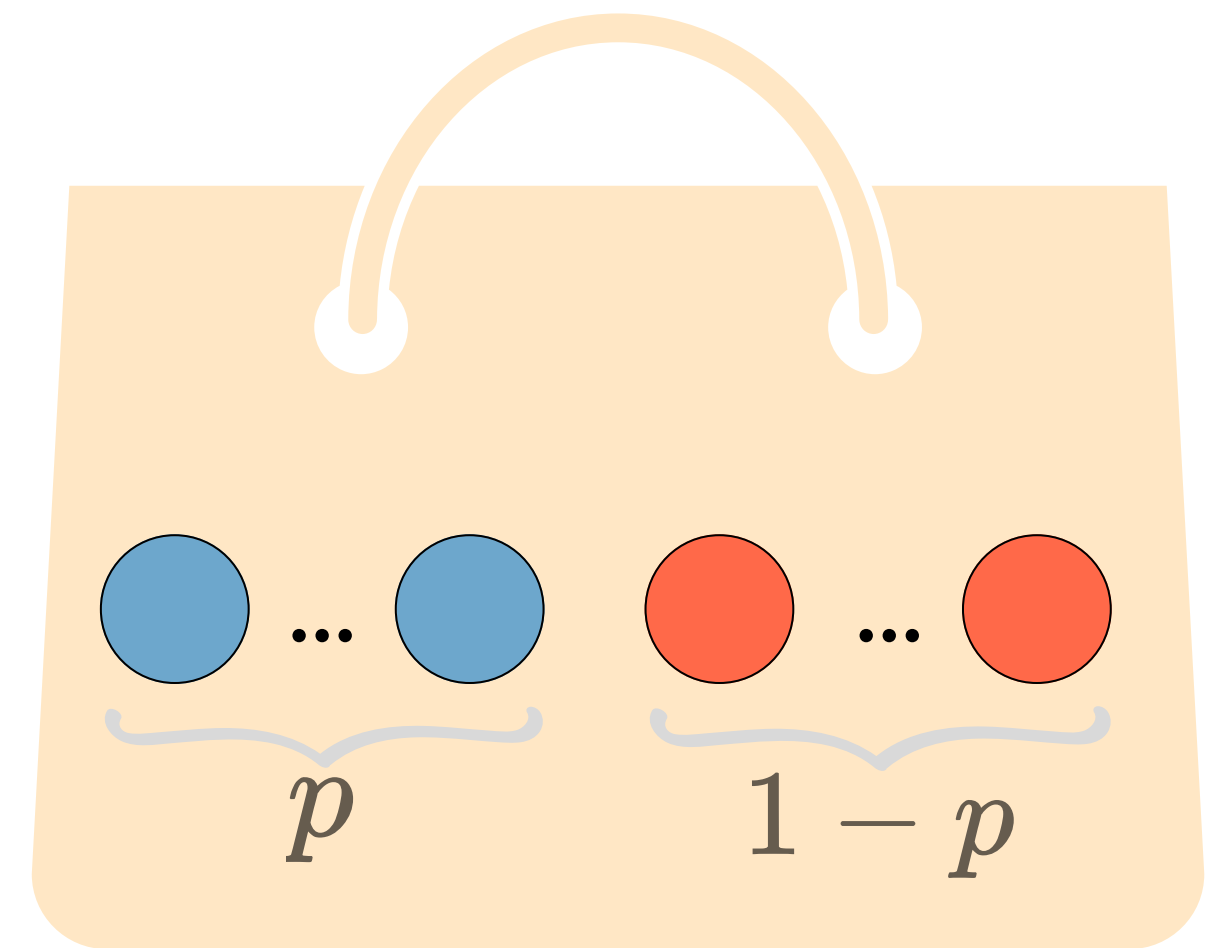
This run had an element of chance to it,  
because the pairings are random.

This run had an element of chance to it,  
because the pairings are random. But, on  
average, this will always happen.

This run had an element of chance to it, because the pairings are random. But, on average, this will always happen. To see why, let's make the pairing model explicit.

# RANDOM PAIRING MODEL

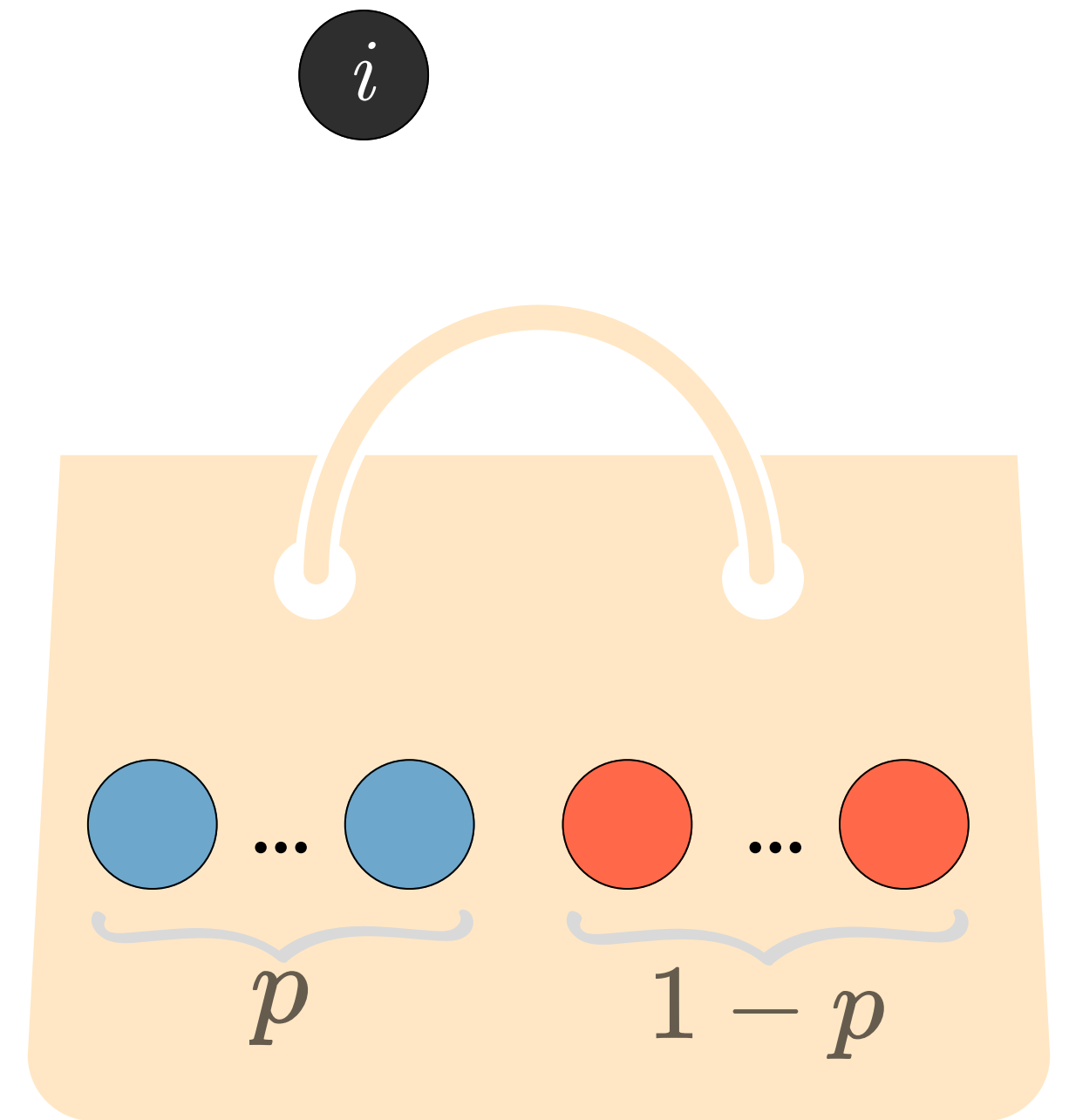
We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.



# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

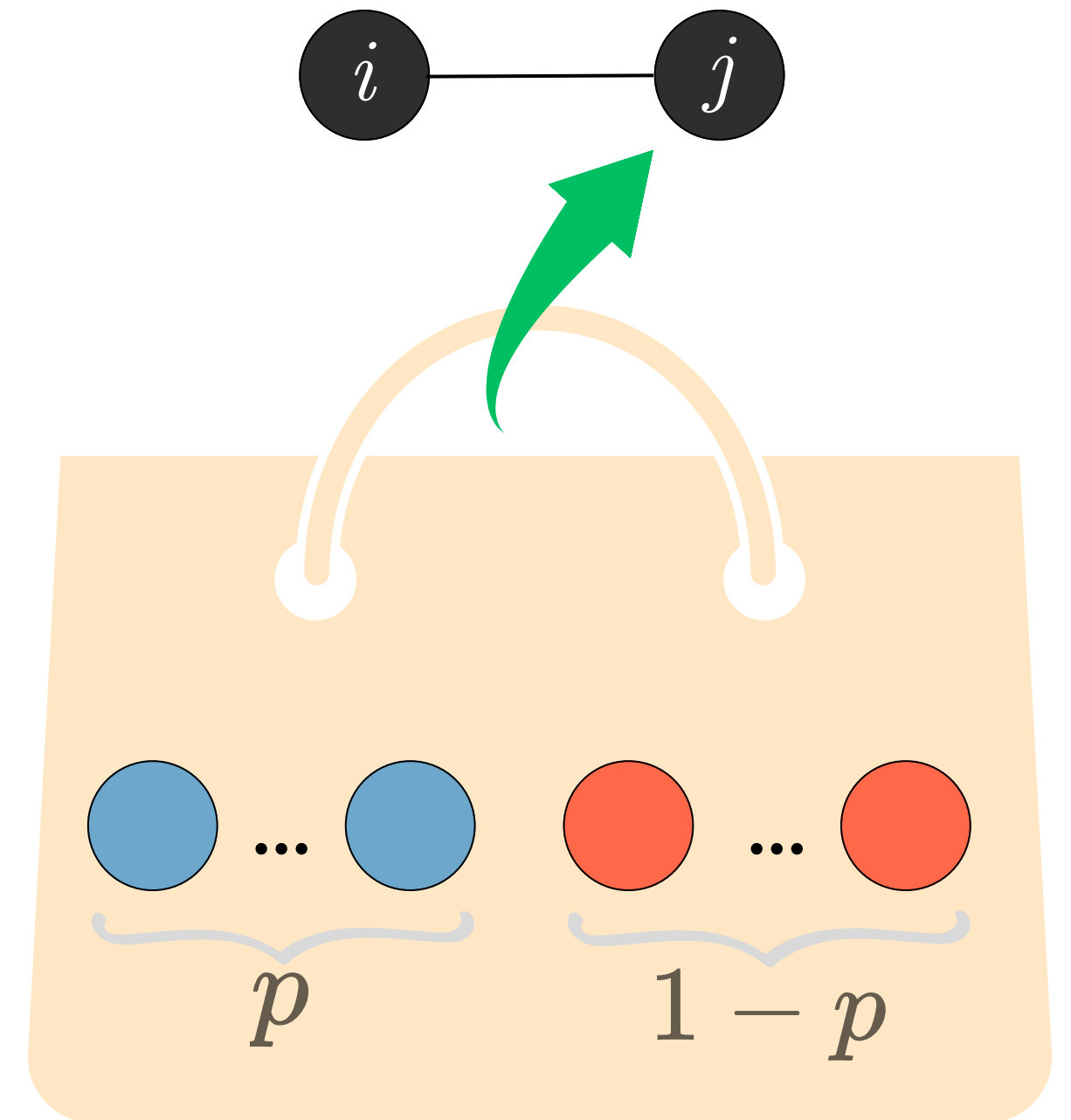


# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

Pick another agent  $j$  from the population as  $i$ 's pair.



# RANDOM PAIRING MODEL

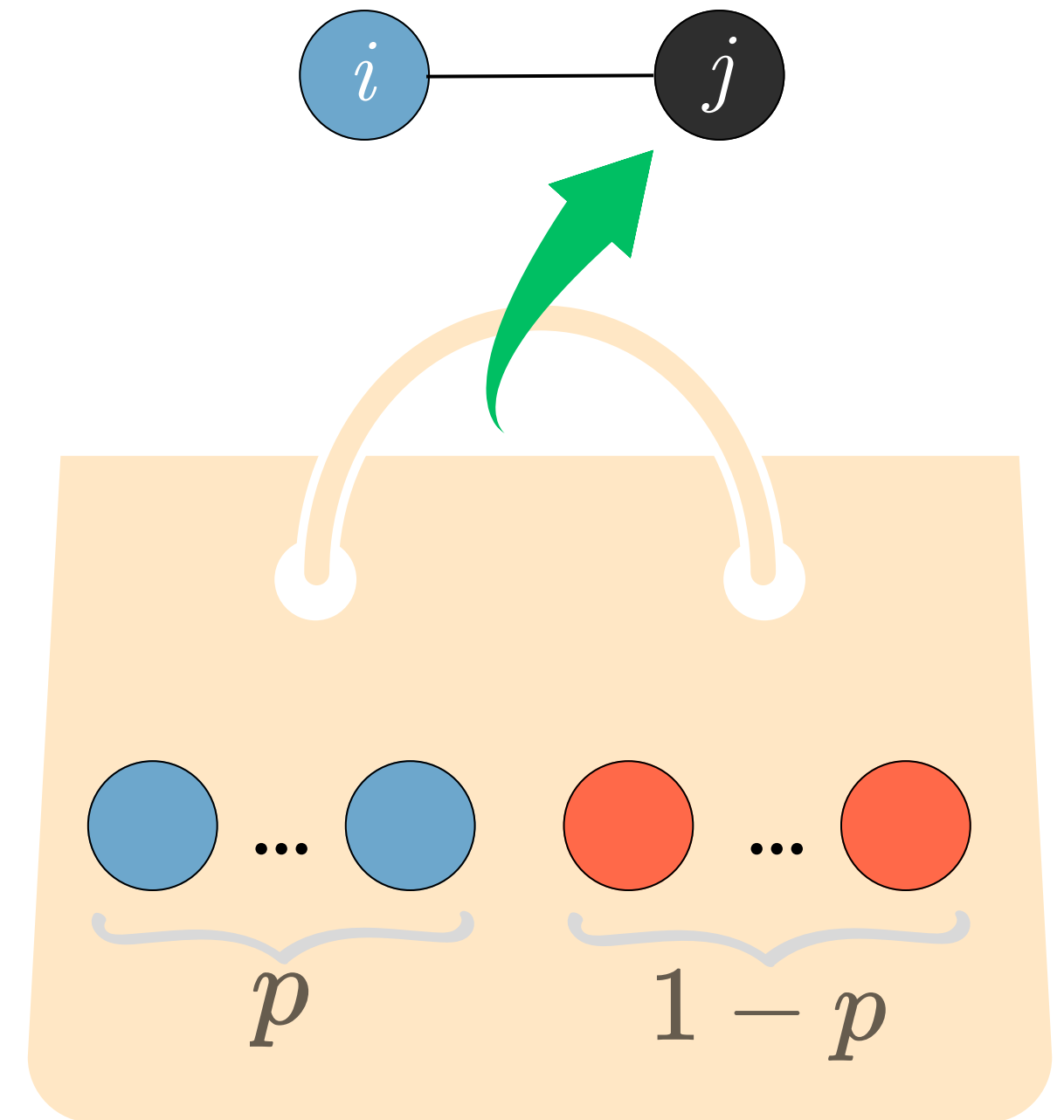
We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

Pick another agent  $j$  from the population as  $i$ 's pair.

If  $j$  is selected uniformly at random, the probabilities of  $j$  being a cooperator or a defector are, roughly:\*

$$\Pr[\quad \mid i = \mathbf{C}] = p,$$



\*We assume the population is large enough that pulling  $i$  out does not change proportions significantly.

# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

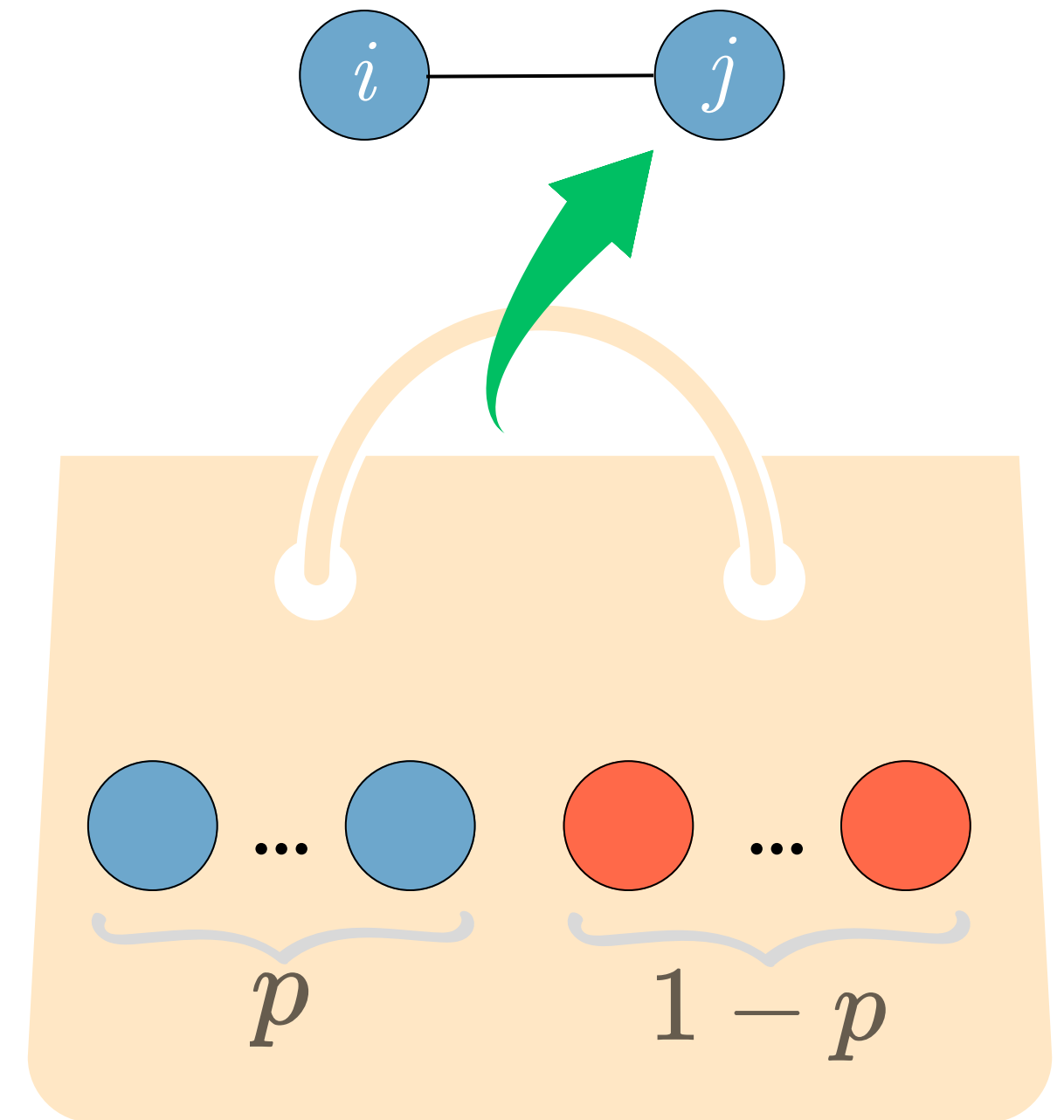
Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

Pick another agent  $j$  from the population as  $i$ 's pair.

If  $j$  is selected uniformly at random, the probabilities of  $j$  being a cooperator or a defector are, roughly:\*

$$\Pr[j = \text{C} \mid i = \text{C}] = p,$$

\*We assume the population is large enough that pulling  $i$  out does not change proportions significantly.



# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

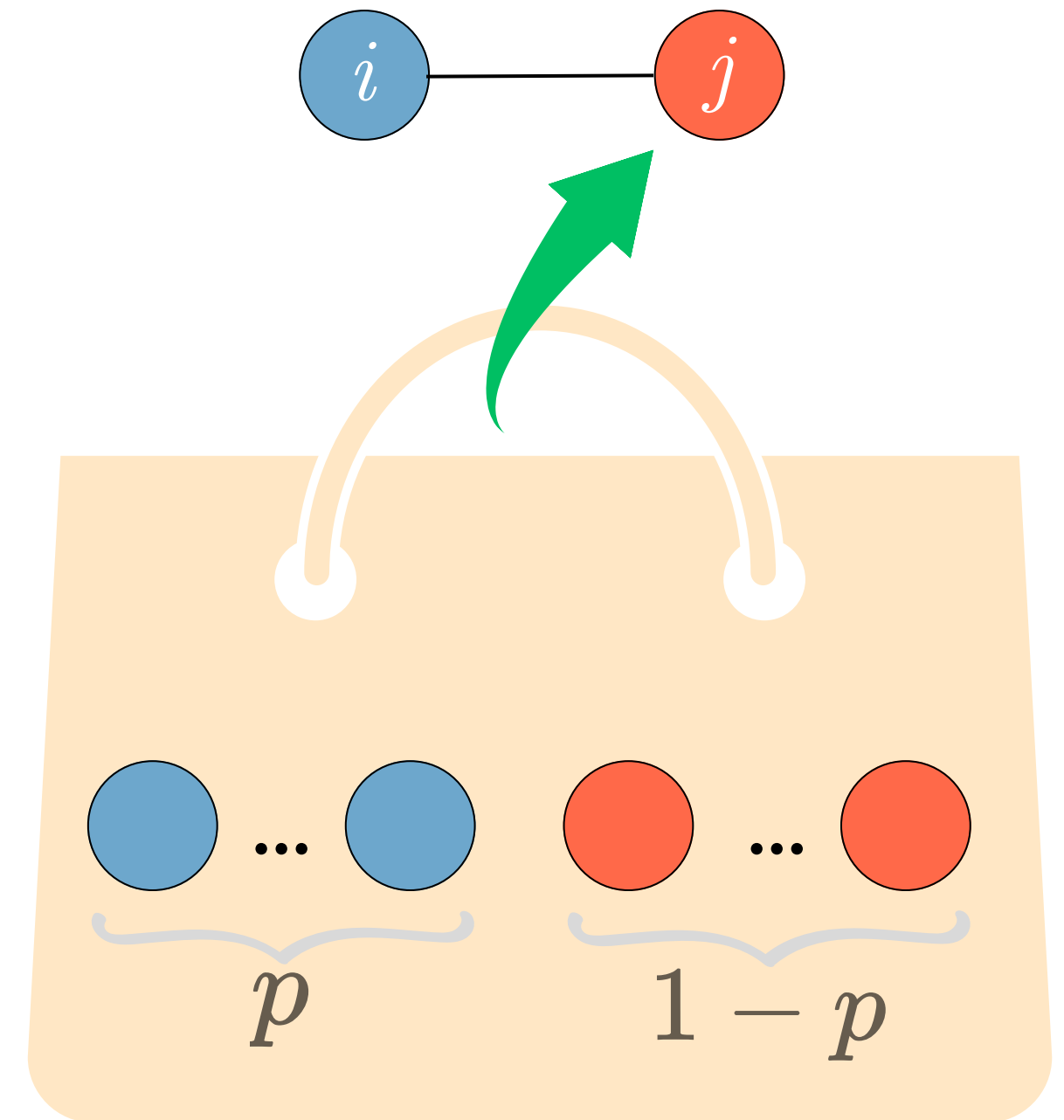
Pick another agent  $j$  from the population as  $i$ 's pair.

If  $j$  is selected uniformly at random, the probabilities of  $j$  being a cooperator or a defector are, roughly:\*

$$\Pr[j = \text{C} \mid i = \text{C}] = p,$$

$$\Pr[j = \text{D} \mid i = \text{C}] = 1 - p,$$

\*We assume the population is large enough that pulling  $i$  out does not change proportions significantly.



# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

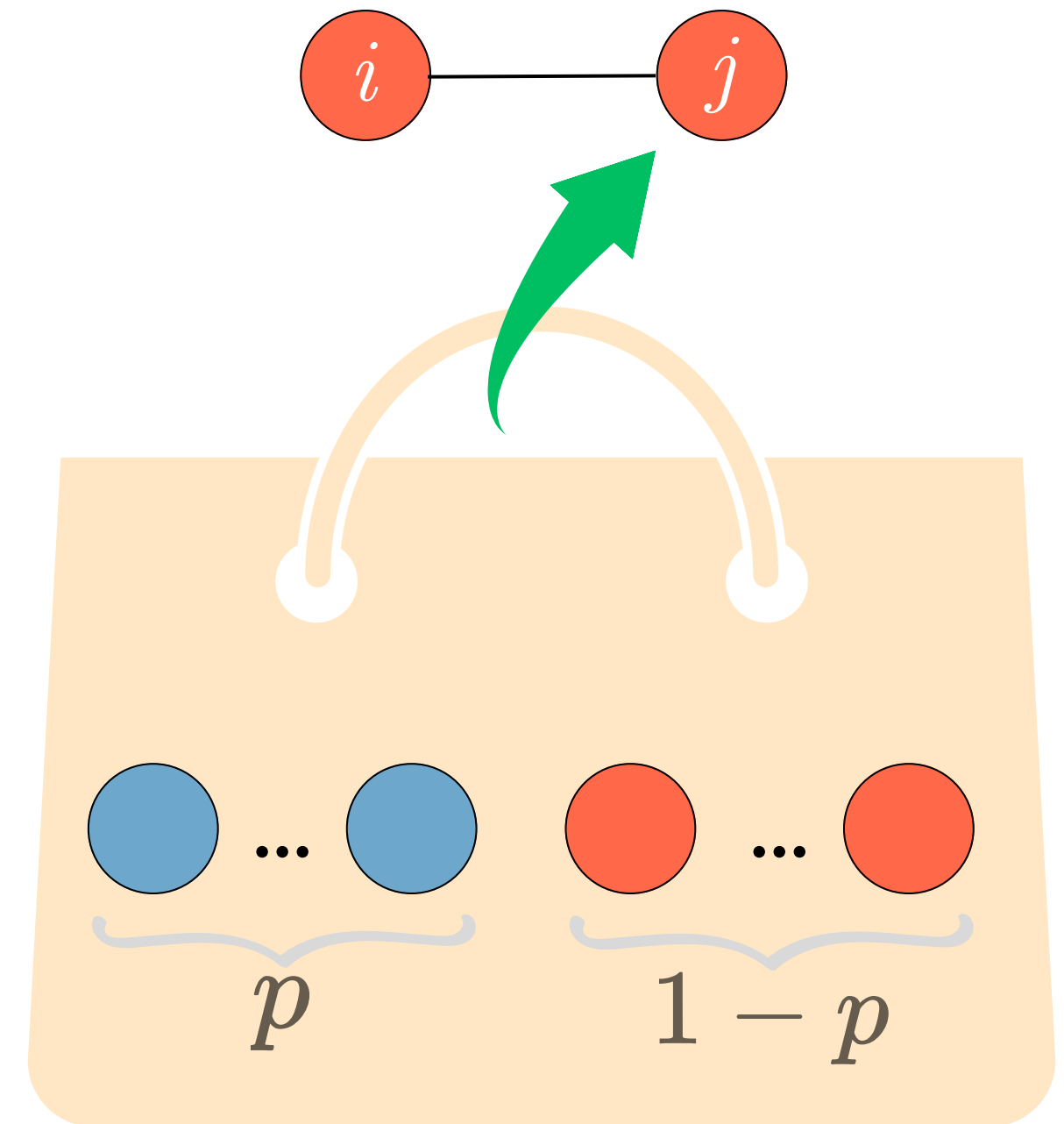
Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

Pick another agent  $j$  from the population as  $i$ 's pair.

If  $j$  is selected uniformly at random, the probabilities of  $j$  being a cooperator or a defector are, roughly:\*

$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= p, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - p, \\ \Pr[j = \text{D} \mid i = \text{D}] &= 1 - p,\end{aligned}$$

\*We assume the population is large enough that pulling  $i$  out does not change proportions significantly.



# RANDOM PAIRING MODEL

We assume a population with a fraction of  $p$  cooperators and  $1 - p$  defectors.

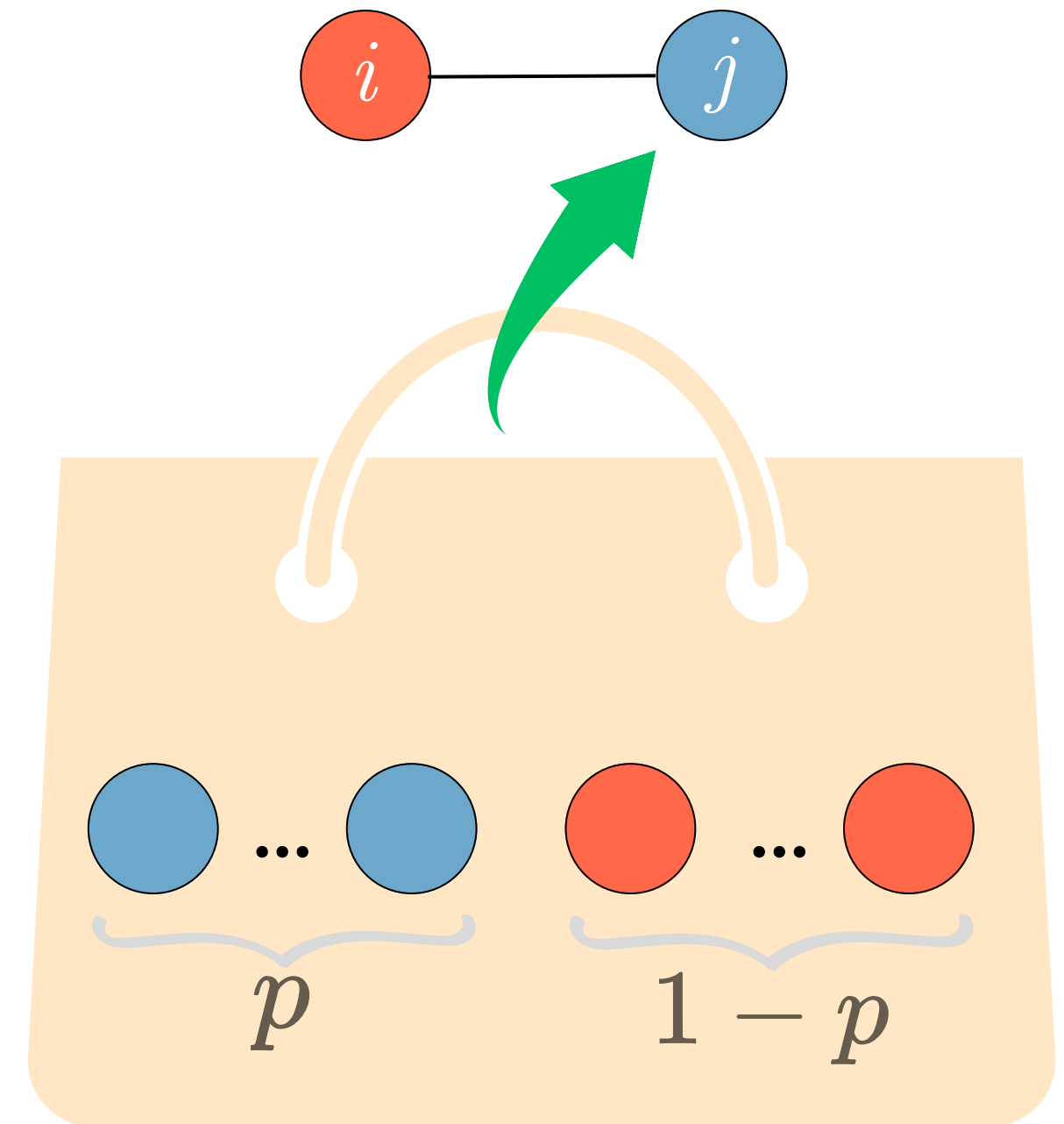
Fix an arbitrary agent  $i$  in the population, called the *focal agent*.

Pick another agent  $j$  from the population as  $i$ 's pair.

If  $j$  is selected uniformly at random, the probabilities of  $j$  being a cooperator or a defector are, roughly:\*

$$\begin{aligned} \Pr[j = \text{C} \mid i = \text{C}] &= p, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - p, \\ \Pr[j = \text{D} \mid i = \text{D}] &= 1 - p, & \Pr[j = \text{C} \mid i = \text{D}] &= p. \end{aligned}$$

\*We assume the population is large enough that pulling  $i$  out does not change proportions significantly.



# RANDOM PAIRING MODEL

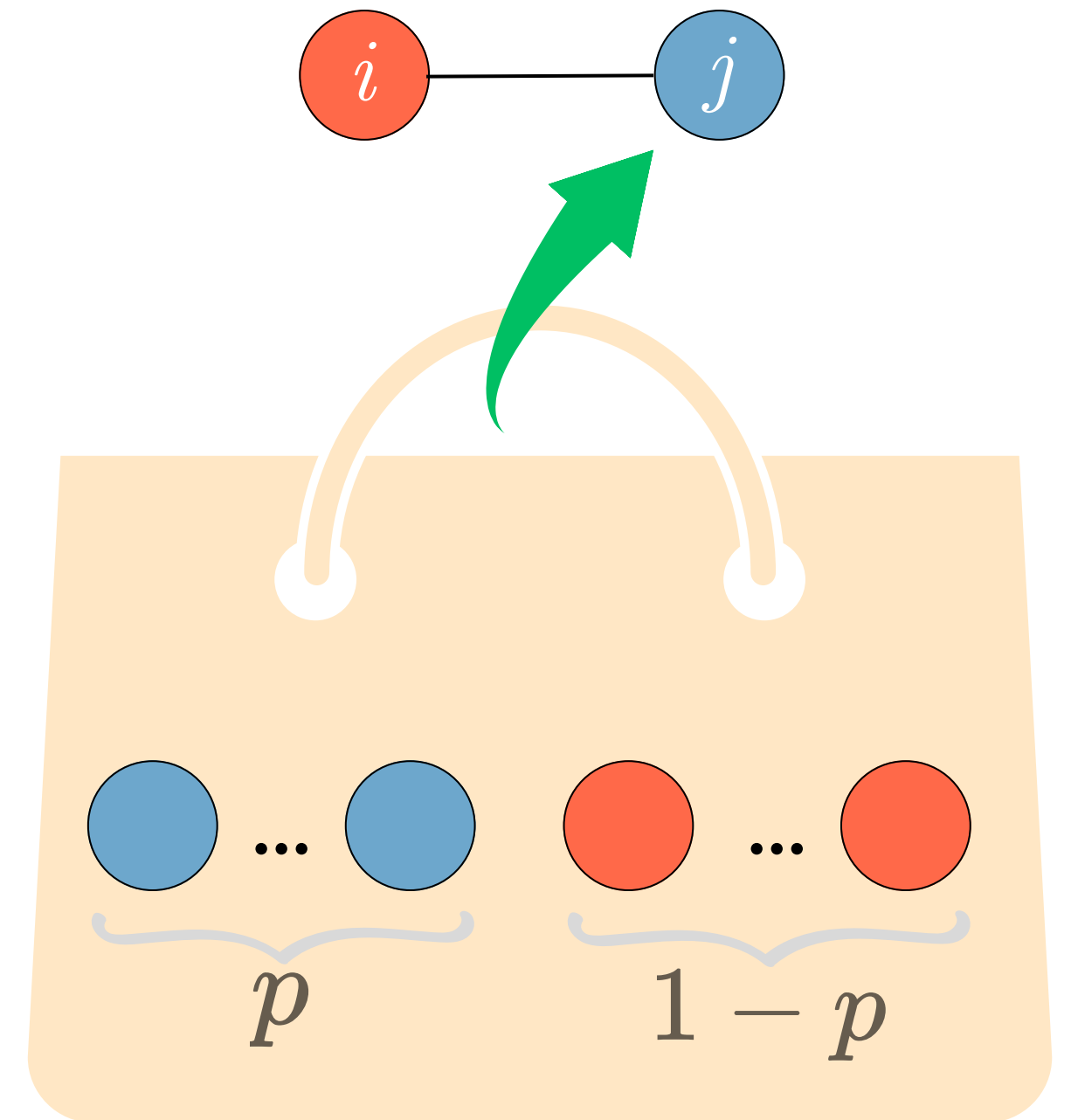
When paired, we assume the focal agent  $i$  is player 1, and agent  $j$  is player 2.

And we look only at the payoffs of the focal agent.

Thus:

$$u(C, D)$$

is the payoff of player  $i$  when  $i$  is a cooperator and  $j$  is a defector.



Now we can calculate the expected payoffs of agents under the random pairing model.

# EXPECTED PAYOFFS PER TIME STEP

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

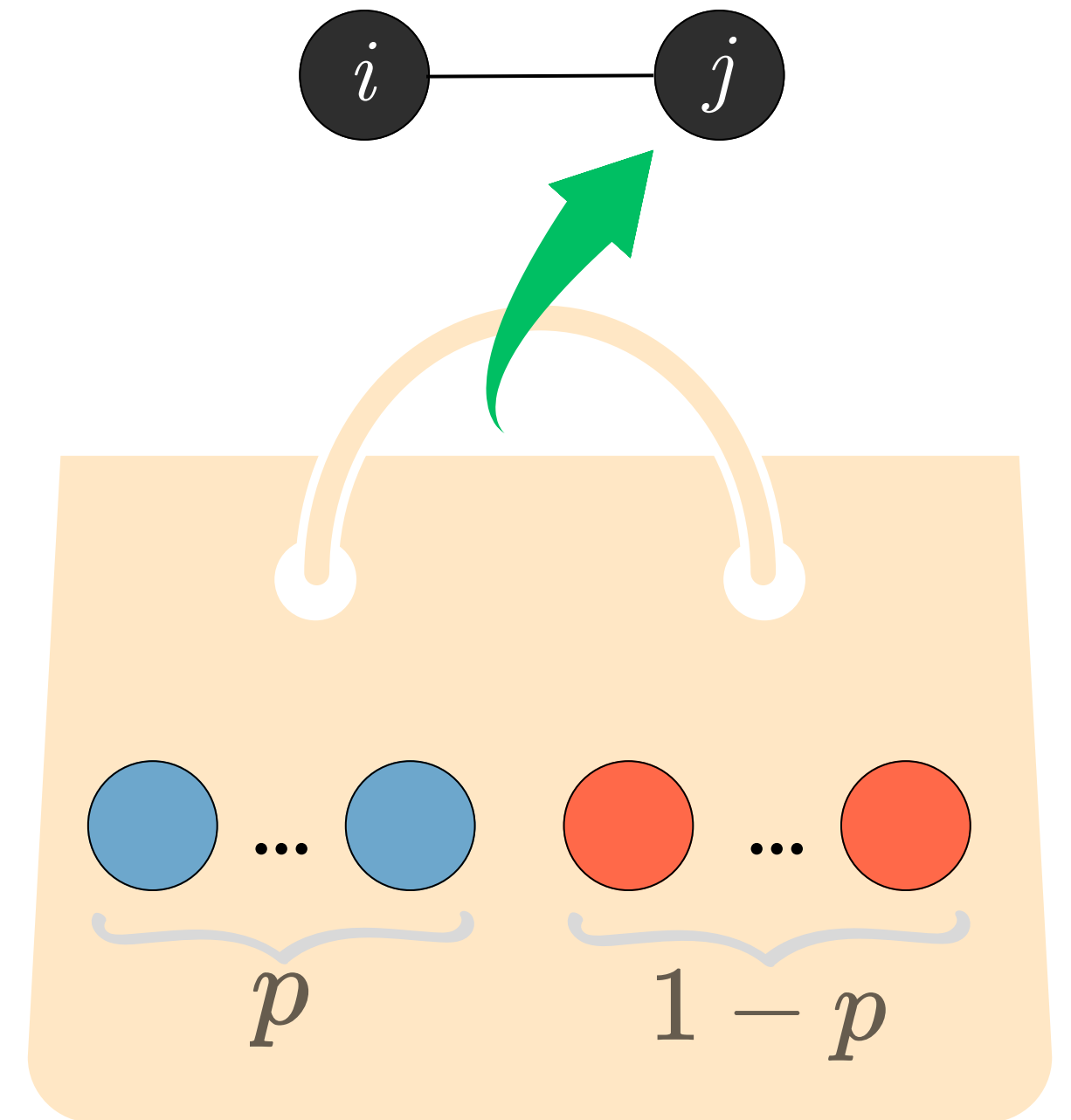
With uniformly random pairing, the probabilities are:

$$\Pr[j = \text{C} \mid i = \text{C}] = p,$$

$$\Pr[j = \text{D} \mid i = \text{C}] = 1 - p,$$

$$\Pr[j = \text{D} \mid i = \text{D}] = 1 - p,$$

$$\Pr[j = \text{C} \mid i = \text{D}] = p.$$



# EXPECTED PAYOFFS PER TIME STEP

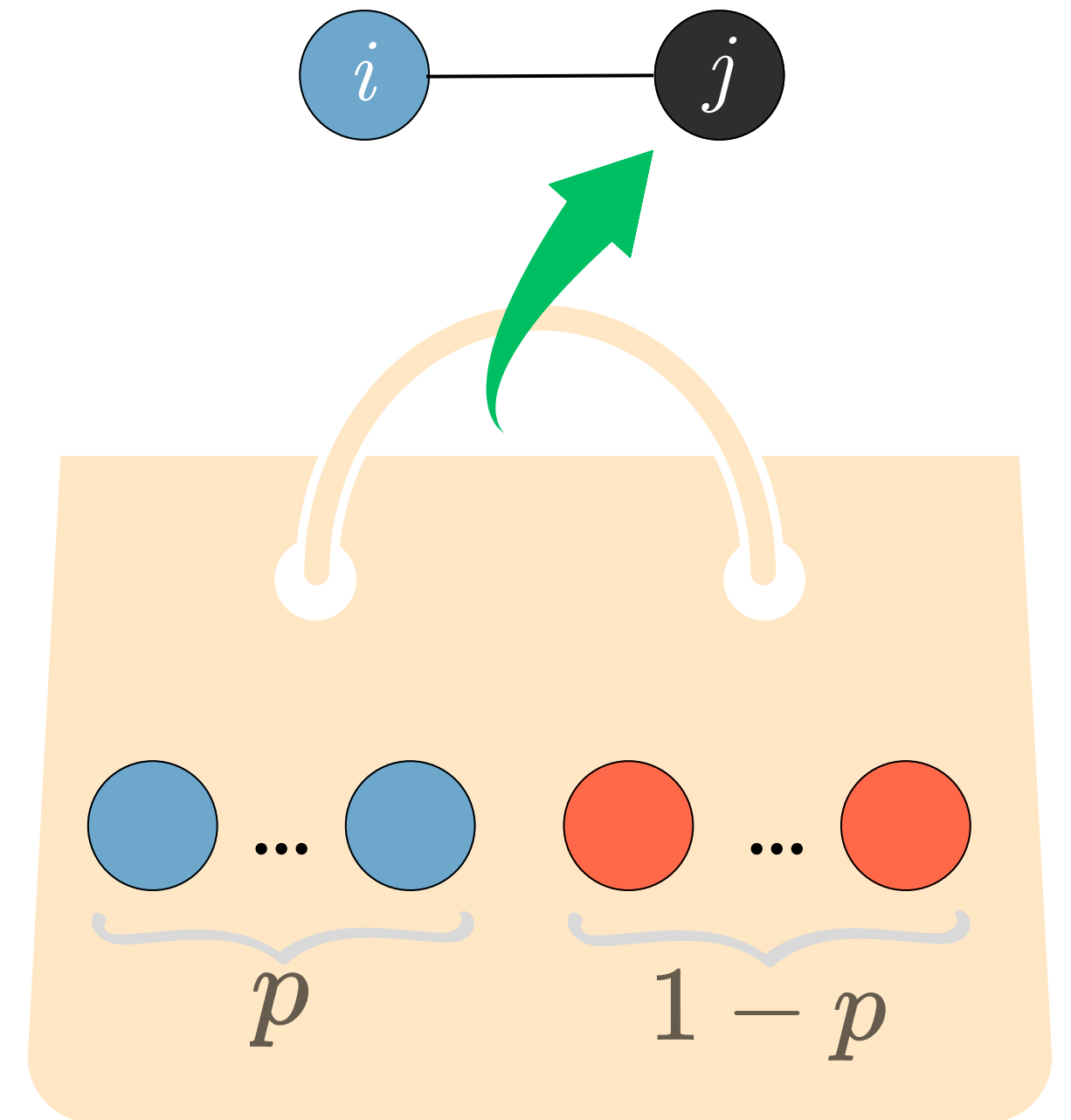
There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

With uniformly random pairing, the probabilities are:

$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= p, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - p, \\ \Pr[j = \text{D} \mid i = \text{D}] &= 1 - p, & \Pr[j = \text{C} \mid i = \text{D}] &= p.\end{aligned}$$

The expected payoffs if  $i$  is a cooperator (C) or a defector (D) are:

$$\begin{aligned}\mathbb{E}[\text{C}] &= u(\text{C}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{C}] + u(\text{C}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{C}] \\ &= 2 \cdot p + (-1) \cdot (1 - p) \\ &= 3p - 1.\end{aligned}$$



# EXPECTED PAYOFFS PER TIME STEP

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

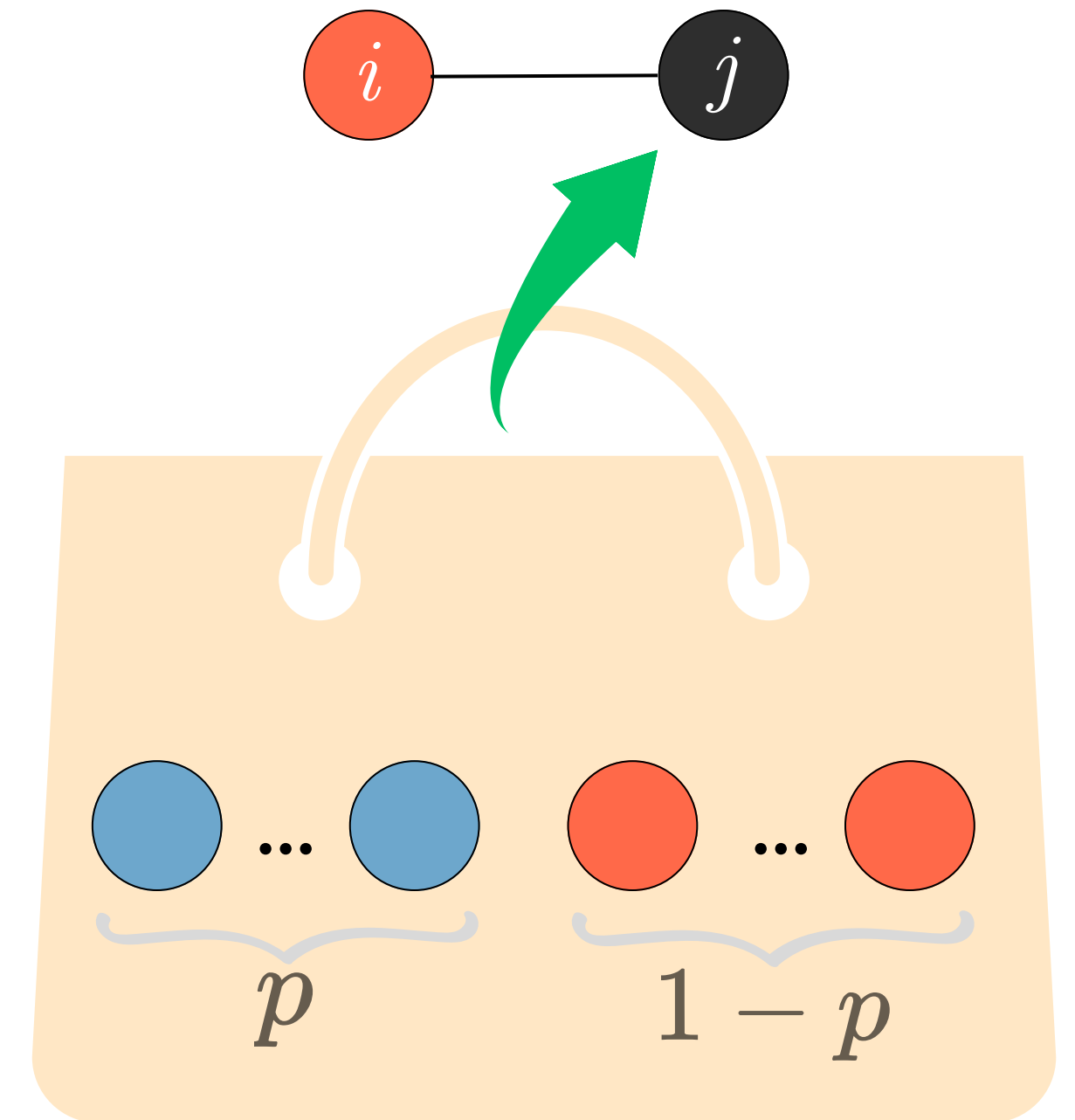
With uniformly random pairing, the probabilities are:

$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= p, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - p, \\ \Pr[j = \text{D} \mid i = \text{D}] &= 1 - p, & \Pr[j = \text{C} \mid i = \text{D}] &= p.\end{aligned}$$

The expected payoffs if  $i$  is a cooperator (C) or a defector (D) are:

$$\begin{aligned}\mathbb{E}[\text{C}] &= u(\text{C}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{C}] + u(\text{C}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{C}] \\ &= 2 \cdot p + (-1) \cdot (1 - p) \\ &= 3p - 1.\end{aligned}$$

$$\begin{aligned}\mathbb{E}[\text{D}] &= u(\text{D}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{D}] + u(\text{D}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{D}] \\ &= 3 \cdot p + 0 \cdot (1 - p) \\ &= 3p\end{aligned}$$



# EXPECTED PAYOFFS PER TIME STEP

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

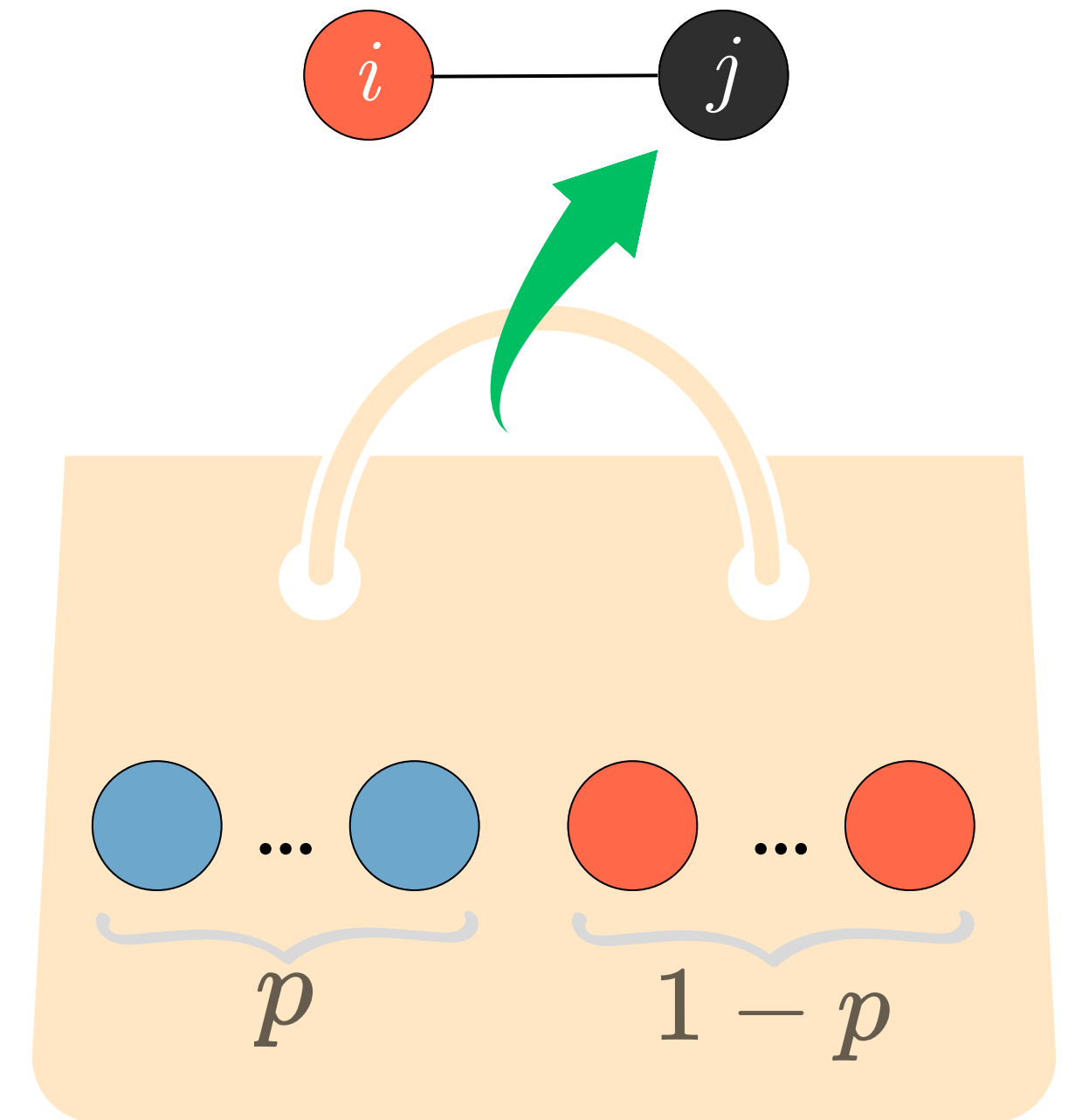
With uniformly random pairing, the probabilities are:

$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= p, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - p, \\ \Pr[j = \text{D} \mid i = \text{D}] &= 1 - p, & \Pr[j = \text{C} \mid i = \text{D}] &= p.\end{aligned}$$

The expected payoffs if  $i$  is a cooperator (C) or a defector (D) are:

$$\begin{aligned}\mathbb{E}[\text{C}] &= u(\text{C}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{C}] + u(\text{C}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{C}] \\ &= 2 \cdot p + (-1) \cdot (1 - p) \\ &= 3p - 1.\end{aligned}$$

$$\begin{aligned}\mathbb{E}[\text{D}] &= u(\text{D}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{D}] + u(\text{D}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{D}] \\ &= 3 \cdot p + 0 \cdot (1 - p) \\ &= 3p \\ &> \mathbb{E}[\text{C}].\end{aligned}$$

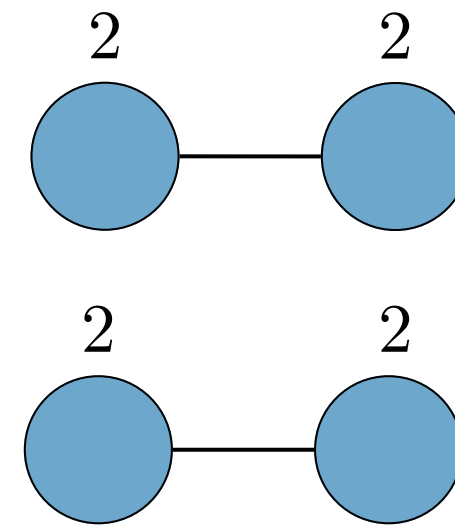


On average, defectors do better than cooperators.

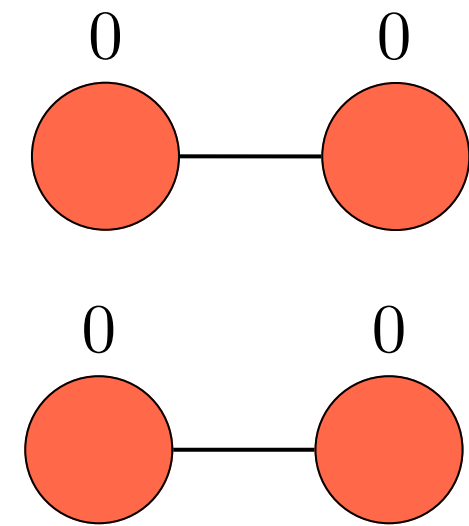
On average, defectors do better than cooperators. Hence, defectors eventually take over.

# WHY WE CAN'T HAVE NICE THINGS

Note that, on average, a group of *only* cooperators does better than a group of defectors.



*t*

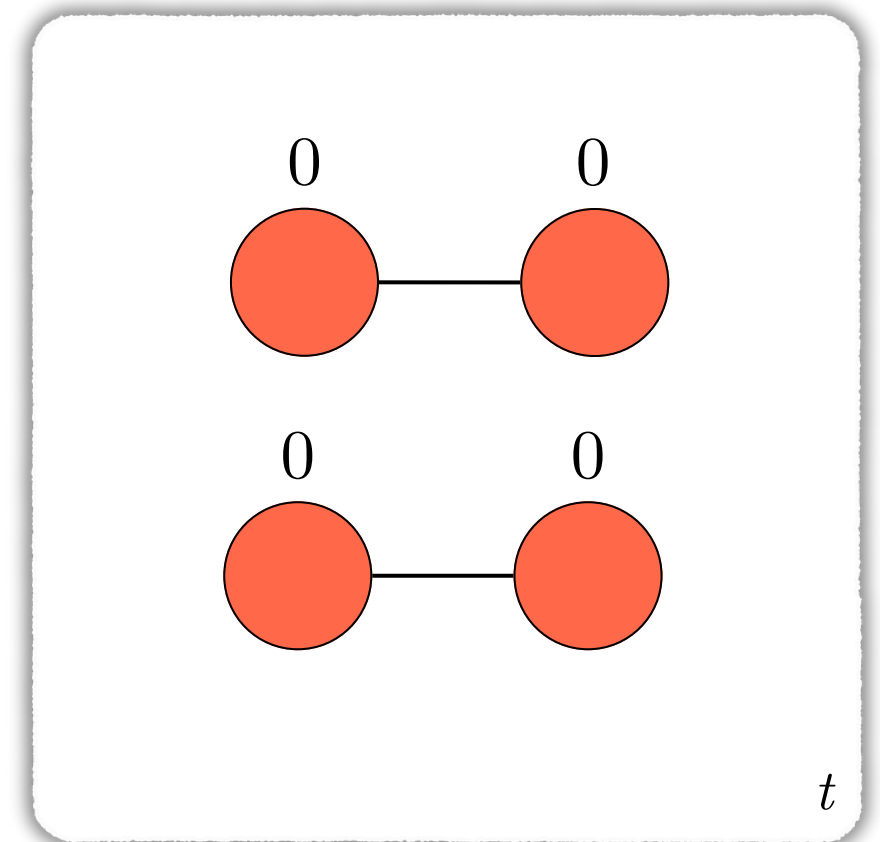
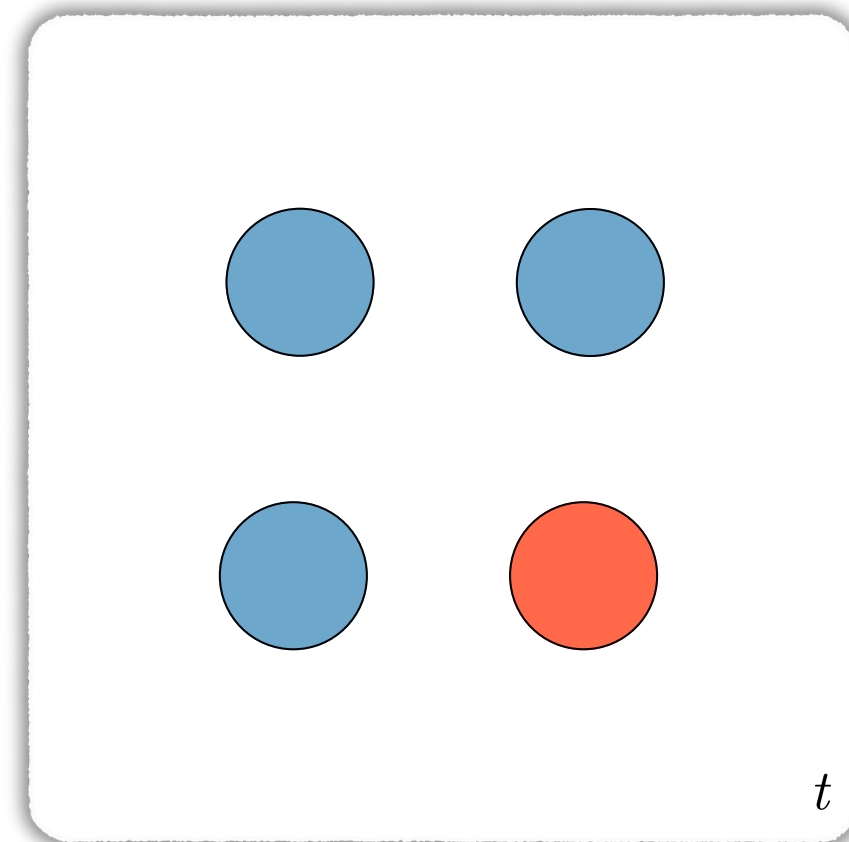


*t*

# WHY WE CAN'T HAVE NICE THINGS

Note that, on average, a group of *only* cooperators does better than a group of defectors.

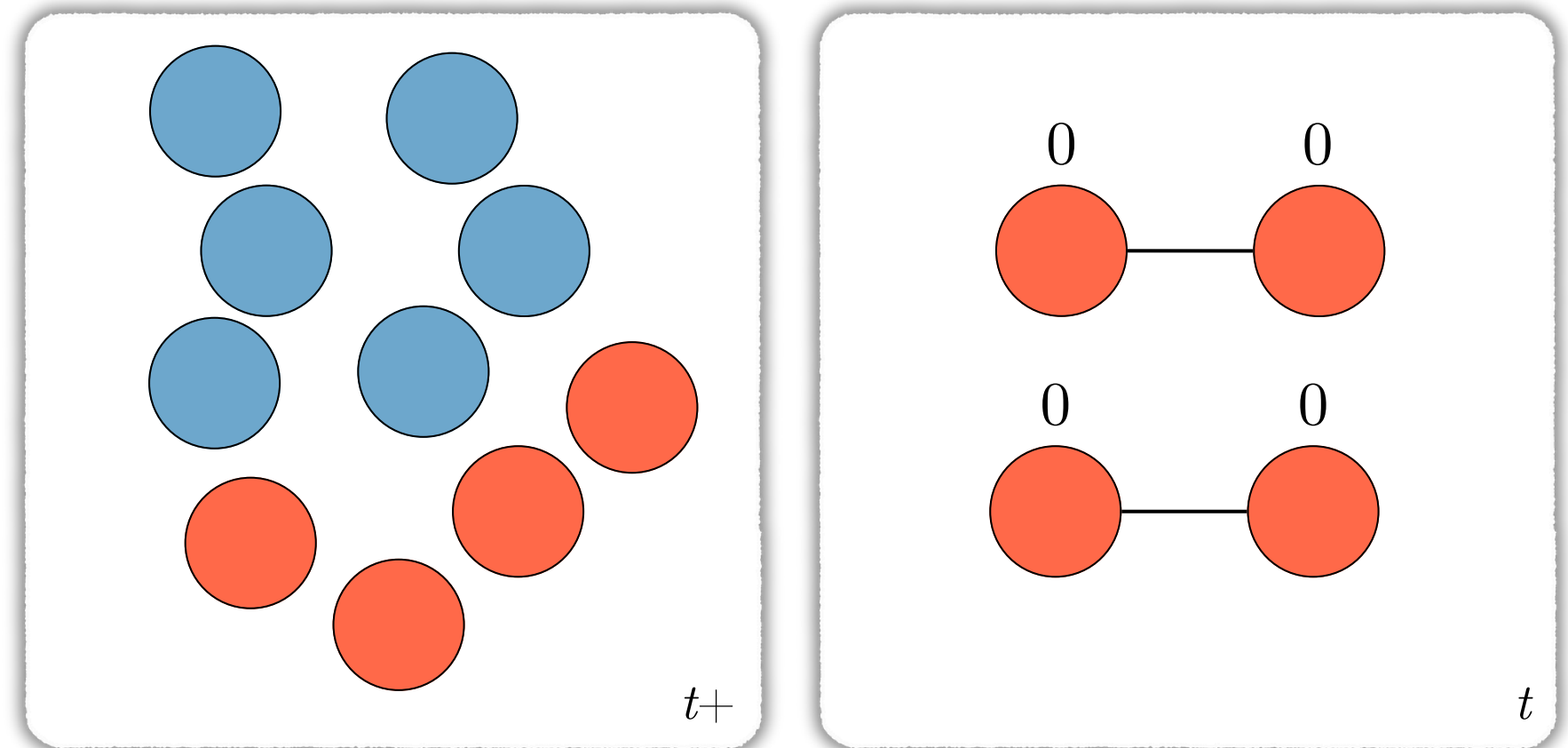
But it takes only one defector to infiltrate (e.g., through mutation, or deviation), and things go downhill.



# WHY WE CAN'T HAVE NICE THINGS

Note that, on average, a group of *only* cooperators does better than a group of defectors.

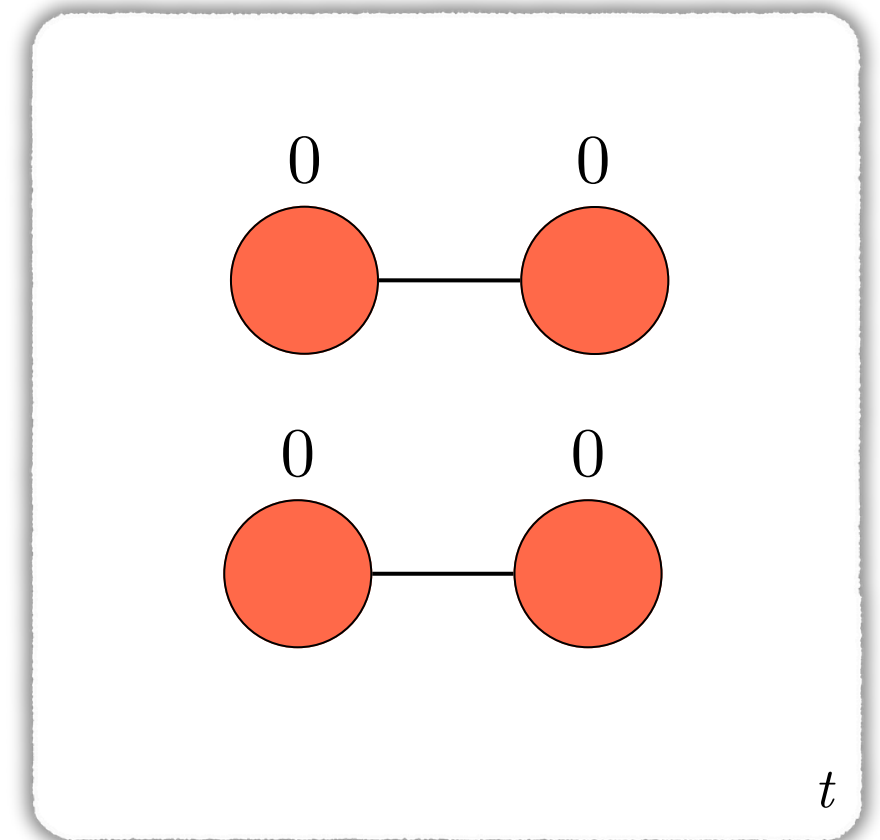
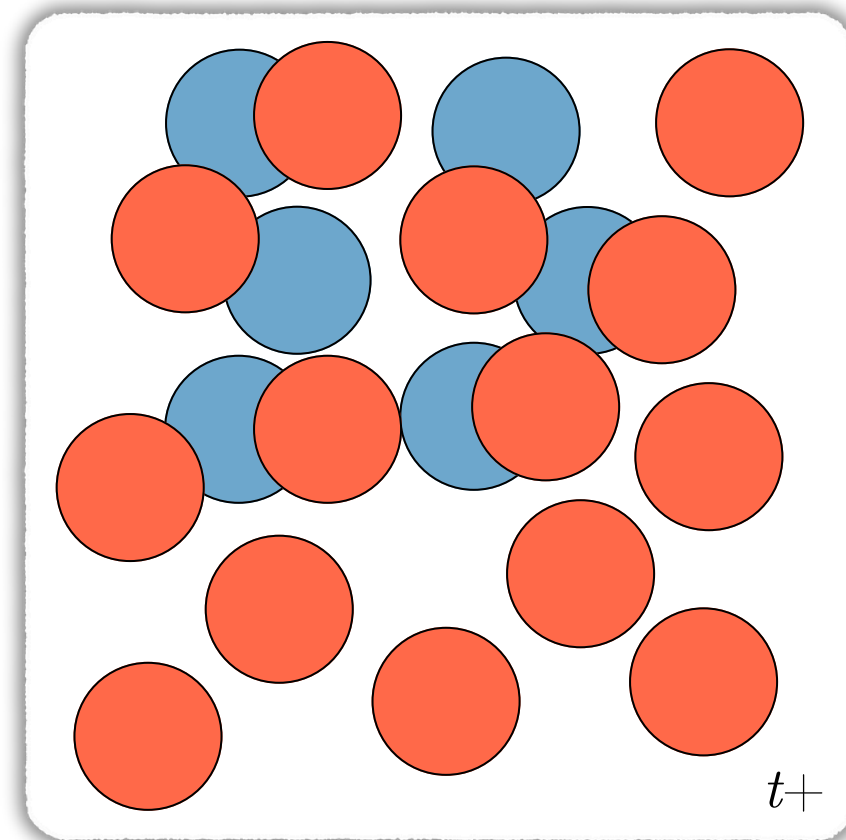
But it takes only one to defector to infiltrate (e.g., through mutation, or deviation), and things go downhill.



# WHY WE CAN'T HAVE NICE THINGS

Note that, on average, a group of *only* cooperators does better than a group of defectors.

But it takes only one to defector to infiltrate (e.g., through mutation, or deviation), and things go downhill.





JOHN MAYNARD-SMITH

This shows why cooperation might not survive, even though it's beneficial for the group.

In fancy terms, cooperation is not *evolutionarily stable*.

## **DEFINITION**

A strategy is *evolutionarily stable* if it resists invasion from small proportions of other strategies, when dominant.

But this also provides a hint for how to protect cooperation.

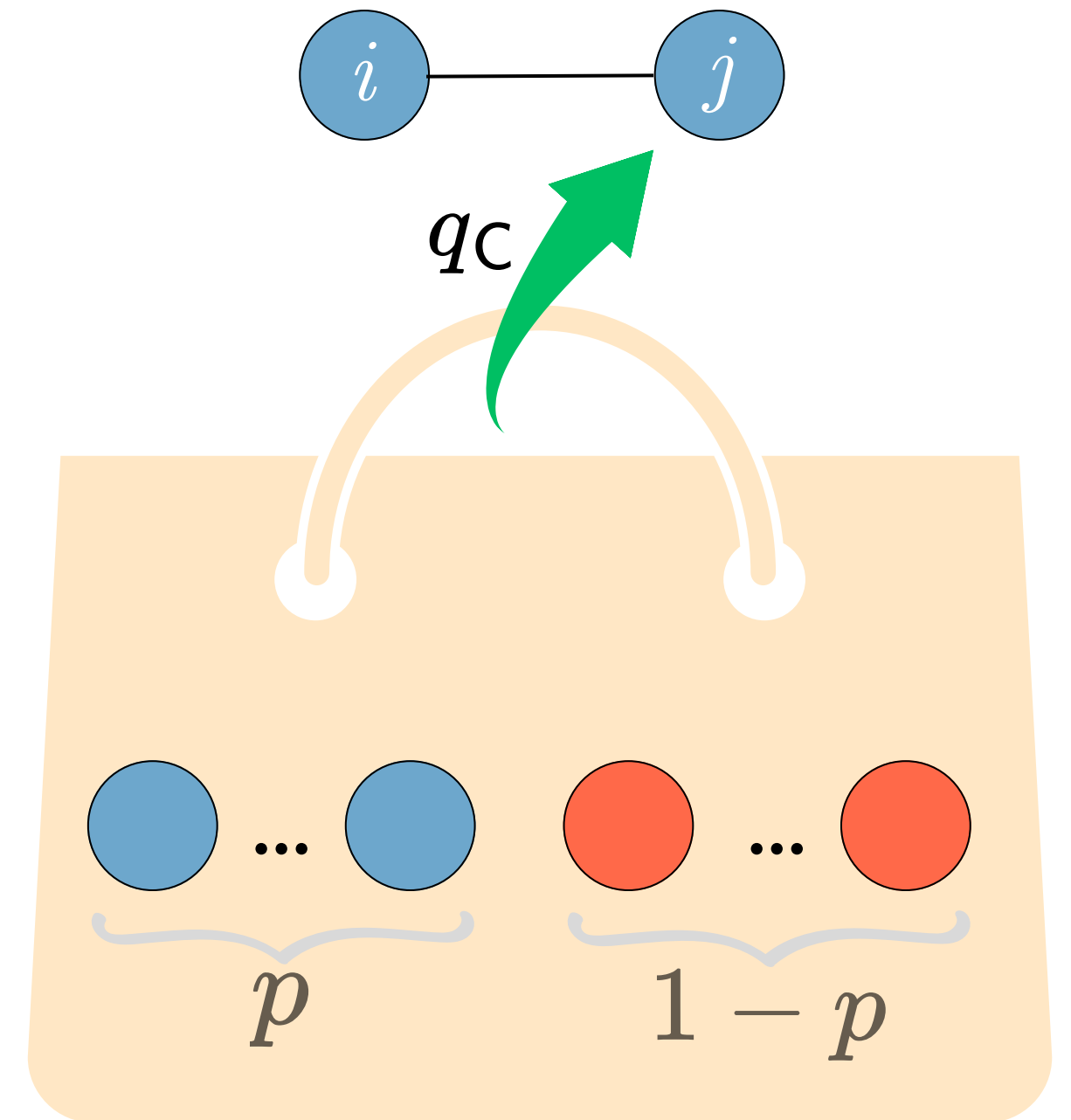
But this also provides a hint for how to protect cooperation. If cooperators could somehow manage to avoid interacting with defectors...

# GENERAL PAIRING PROBABILITIES

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = q_{\text{C}}, \quad \Pr[j = \text{D} \mid i = \text{C}] = 1 - q_{\text{C}},$$

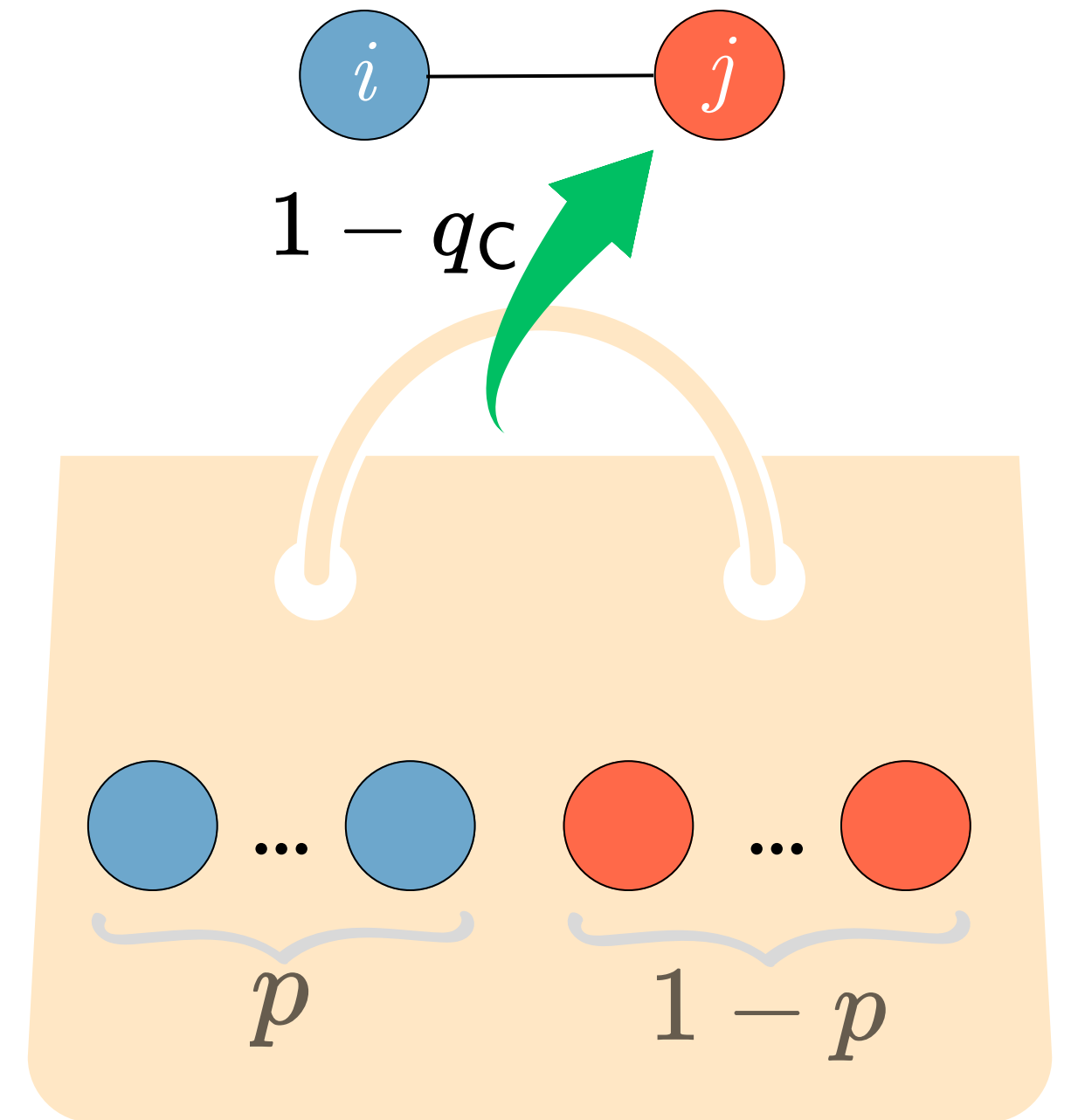


# GENERAL PAIRING PROBABILITIES

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = q_{\text{C}}, \quad \Pr[j = \text{D} \mid i = \text{C}] = 1 - q_{\text{C}},$$



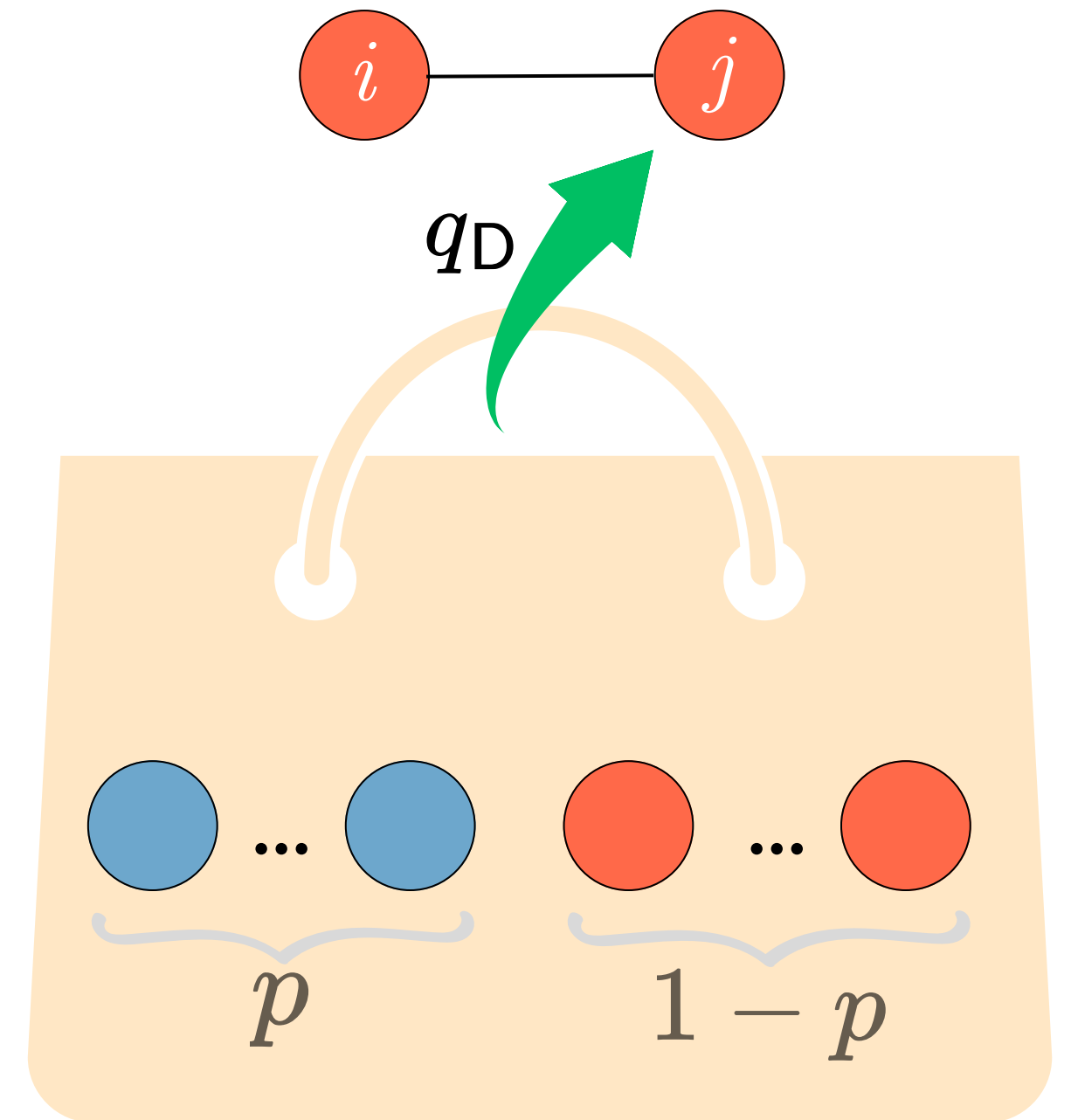
# GENERAL PAIRING PROBABILITIES

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = q_{\text{C}}, \quad \Pr[j = \text{D} \mid i = \text{C}] = 1 - q_{\text{C}},$$

$$\Pr[j = \text{D} \mid i = \text{D}] = q_{\text{D}}, \quad \Pr[j = \text{C} \mid i = \text{D}] = 1 - q_{\text{D}}.$$



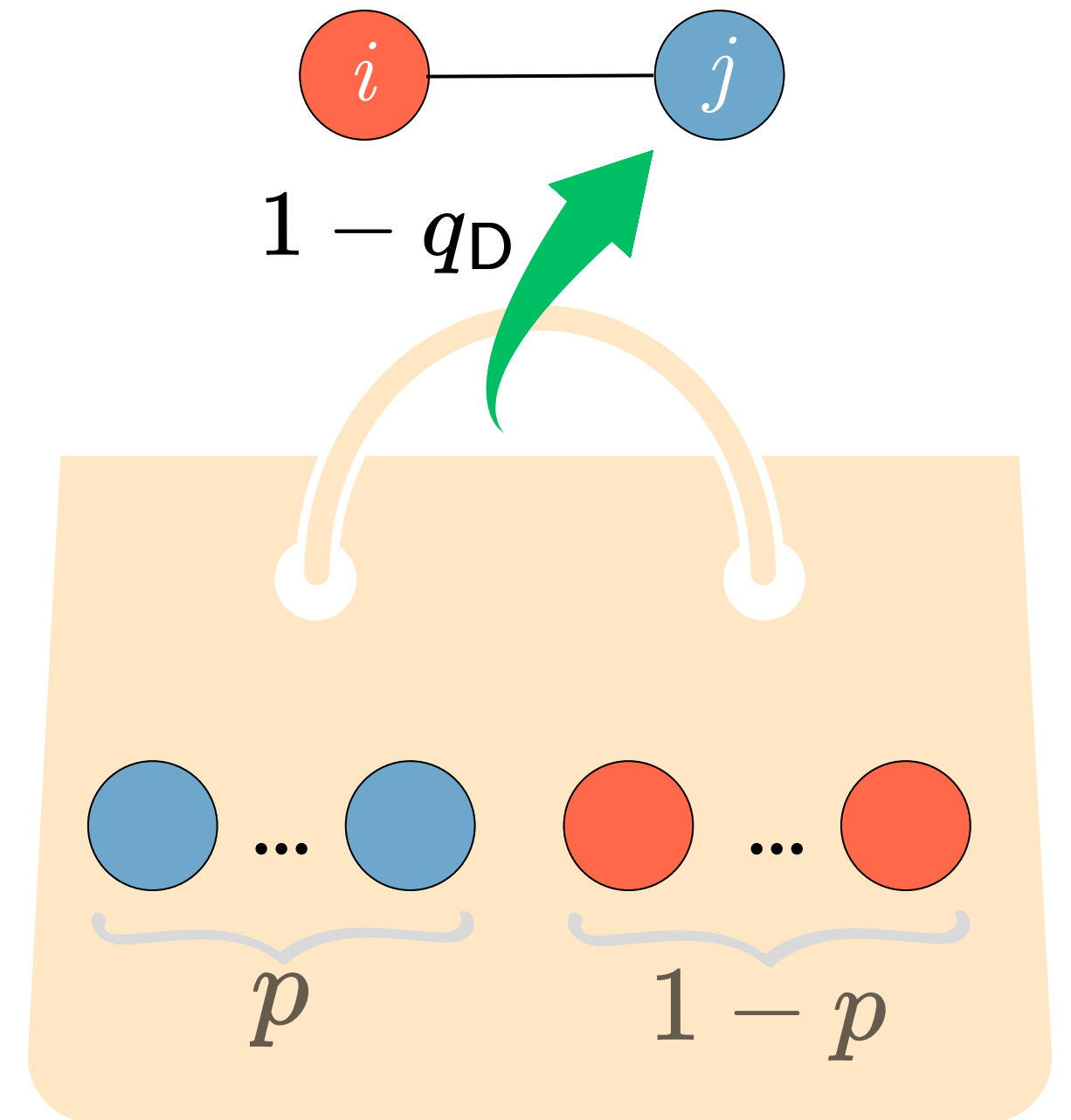
# GENERAL PAIRING PROBABILITIES

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = q_{\text{C}}, \quad \Pr[j = \text{D} \mid i = \text{C}] = 1 - q_{\text{C}},$$

$$\Pr[j = \text{D} \mid i = \text{D}] = q_{\text{D}}, \quad \Pr[j = \text{C} \mid i = \text{D}] = 1 - q_{\text{D}}.$$



# GENERAL PAIRING PROBABILITIES

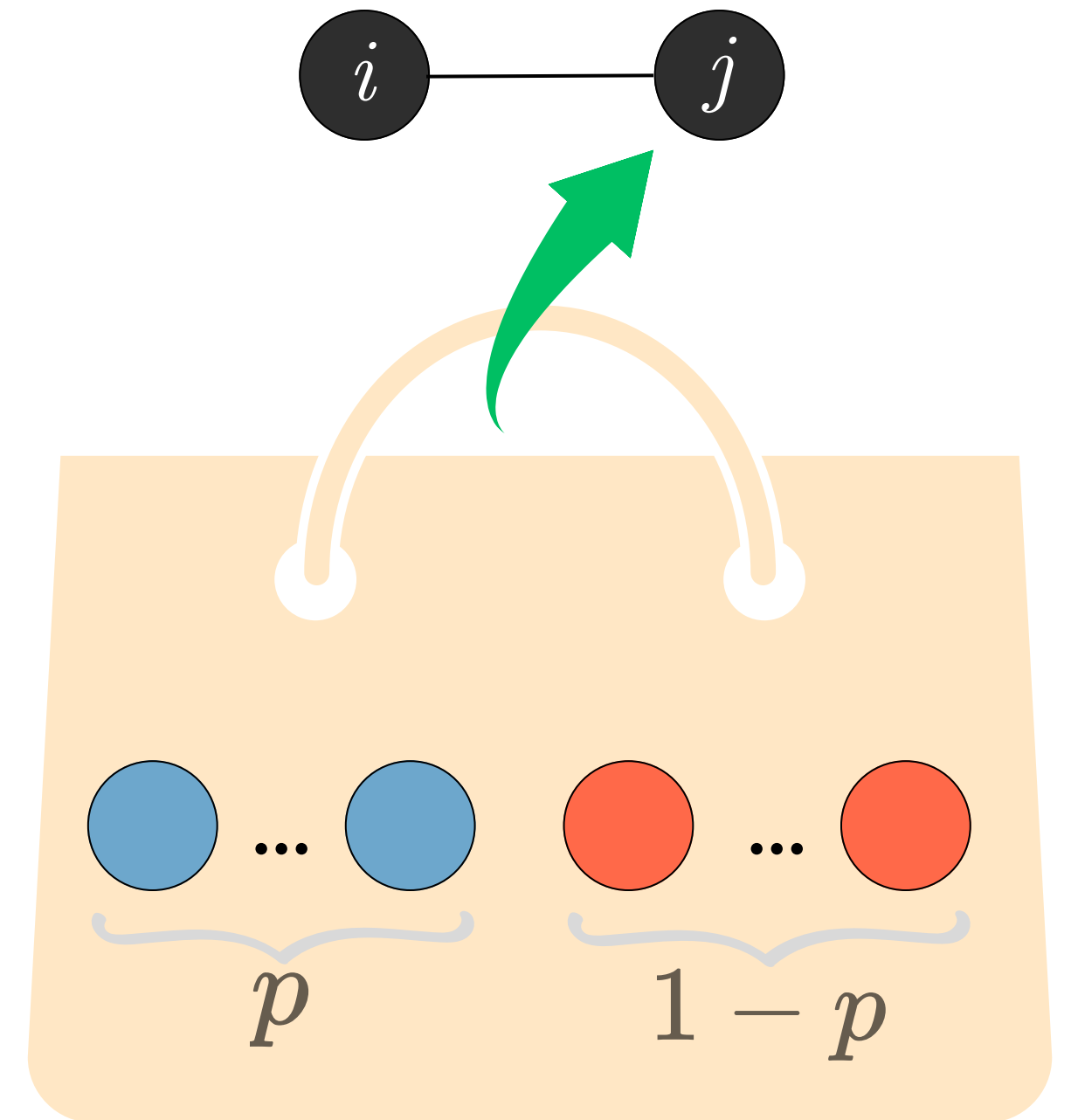
There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= q_{\text{C}}, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - q_{\text{C}}, \\ \Pr[j = \text{D} \mid i = \text{D}] &= q_{\text{D}}, & \Pr[j = \text{C} \mid i = \text{D}] &= 1 - q_{\text{D}}.\end{aligned}$$

The expected payoffs are:

$$\begin{aligned}\mathbb{E}[\text{C}] &= u(\text{C}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{C}] + u(\text{C}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{C}] \\ &= (b - c) \cdot q_{\text{C}} + (-c) \cdot (1 - q_{\text{C}}) \\ &= b \cdot q_{\text{C}} - c \\ \mathbb{E}[\text{D}] &= u(\text{D}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{D}] + u(\text{D}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{D}] \\ &= b \cdot (1 - q_{\text{D}}) + 0 \cdot q_{\text{D}} \\ &= b - b \cdot q_{\text{D}}.\end{aligned}$$



# GENERAL PAIRING PROBABILITIES

There are  $p$  cooperators and  $1 - p$  defectors. The focal agent  $i$  is paired with another agent  $j$ .

Write general terms for the pairing probabilities:

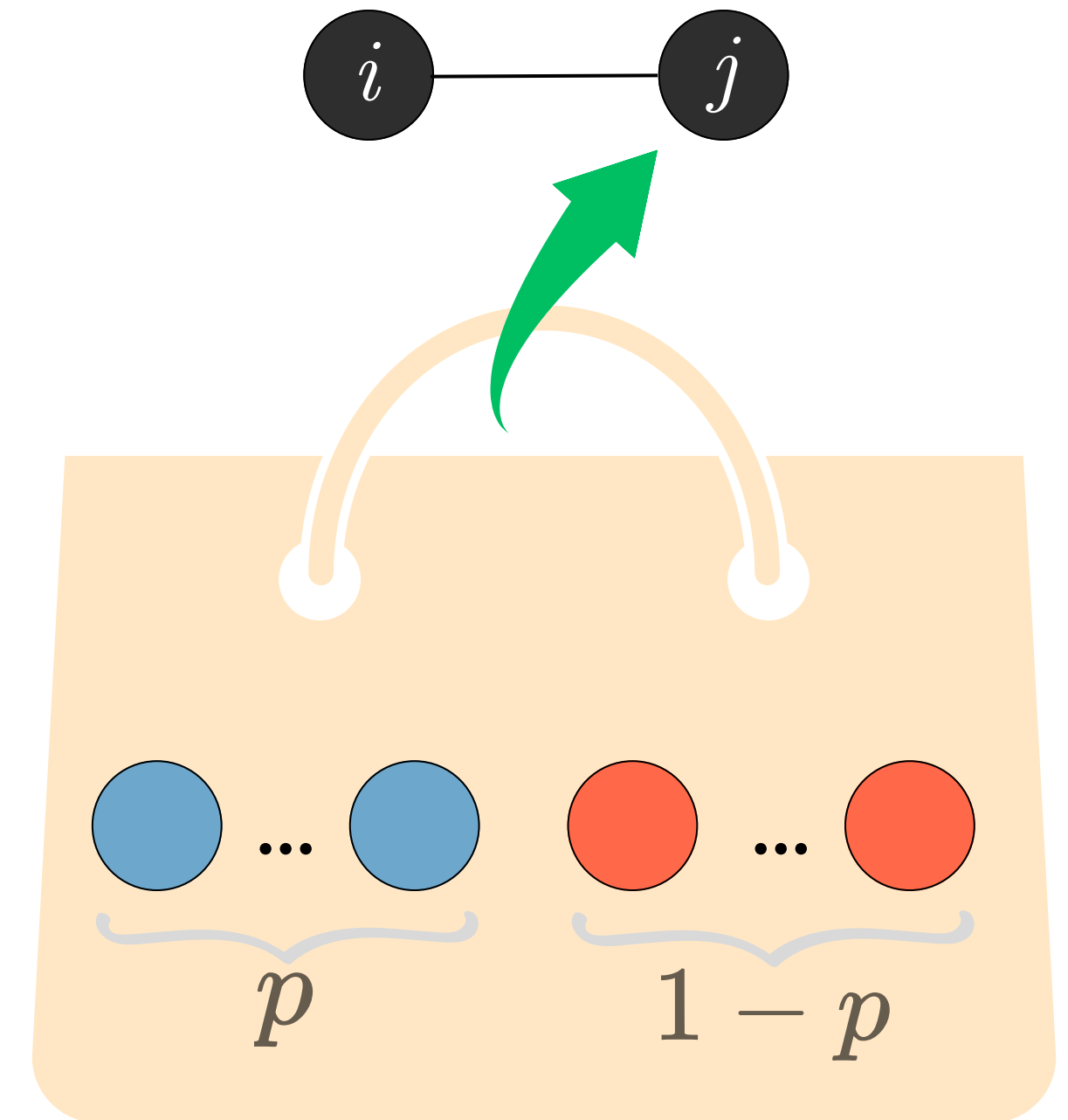
$$\begin{aligned}\Pr[j = \text{C} \mid i = \text{C}] &= q_{\text{C}}, & \Pr[j = \text{D} \mid i = \text{C}] &= 1 - q_{\text{C}}, \\ \Pr[j = \text{D} \mid i = \text{D}] &= q_{\text{D}}, & \Pr[j = \text{C} \mid i = \text{D}] &= 1 - q_{\text{D}}.\end{aligned}$$

The expected payoffs are:

$$\begin{aligned}\mathbb{E}[\text{C}] &= u(\text{C}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{C}] + u(\text{C}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{C}] \\ &= (b - c) \cdot q_{\text{C}} + (-c) \cdot (1 - q_{\text{C}}) \\ &= b \cdot q_{\text{C}} - c \\ \mathbb{E}[\text{D}] &= u(\text{D}, \text{C}) \cdot \Pr[j = \text{C} \mid i = \text{D}] + u(\text{D}, \text{D}) \cdot \Pr[j = \text{D} \mid i = \text{D}] \\ &= b \cdot (1 - q_{\text{D}}) + 0 \cdot q_{\text{D}} \\ &= b - b \cdot q_{\text{D}}.\end{aligned}$$

Cooperation survives if:

$$\begin{aligned}\mathbb{E}[\text{C}] > \mathbb{E}[\text{D}] &\text{ iff } b \cdot q_{\text{C}} - c > b - b \cdot q_{\text{D}} \\ &\text{ iff } q_{\text{C}} - (1 - q_{\text{D}}) > \frac{c}{b}.\end{aligned}$$



## THEOREM

Cooperation increases in frequency if and only if:

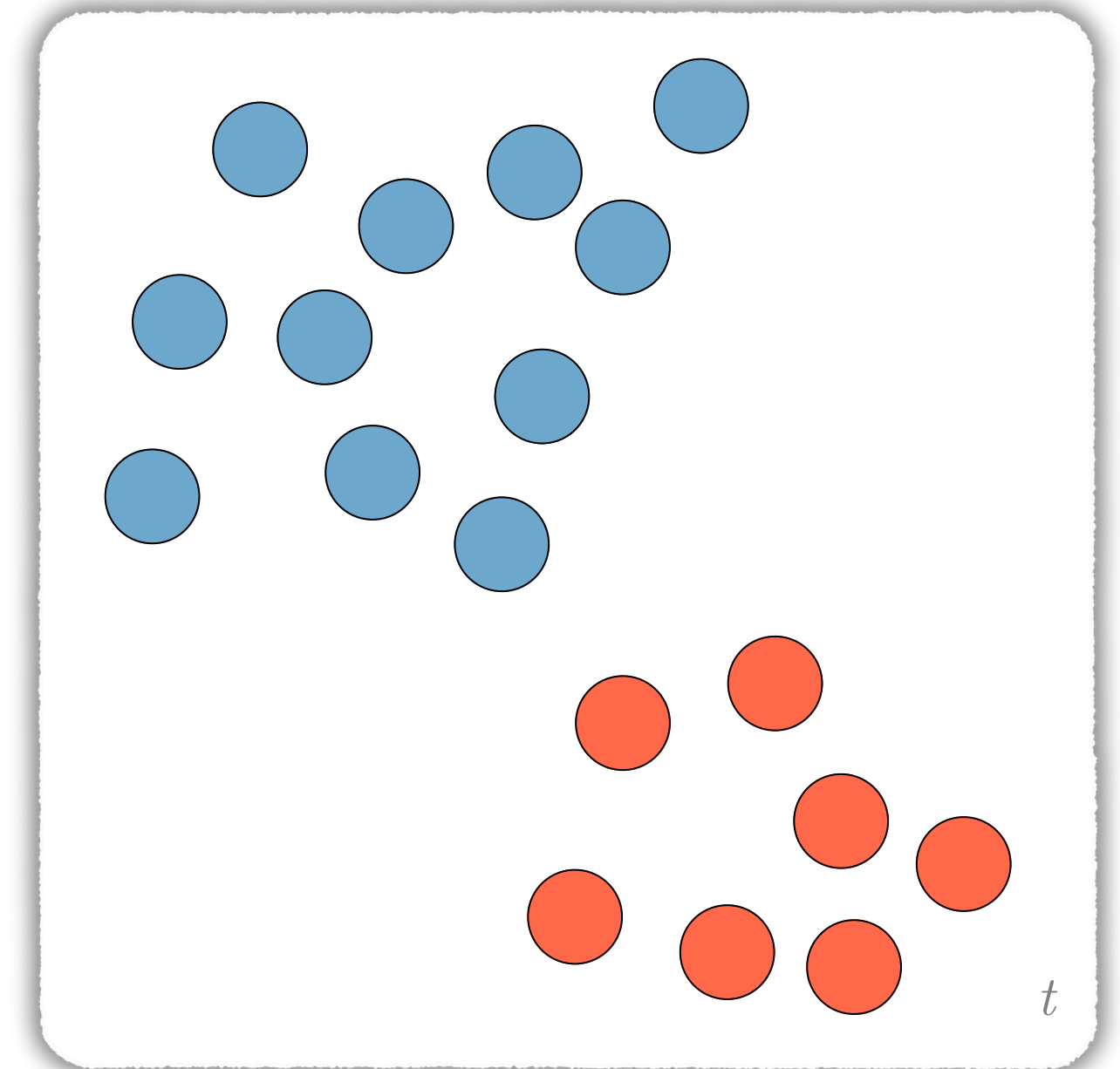
$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] - \Pr[j = \mathbf{C} \mid i = \mathbf{D}] > \frac{c}{b}.$$

In other words, cooperators can thrive if the probability of interacting with other cooperators is higher than the probability of defectors interacting with cooperators.

In other words, cooperators can thrive if the probability of interacting with other cooperators is higher than the probability of defectors interacting with cooperators. Cool, but where do these probabilities come from?...

# LIMITED DISPERSAL

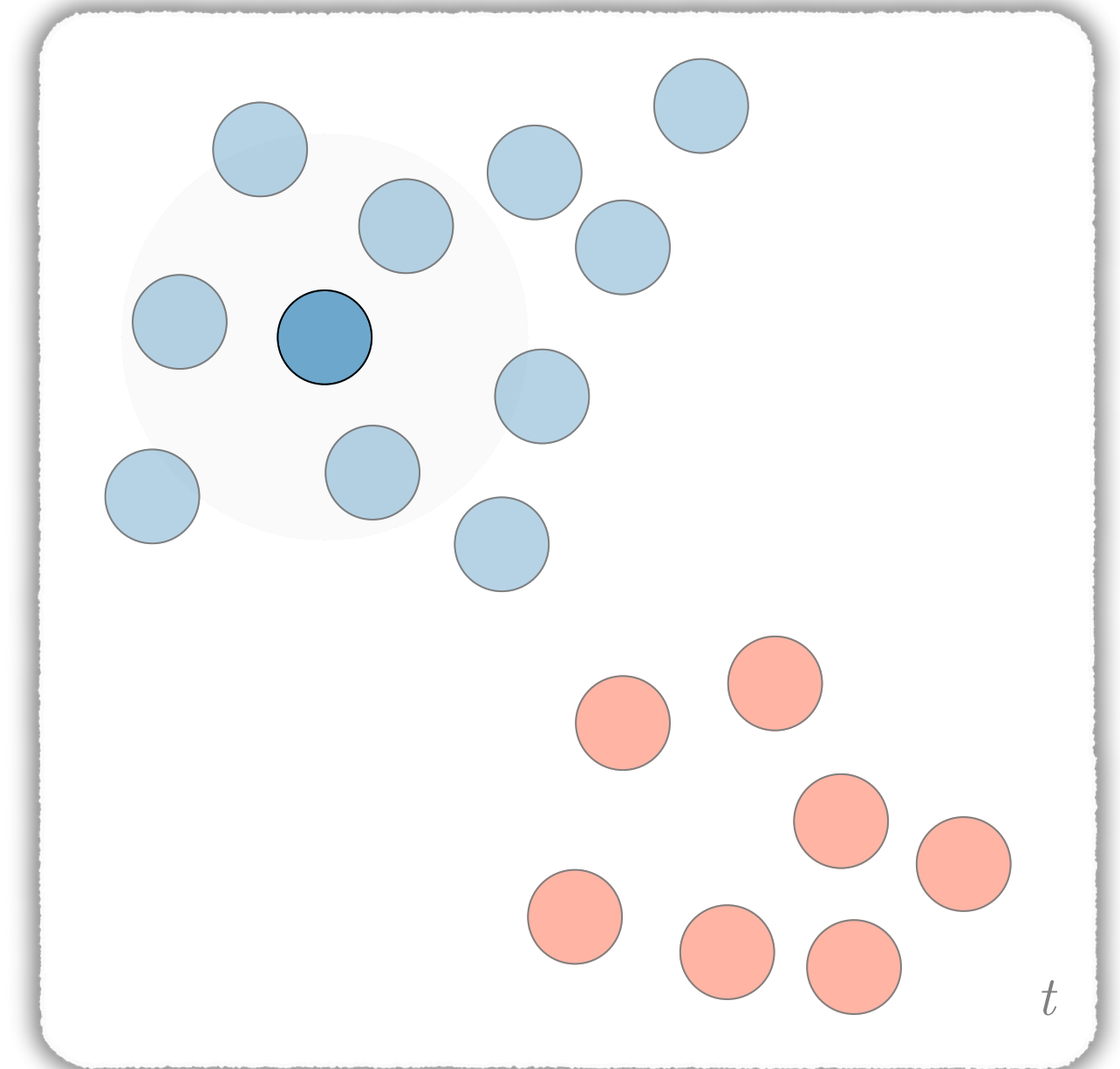
Suppose cooperators and defectors are segregated.



# LIMITED DISPERSAL

Suppose cooperators and defectors are segregated.

And agents are more likely to interact with 'nearby' agents.

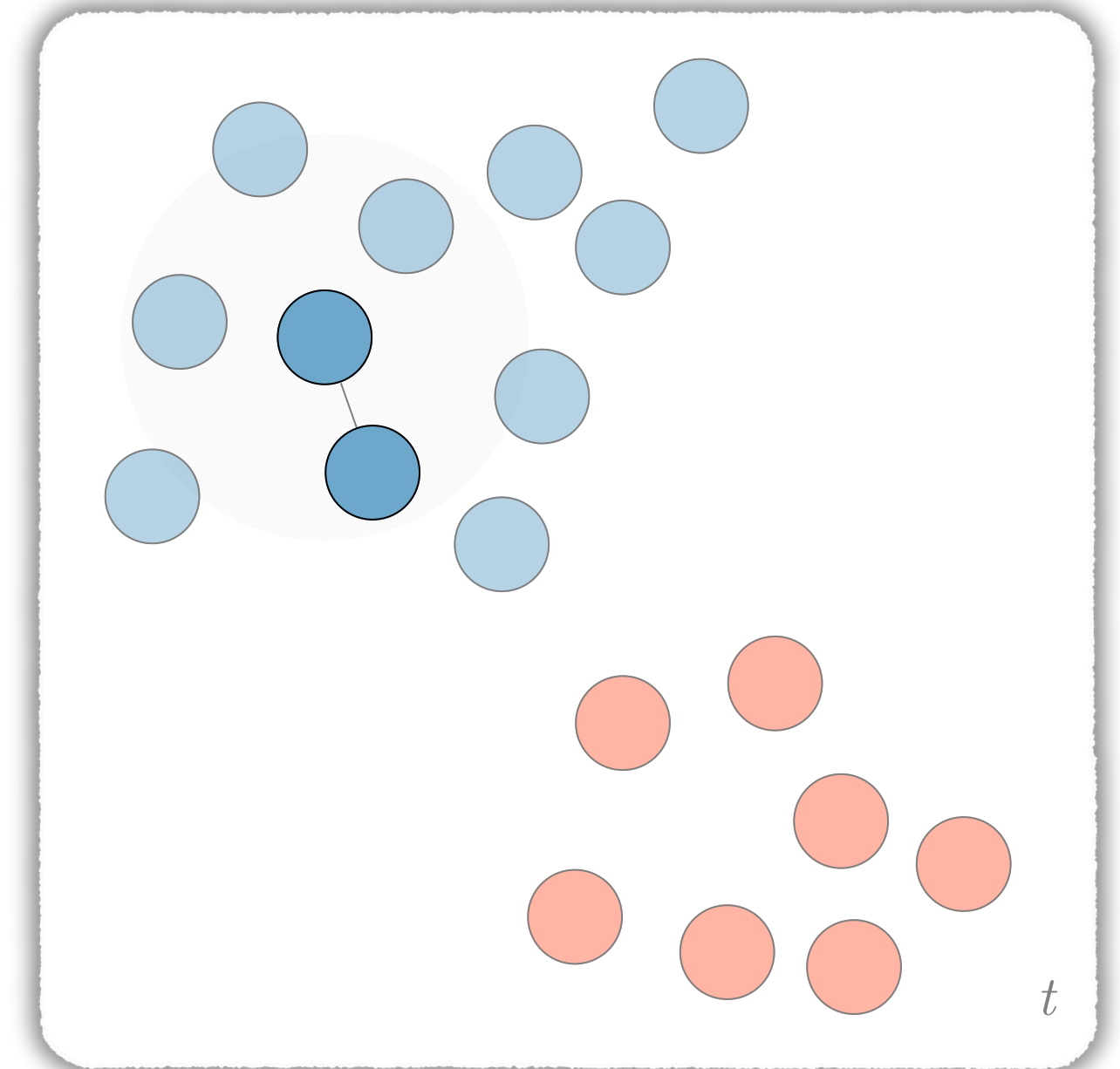


# LIMITED DISPERSAL

Suppose cooperators and defectors are segregated.

And agents are more likely to interact with 'nearby' agents.

This will lead to more interactions between agents that are alike.





W.D. HAMILTON

It could also happen if cooperation and defection are encoded as genetic traits...



W.D. HAMILTON

It could also happen if cooperation and defection are encoded as genetic traits...

... and cooperation genes learn to help copies of themselves.



W.D. HAMILTON

It could also happen if cooperation and defection are encoded as genetic traits...

... and cooperation genes learn to help copies of themselves.

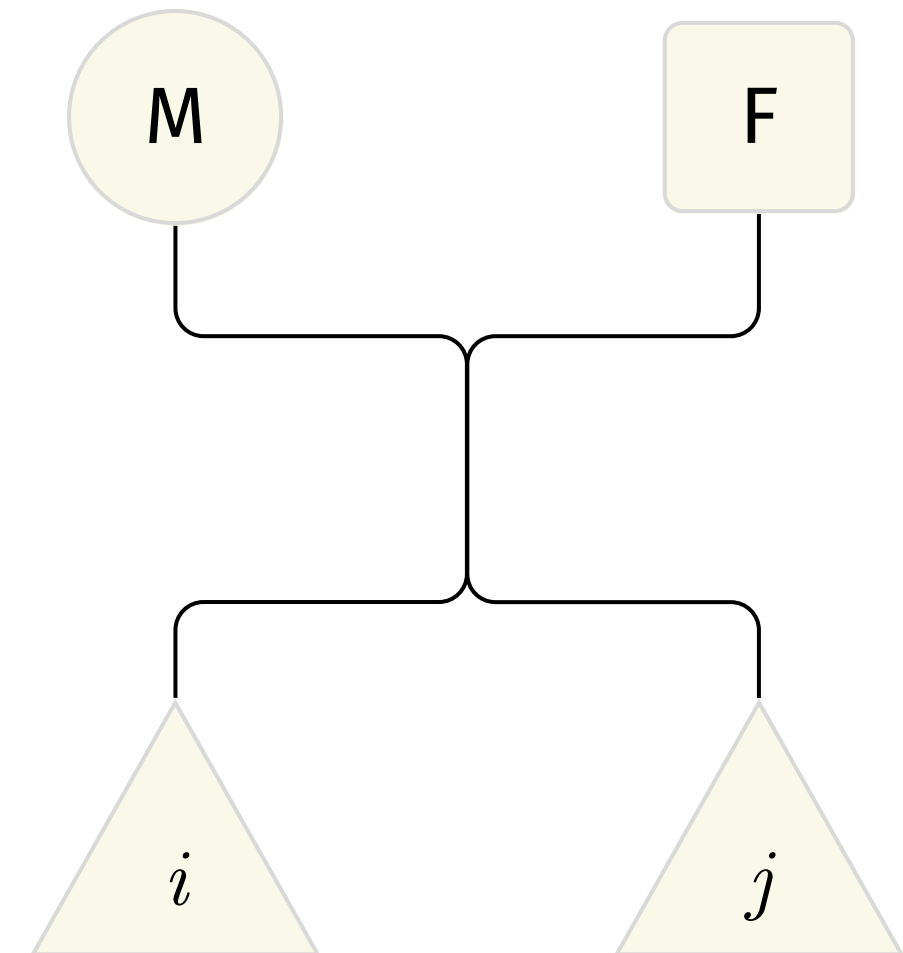
In other words, if agents recognize and preferentially interact with relatives (kin).

In biological terms, relatedness refers to the probability of sharing a gene by *common descent*.

In biological terms, relatedness refers to the probability of sharing a gene by *common descent*. That is, a gene inherited from a common ancestor: a parent, grandparent, etc.

# INHERITANCE BY COMMON DESCENT

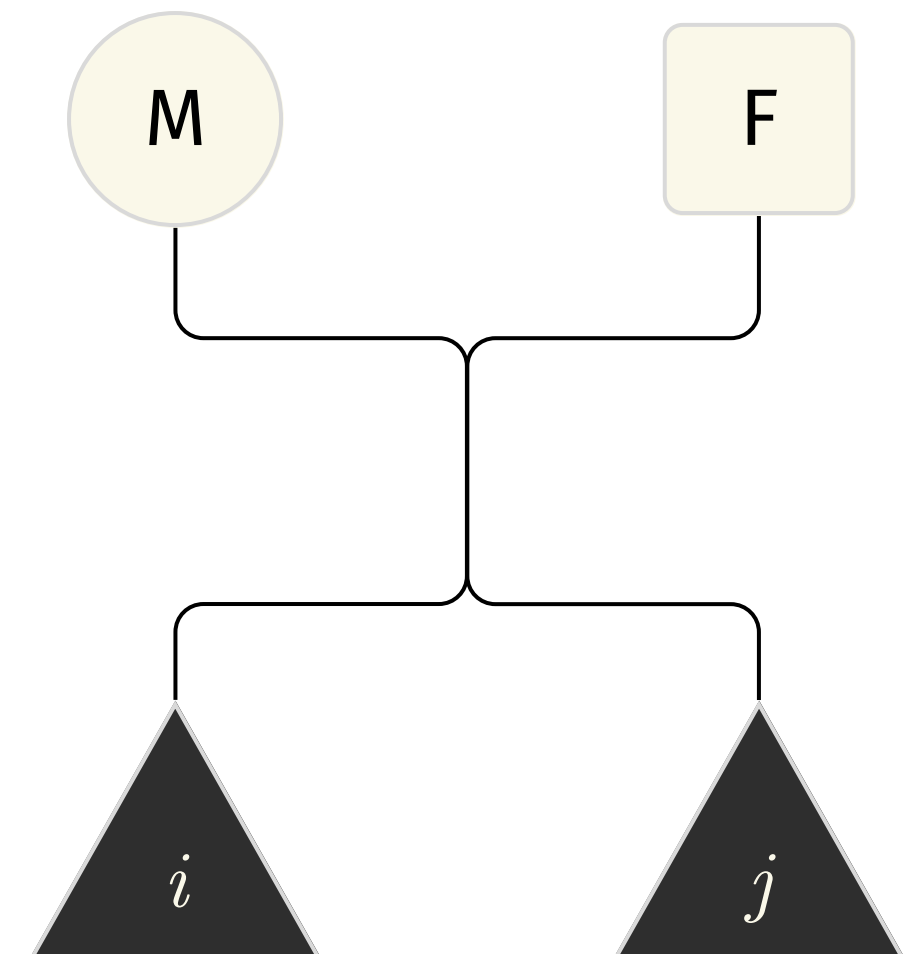
Take full siblings  $i$  and  $j$ .



# INHERITANCE BY COMMON DESCENT

Take full siblings  $i$  and  $j$ .

Suppose  $i$  and  $j$  share the same gene.

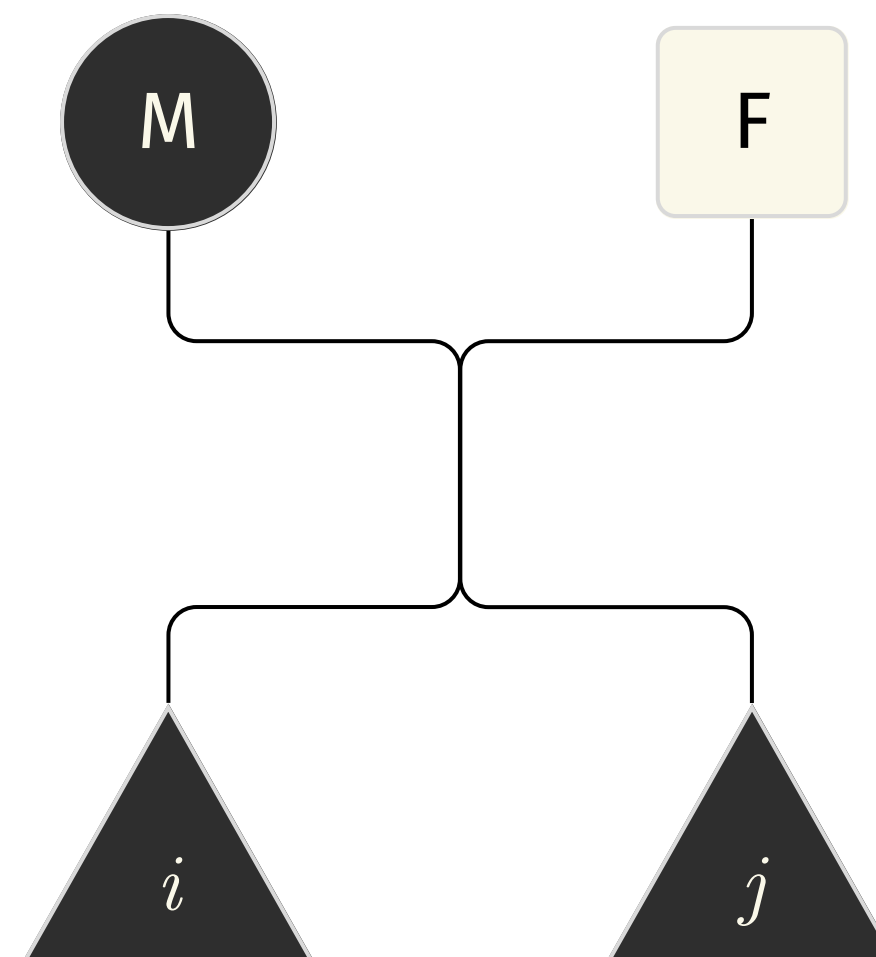


# INHERITANCE BY COMMON DESCENT

Take full siblings  $i$  and  $j$ .

Suppose  $i$  and  $j$  share the same gene.

The probability that the mother passes the gene to both  $i$  and  $j$  is  $1/2 \cdot 1/2 = 1/4$ .



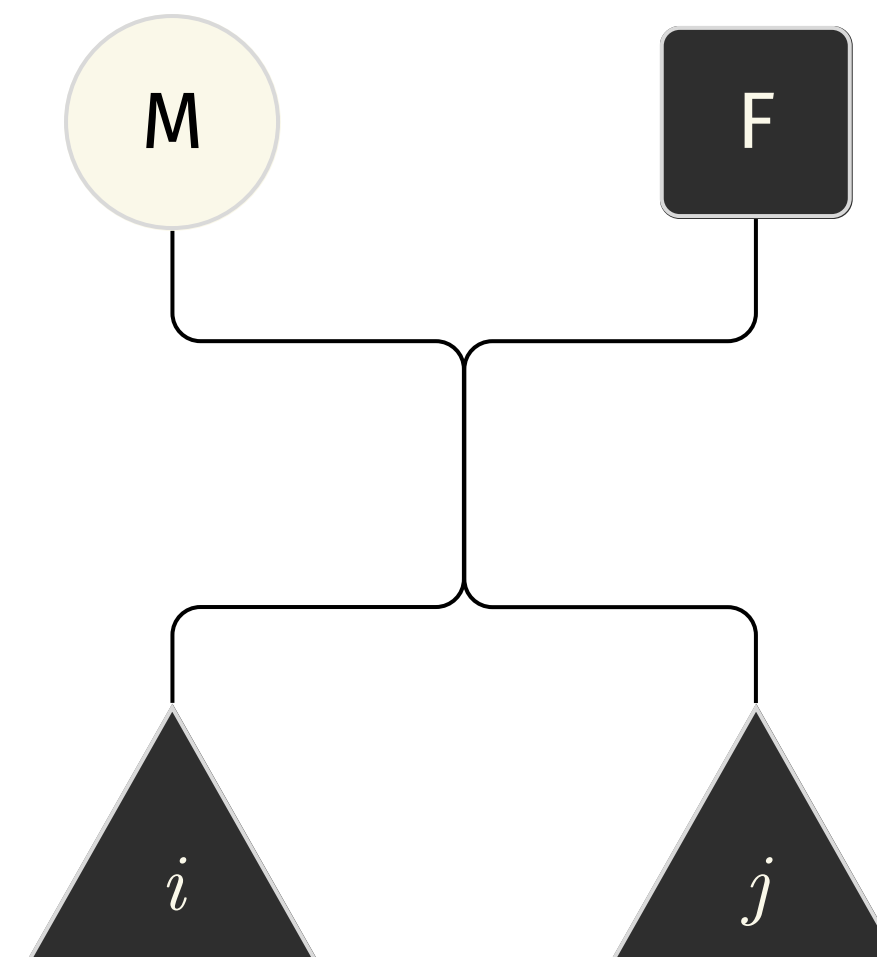
# INHERITANCE BY COMMON DESCENT

Take full siblings  $i$  and  $j$ .

Suppose  $i$  and  $j$  share the same gene.

The probability that the mother passes the gene to both  $i$  and  $j$  is  $1/2 \cdot 1/2 = 1/4$ .

The probability that the father passes the gene to both  $i$  and  $j$  is  $1/2 \cdot 1/2 = 1/4$ .



# INHERITANCE BY COMMON DESCENT

Take full siblings  $i$  and  $j$ .

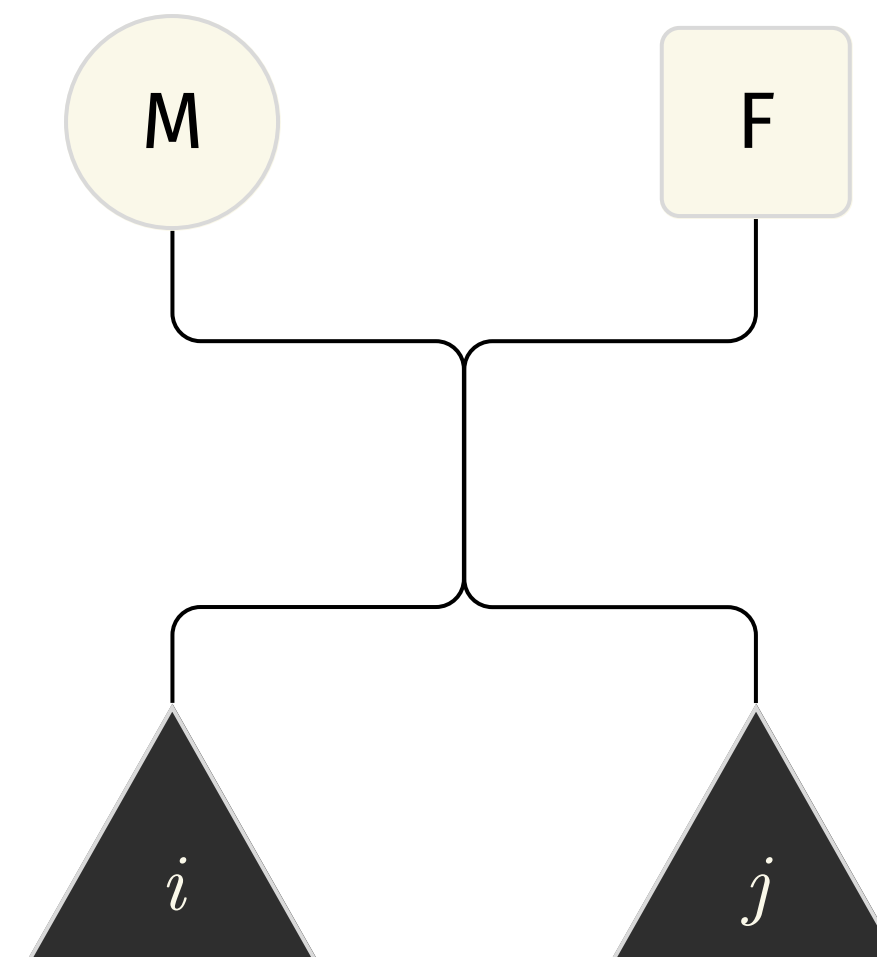
Suppose  $i$  and  $j$  share the same gene.

The probability that the mother passes the gene to both  $i$  and  $j$  is  $1/2 \cdot 1/2 = 1/4$ .

The probability that the father passes the gene to both  $i$  and  $j$  is  $1/2 \cdot 1/2 = 1/4$ .

The probability that  $i$  and  $j$  share the same gene by common descent is:

$$\frac{1}{4} + \frac{1}{4} = \frac{1}{2}.$$



# RELATEDNESS

*Genetic relatedness*  $r$  is the probability that two individuals share genes identical by descent.

# RELATEDNESS

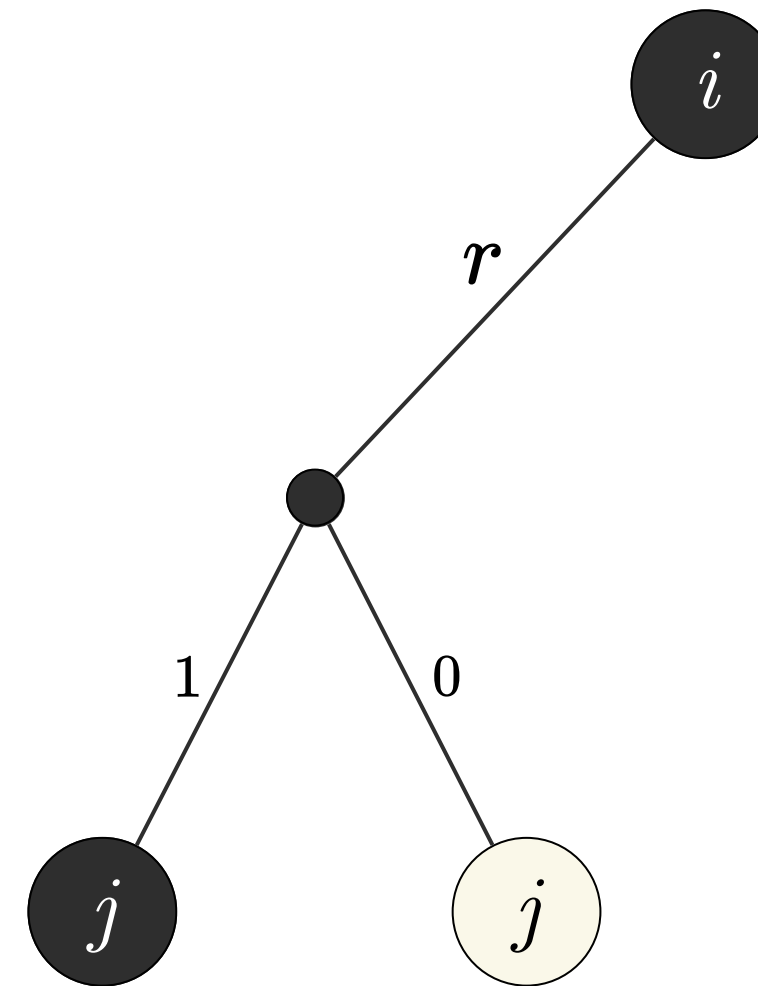
*Genetic relatedness*  $r$  is the probability that two individuals share genes identical by descent.

In general, we can calculate  $r$  for any two individuals.

RELATION	$r$
oneself	1
full siblings	$\frac{1}{2}$
parent-child	$\frac{1}{2}$
grandparent-grandchild	$\frac{1}{4}$
cousins	$\frac{1}{8}$
...	

# KIN SELECTION

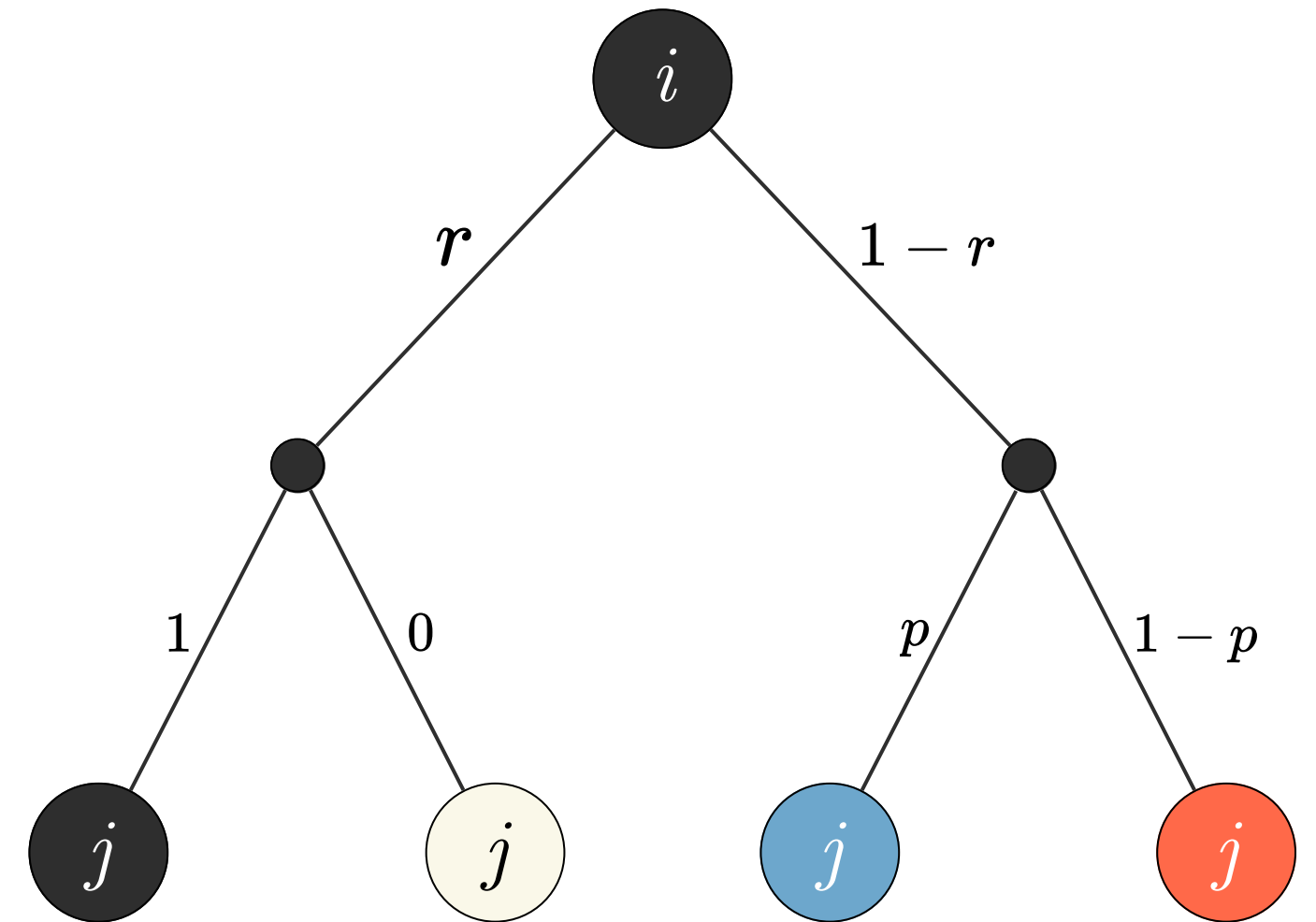
There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.



# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.



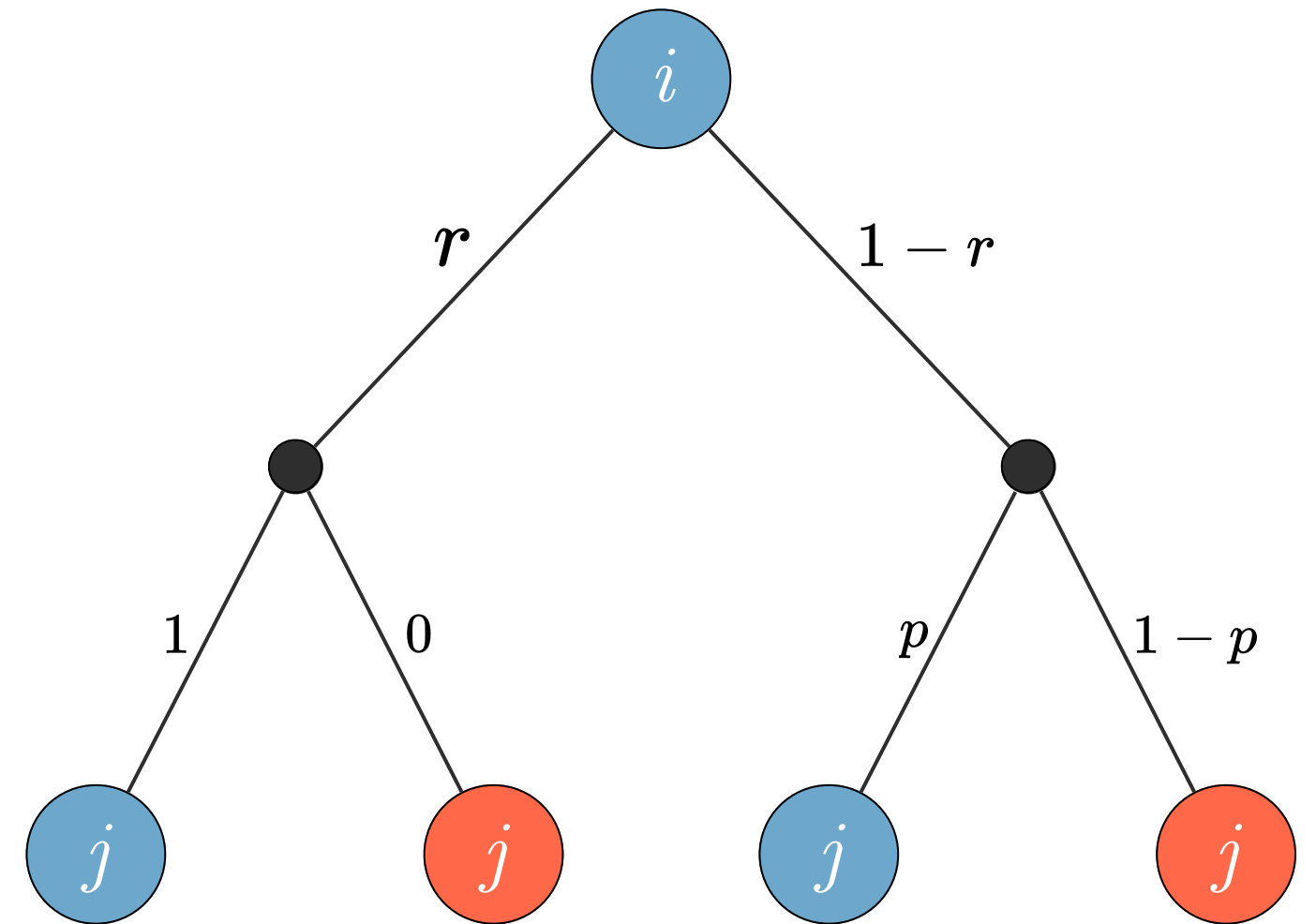
# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

This makes the pairing probabilities:

$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] =$$



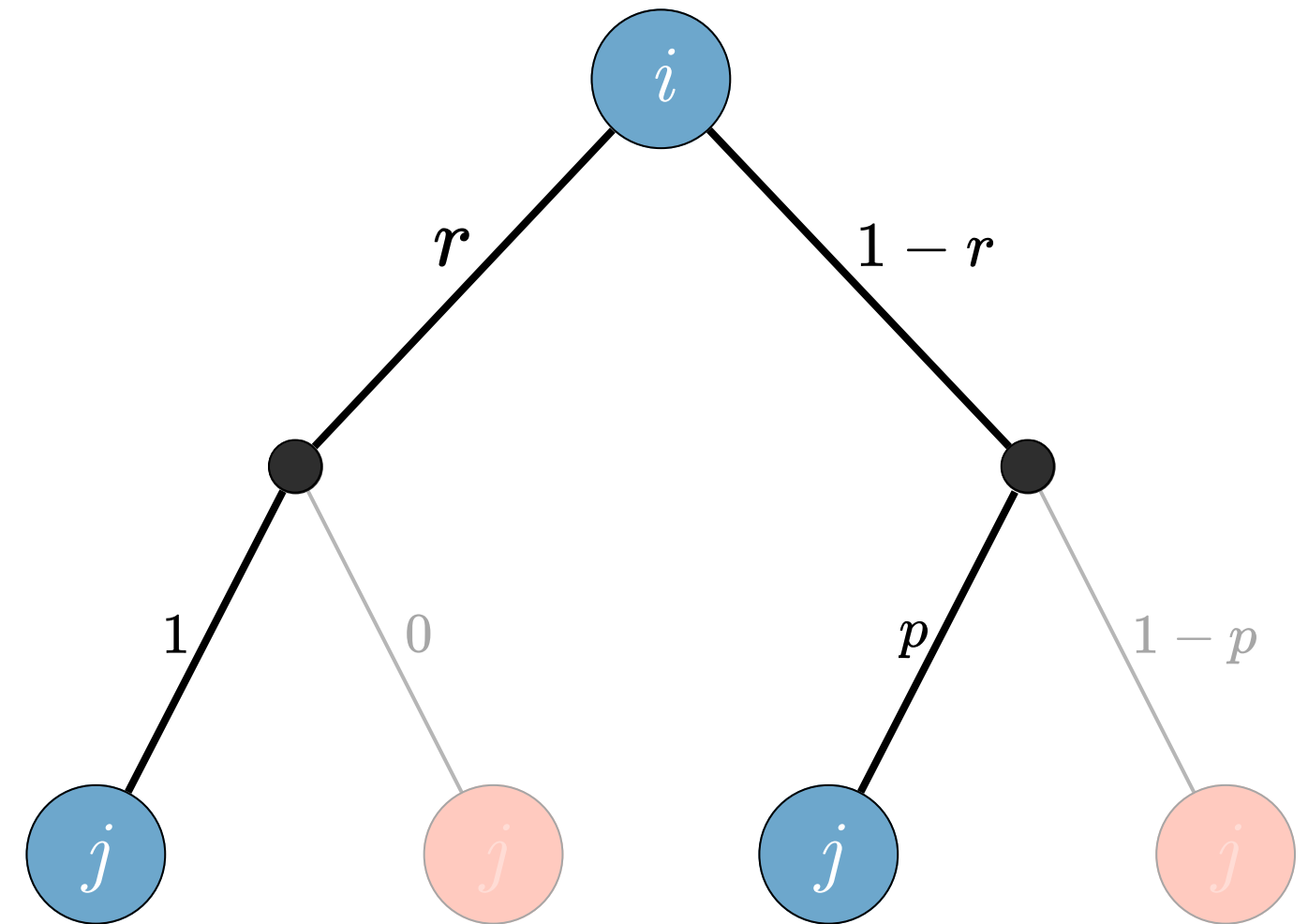
# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

This makes the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = r \cdot 1 + (1 - r) \cdot p,$$



# KIN SELECTION

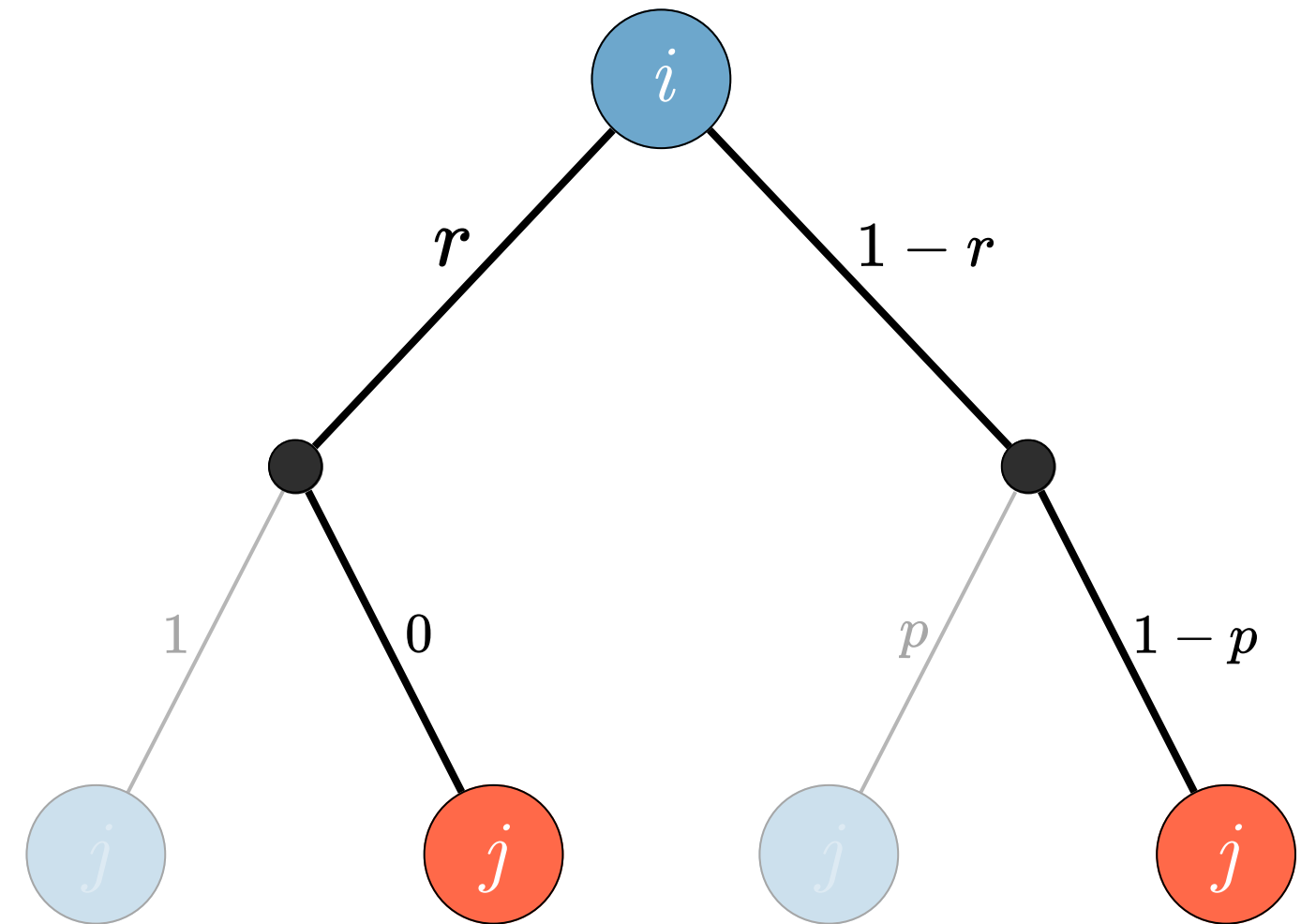
There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

This makes the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \text{D} \mid i = \text{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$



# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

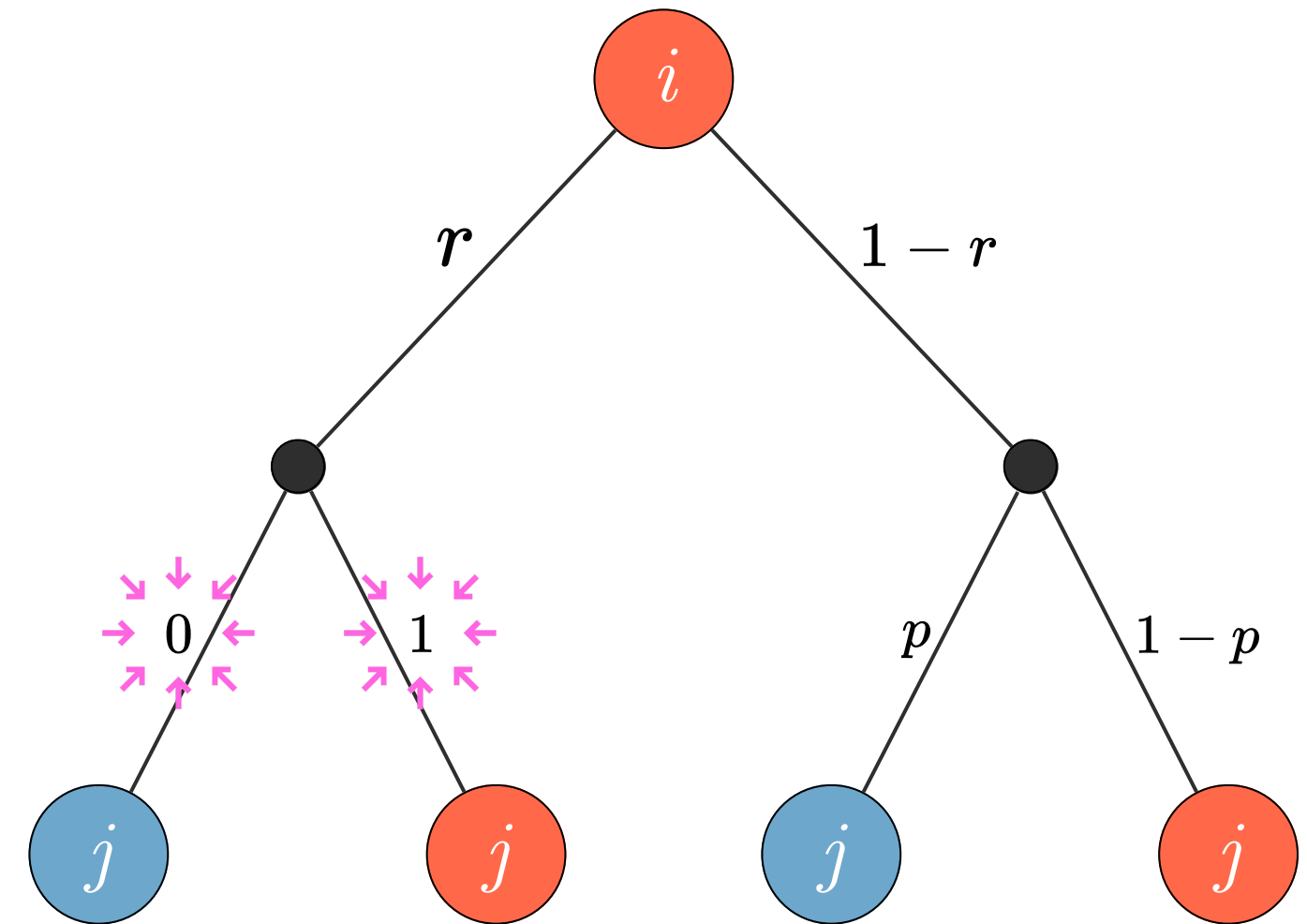
But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

This makes the pairing probabilities:

$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{D}] =$$



# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

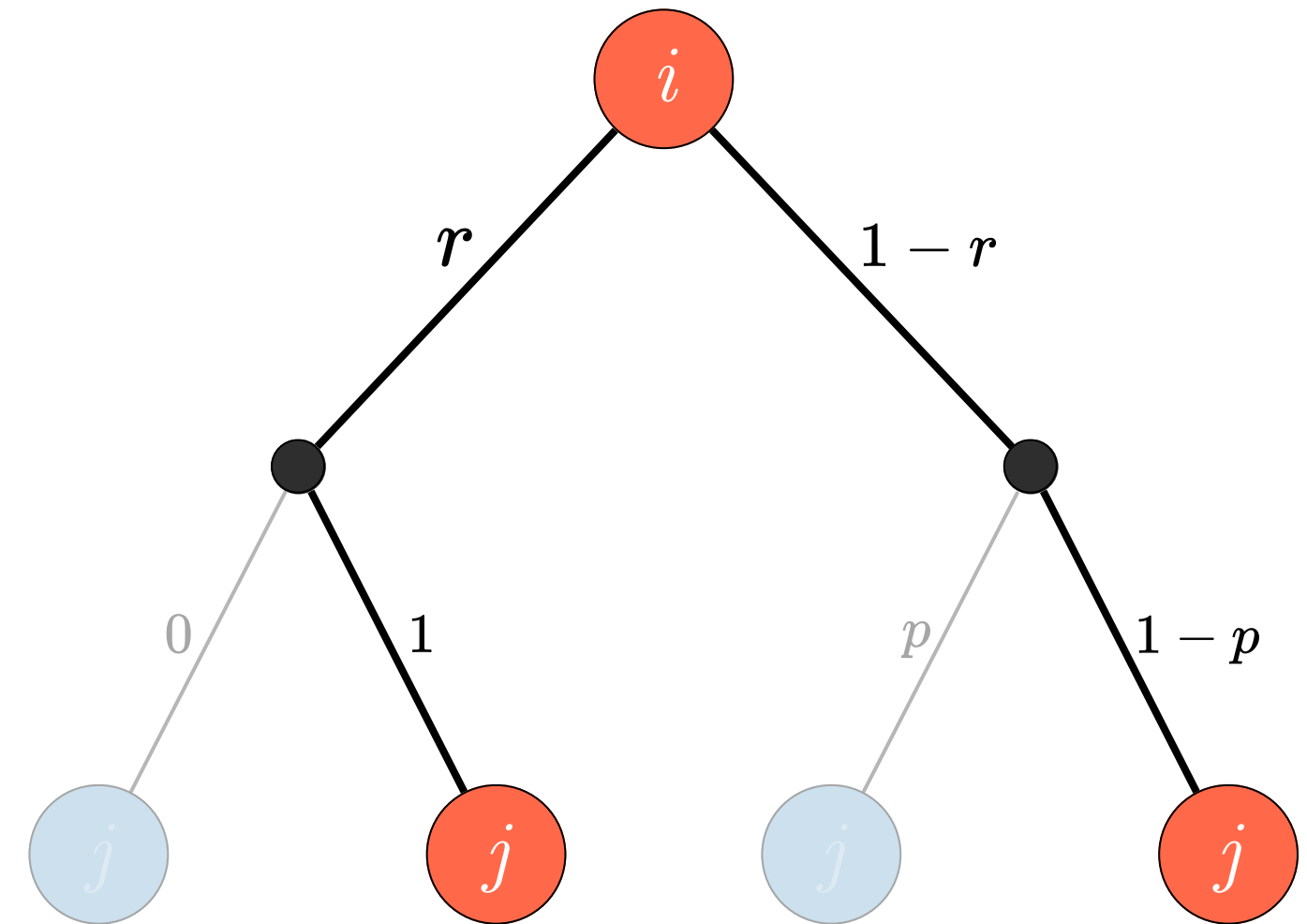
But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

This makes the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \text{D} \mid i = \text{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \text{D} \mid i = \text{D}] = r \cdot 1 + (1 - r) \cdot (1 - p),$$



# KIN SELECTION

There is a *relatedness factor*  $r$ , the probability that  $j$  and  $i$  share the same gene (i.e., strategy) by common descent. In this case  $i$  and  $j$  get paired for sure.

But  $i$  and  $j$  can get paired up even if they're not related by common descent, simply because the gene is common in the population:  $p$  cooperators,  $1 - p$  defectors.

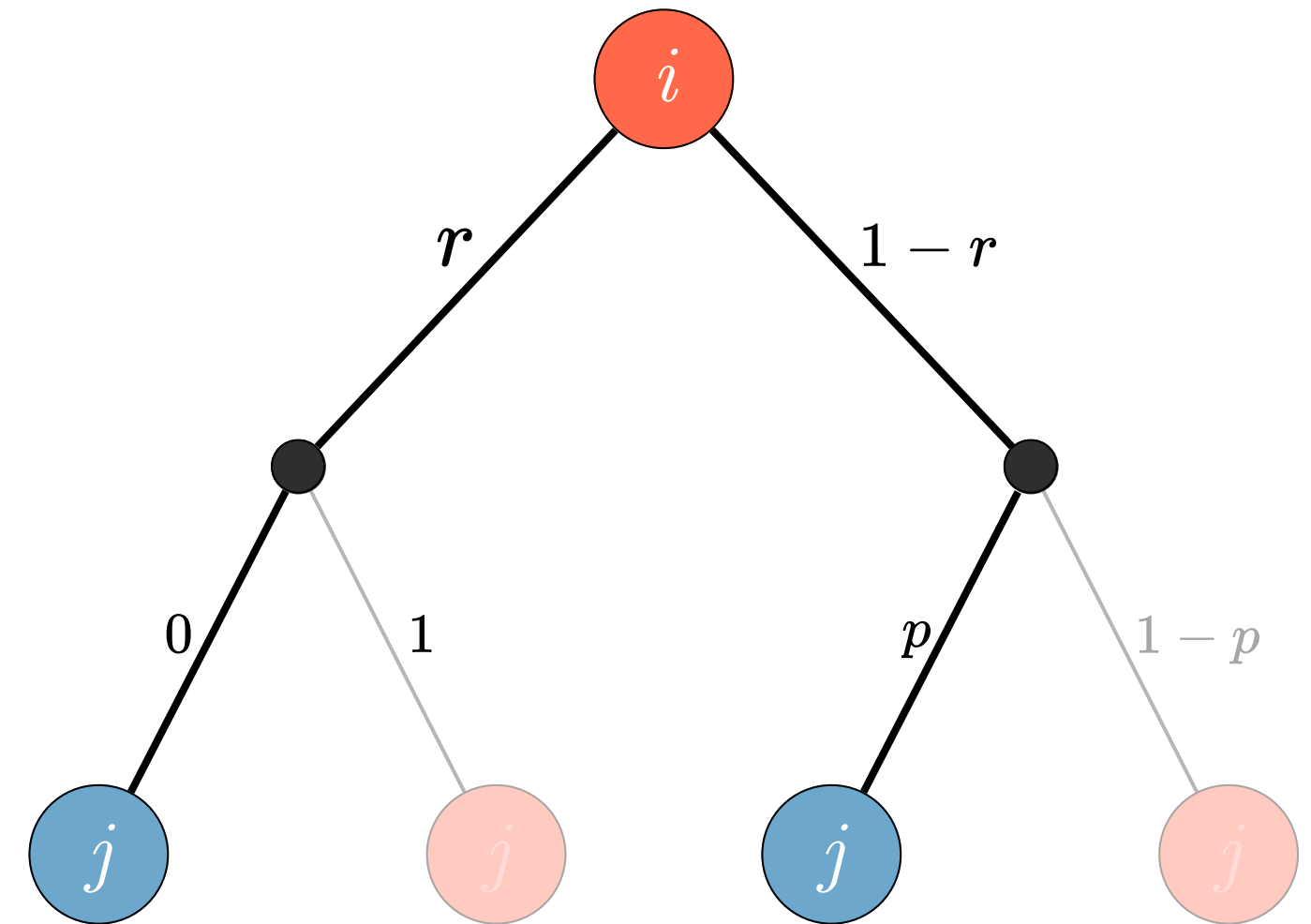
This makes the pairing probabilities:

$$\Pr[j = \text{C} \mid i = \text{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \text{D} \mid i = \text{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \text{D} \mid i = \text{D}] = r \cdot 1 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \text{C} \mid i = \text{D}] = r \cdot 0 + (1 - r) \cdot p.$$



# KIN SELECTION

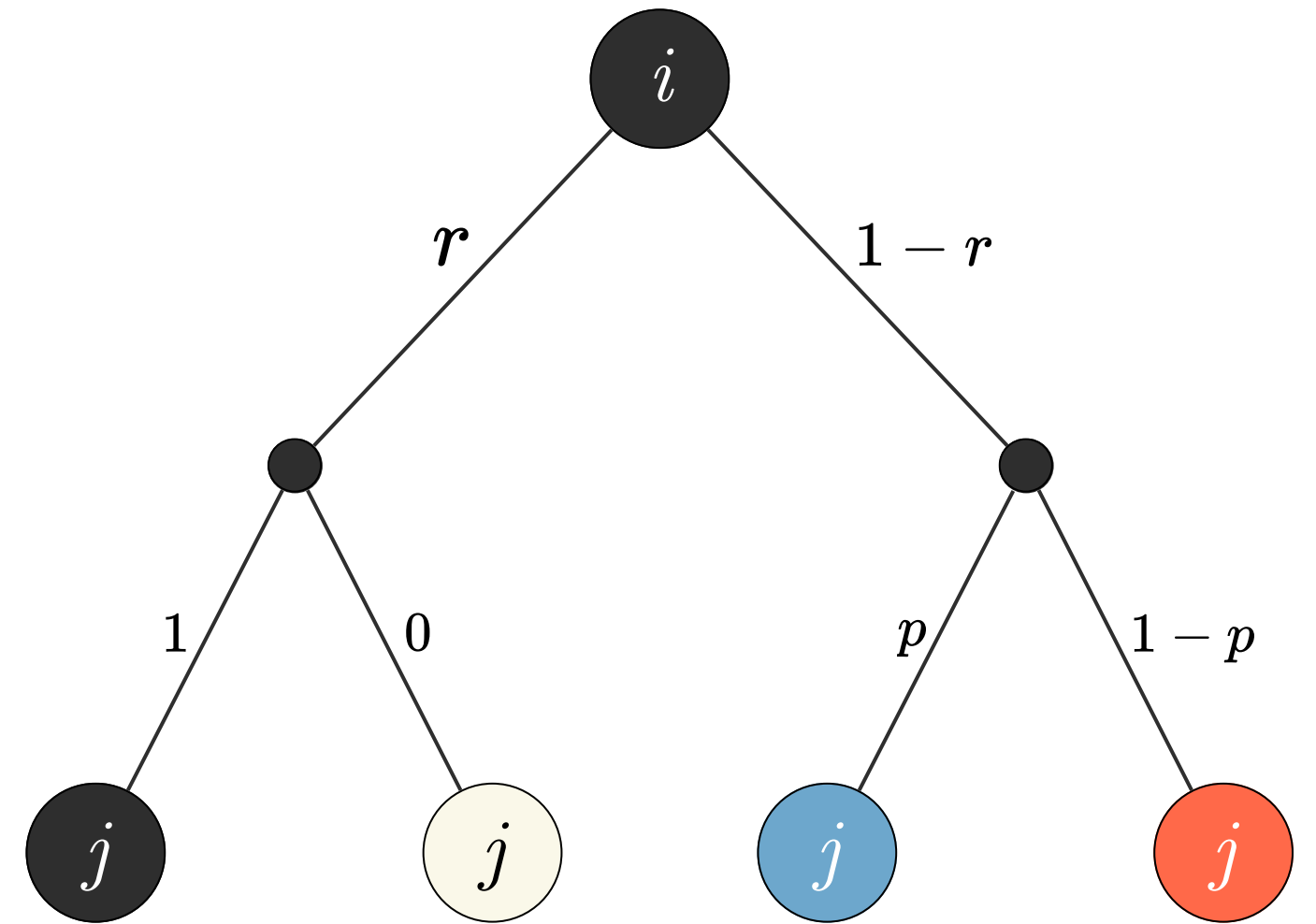
This makes the pairing probabilities:

$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{D}] = r \cdot 1 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \mathbf{C} \mid i = \mathbf{D}] = r \cdot 0 + (1 - r) \cdot p.$$



# KIN SELECTION

This makes the pairing probabilities:

$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] = r \cdot 1 + (1 - r) \cdot p,$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{C}] = r \cdot 0 + (1 - r) \cdot (1 - p),$$

$$\Pr[j = \mathbf{D} \mid i = \mathbf{D}] = r \cdot 1 + (1 - r) \cdot (1 - p),$$

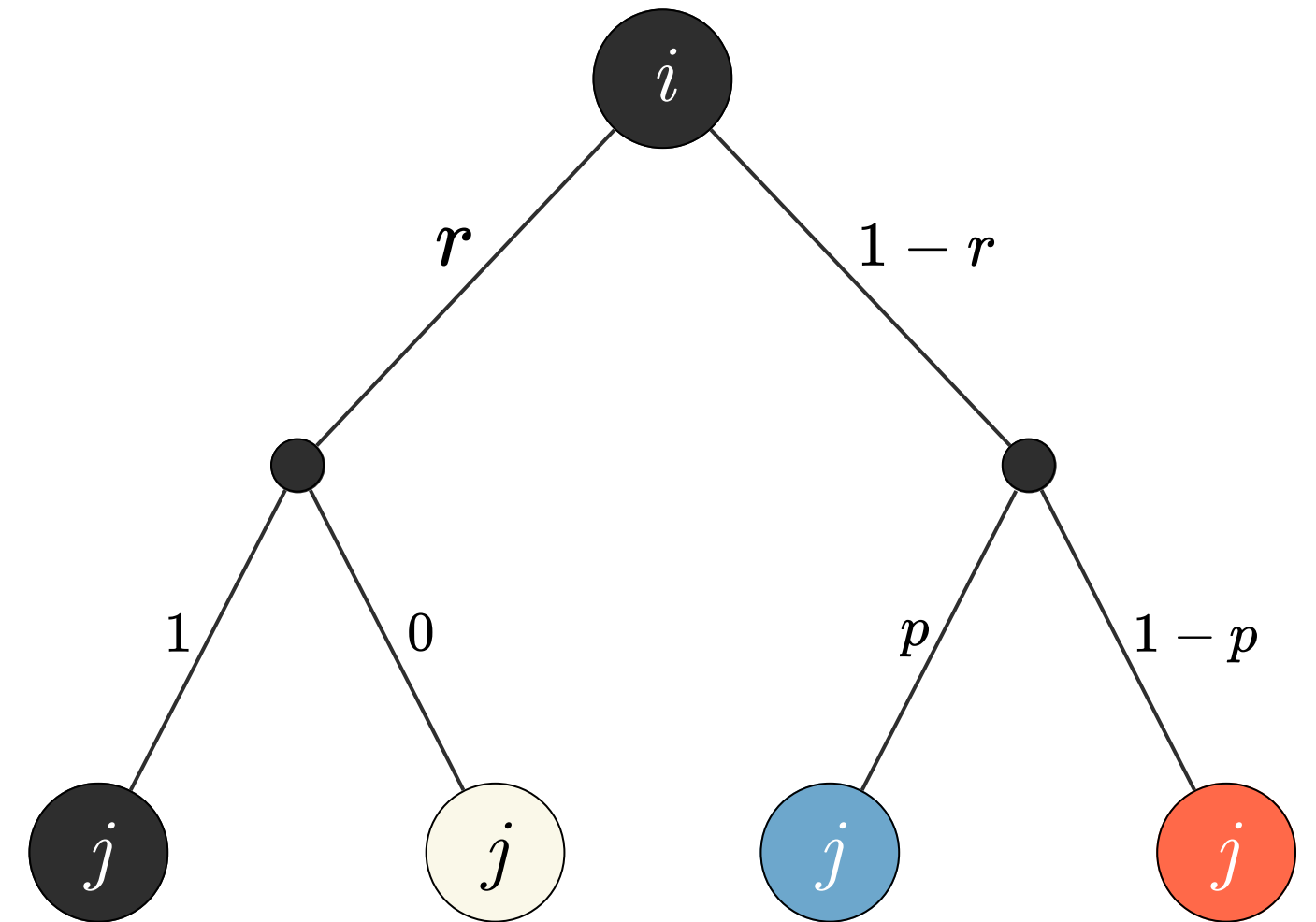
$$\Pr[j = \mathbf{C} \mid i = \mathbf{D}] = r \cdot 0 + (1 - r) \cdot p.$$

Plug this into the positive assortment equation to get:

$$\Pr[j = \mathbf{C} \mid i = \mathbf{C}] - \Pr[j = \mathbf{C} \mid i = \mathbf{D}] > \frac{c}{b} \quad \text{iff}$$

$$r \cdot 1 + (1 - r) \cdot p - (r \cdot 0 + (1 - r) \cdot p) > \frac{c}{b} \quad \text{iff}$$

$$r > \frac{c}{b}.$$



## **THEOREM (HAMILTON'S RULE)**

Cooperation increases in frequency if and only if:

$$r > \frac{c}{b}.$$



W.D. HAMILTON

The closer the kin, the more cooperation  
makes sense.



W.D. HAMILTON

The closer the kin, the more cooperation makes sense.

J.B.S. HALDANE

I'd gladly give my life for two of my brothers, or eight of my cousins.



Kin selection explains most cooperation we see in the animal world.

Kin selection explains most cooperation we see in the animal world. And, undoubtedly, families play a large part in human affairs as well.



JONATHAN F. SCHULZ

Anthropology suggests that kin-based institutions represent the most fundamental of human institutions...

...and have long been the primary framework for organizing social life in most societies.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

# THE REACH OF THE EXTENDED FAMILY

## ECONOMICS

In South Asia, the extended family provides support and an economic safety net.

Even in cities, kinship ties are often crucial to obtain employment or financial assistance.

Indian Society and Ways of Living. (2023, June 9). Asia Society.

In Late-Imperial China, clans and lineages owned property.

Jordan: Traditional Chinese Family and Lineage. (n.d.). Retrieved June 30, 2025.

# THE REACH OF THE EXTENDED FAMILY

## ECONOMICS

In South Asia, the extended family provides support and an economic safety net.

Even in cities, kinship ties are often crucial to obtain employment or financial assistance.

Indian Society and Ways of Living. (2023, June 9). Asia Society.

In Late-Imperial China, clans and lineages owned property.

Jordan: Traditional Chinese Family and Lineage. (n.d.). Retrieved June 30, 2025.

## JUSTICE

Nuer and Bedouin councils of elders allocate collective responsibility down the lineage tree.

If a distant relative kills someone, you might be asked to help pay.

Peters, E. (1960). The proliferation of segments in the lineage of the Bedouin of cyrenaica. *The Journal of the Royal Anthropological Institute of Great Britain and Ireland*, 90(1), 29.

Moscona, J., Nunn, N., & Robinson, J. (2018). Kinship and conflict: Evidence from segmentary lineage societies in sub-Saharan Africa (No. w24209). National Bureau of Economic Research.



JONATHAN F. SCHULZ

Anthropology suggests that kin-based institutions represent the most fundamental of human institutions...

...and have long been the primary framework for organizing social life in most societies.

DUMAN BAHRAMI-RAD

This extends to marriage.



# THE REACH OF THE EXTENDED FAMILY

## MARRIAGE

Unions are arranged to keep property inside the group or to forge strategic alliances.

Cousin marriages are often encouraged.

In Pakistan, consanguineous marriages account for ~60% of marriages (as of 2014).

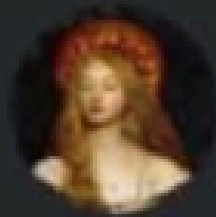
In Egypt, ~40%.

Wikipedia contributors. (2025, June 28). [Cousin marriage in the Middle East](#). Wikipedia.





**PRINCE PHILIP AND QUEEN ELIZABETH II**



consingenova 6w

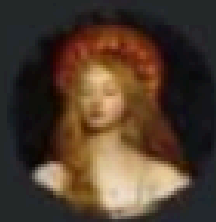
Prince Philip was so hot, i understand why Queen Elizabeth selected him.



31919

Reply

**PRINCE PHILIP AND QUEEN ELIZABETH II**



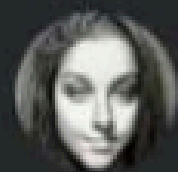
consingenova 6w

Prince Philip was so hot, i understand why Queen Elizabeth selected him.



31919

Reply



fernweh\_frau00 5w

@consingenova he was her 3rd cousin 🤔



146

Reply



JONATHAN F. SCHULZ

Anthropology suggests that kin-based institutions represent the most fundamental of human institutions...

...and have long been the primary framework for organizing social life in most societies.

DUMAN BAHRAMI-RAD

This extends to marriage.



JONATHAN P. BEAUCHAMP

And leads to a particular psychology.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

# THE REACH OF THE EXTENDED FAMILY

## PSYCHOLOGY

Encouraged: greater conformity, obedience, nepotism, deference to elders, holistic-relational awareness, and in-group loyalty.

Discouraged: individualism, independence, and analytical thinking.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.



JOSEPH HENRICH

In the West, people have some peculiar psychological traits.



JOSEPH HENRICH

In the West, people have some peculiar psychological traits.

These societies are WEIRD: Western, Educated, Industrialized, Rich and Democratic.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.

# **WEIRD PSYCHOLOGY**

## **RADICAL INDIVIDUALISM**

The person, not the situation, is the chief engine of action

They describe themselves with abstract traits (e.g., 'creative', 'hard-working') rather than relational roles.

## **LOW CONFORMITY**

Lowest conformity rates found in the U.S., Canada and north-western Europe.

# **WEIRD PSYCHOLOGY**

## **RADICAL INDIVIDUALISM**

The person, not the situation, is the chief engine of action

They describe themselves with abstract traits (e.g., 'creative', 'hard-working') rather than relational roles.

## **LOW CONFORMITY**

Lowest conformity rates found in the U.S., Canada and north-western Europe.

## **IMPERSONAL PROSOCIALITY**

Trust, fairness and cooperation are extended to anonymous others, not just kin or in-group members.

More focus on impersonal norms.

Fisman, R., & Miguel, E. (2007). Corruption, norms, and legal enforcement: Evidence from diplomatic parking tickets. *Journal of Political Economy*, 115(6), 1020-1048.

Why, though? What made WEIRD people weird?



JOSEPH HENRICH

Our hypothesis is that one of the main culprits was the Western (Catholic) church.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.



JOSEPH HENRICH

Our hypothesis is that one of the main culprits was the Western (Catholic) church.

Namely, its Marriage and Family Program (MFP).

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.



JOSEPH HENRICH

Our hypothesis is that one of the main culprits was the Western (Catholic) church.

Namely, its Marriage and Family Program (MFP).

Starting around 500 CE, the church bans cousin marriage, polygyny, arranged marriages, etc.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.



JOSEPH HENRICH

Our hypothesis is that one of the main culprits was the Western (Catholic) church.

Namely, its Marriage and Family Program (MFP).

Starting around 500 CE, the church bans cousin marriage, polygyny, arranged marriages, etc.

Which eroded intensive kinship, and pushed families towards monogamous households.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.



JOSEPH HENRICH

Our hypothesis is that one of the main culprits was the Western (Catholic) church.

Namely, its Marriage and Family Program (MFP).

Starting around 500 CE, the church bans cousin marriage, polygyny, arranged marriages, etc.

Which eroded intensive kinship, and pushed families towards monogamous households.

People growing up in weaker-kin settings internalize independence and abstract moral rules, rather than relational morality.

Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

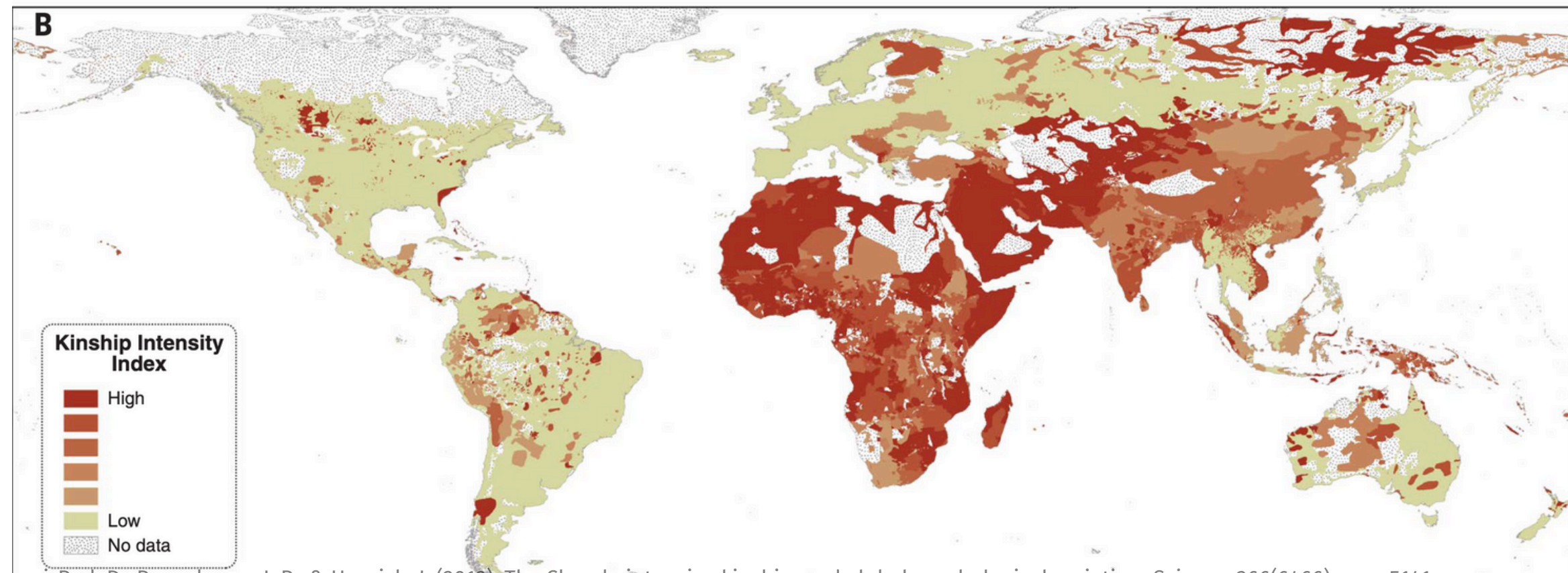
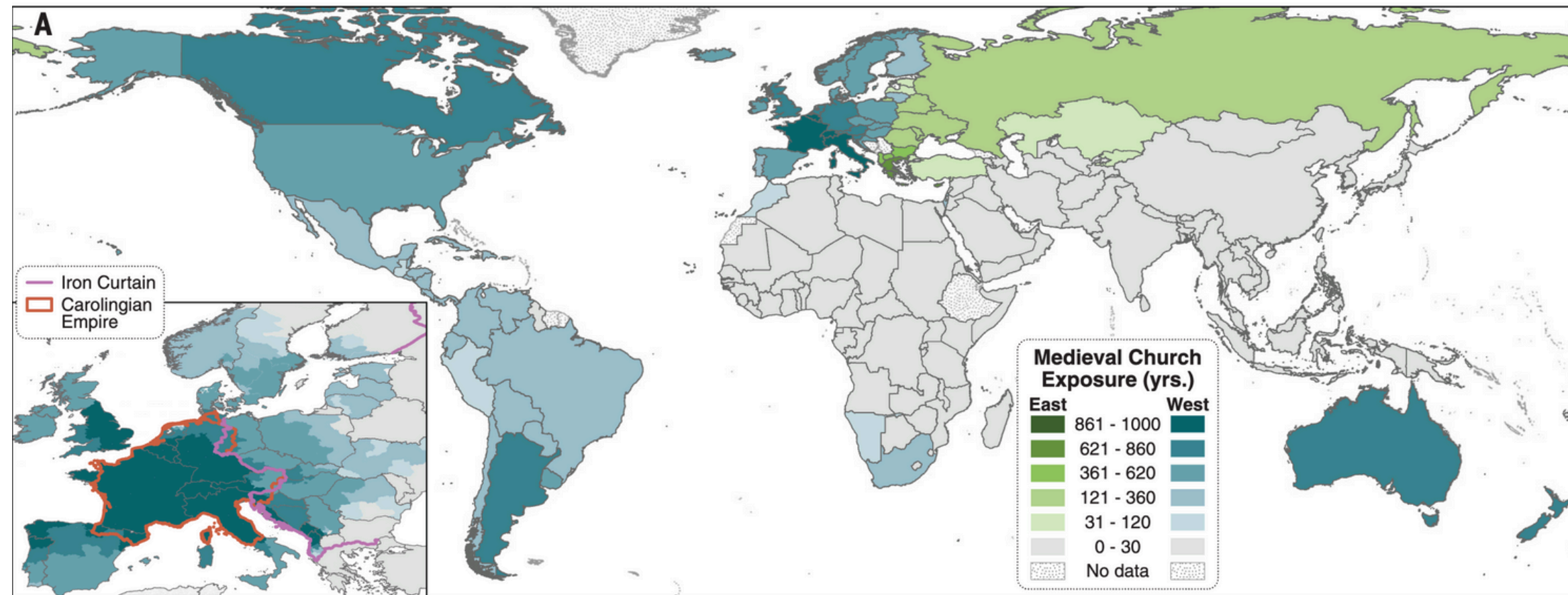
Henrich, J. (2020). *The WEIRDest People in the World: How the West Became Psychologically Peculiar and Particularly Prosperous*. Farrar, Straus and Giroux.

So the prediction is that lower kinship intensity should each correlate with WEIRDer psychology.

So the prediction is that lower kinship intensity should each correlate with WEIRD psychology. And more years of Church exposure should predict lower kinship intensity.

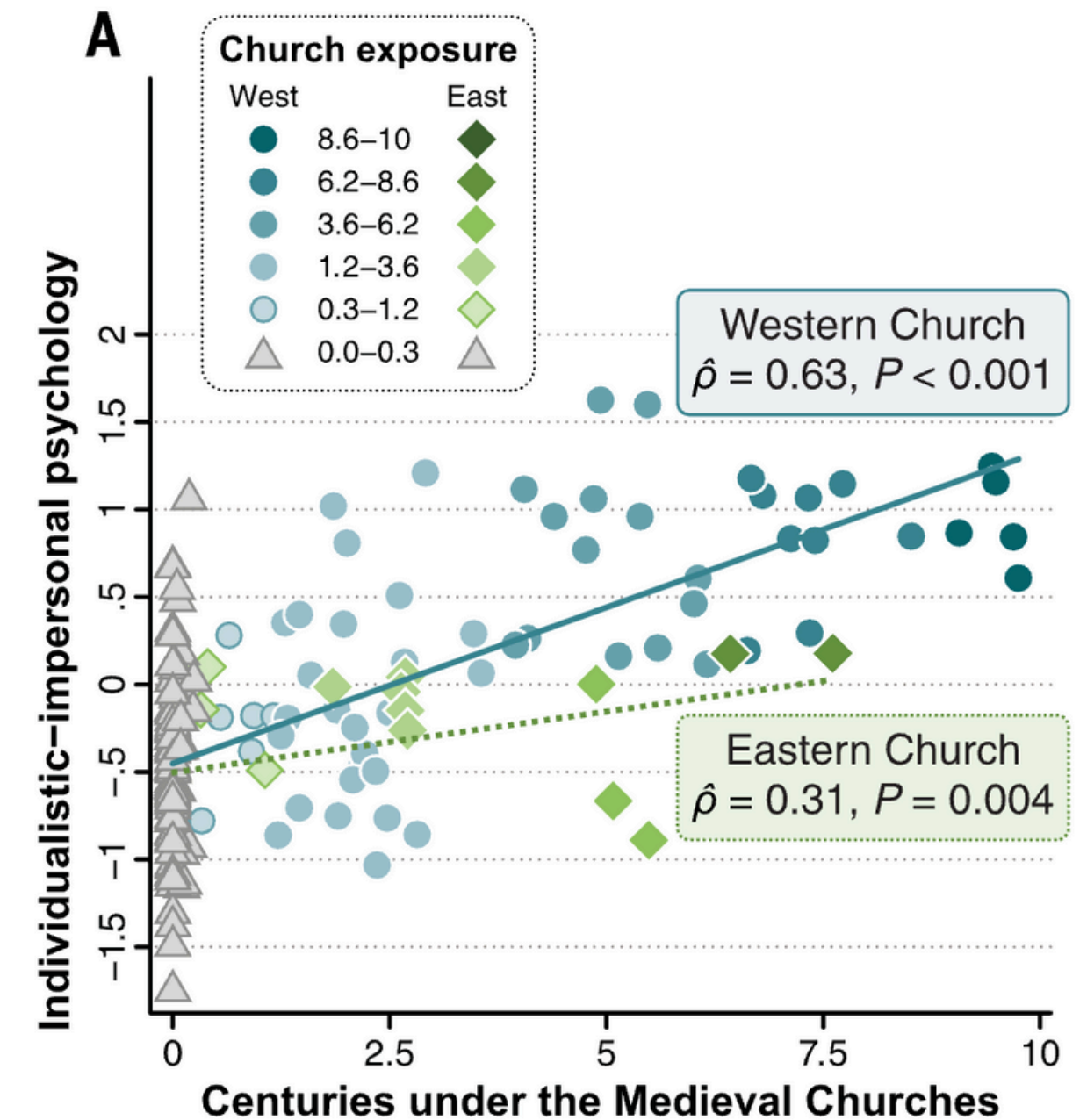
# EXPOSURE TO WESTERN CHURCH VS KINSHIP INTENSITY

More years under the Western church is correlated with lower kinship intensity.



# EXPOSURE TO WESTERN CHURCH VS INDIVIDUALISM

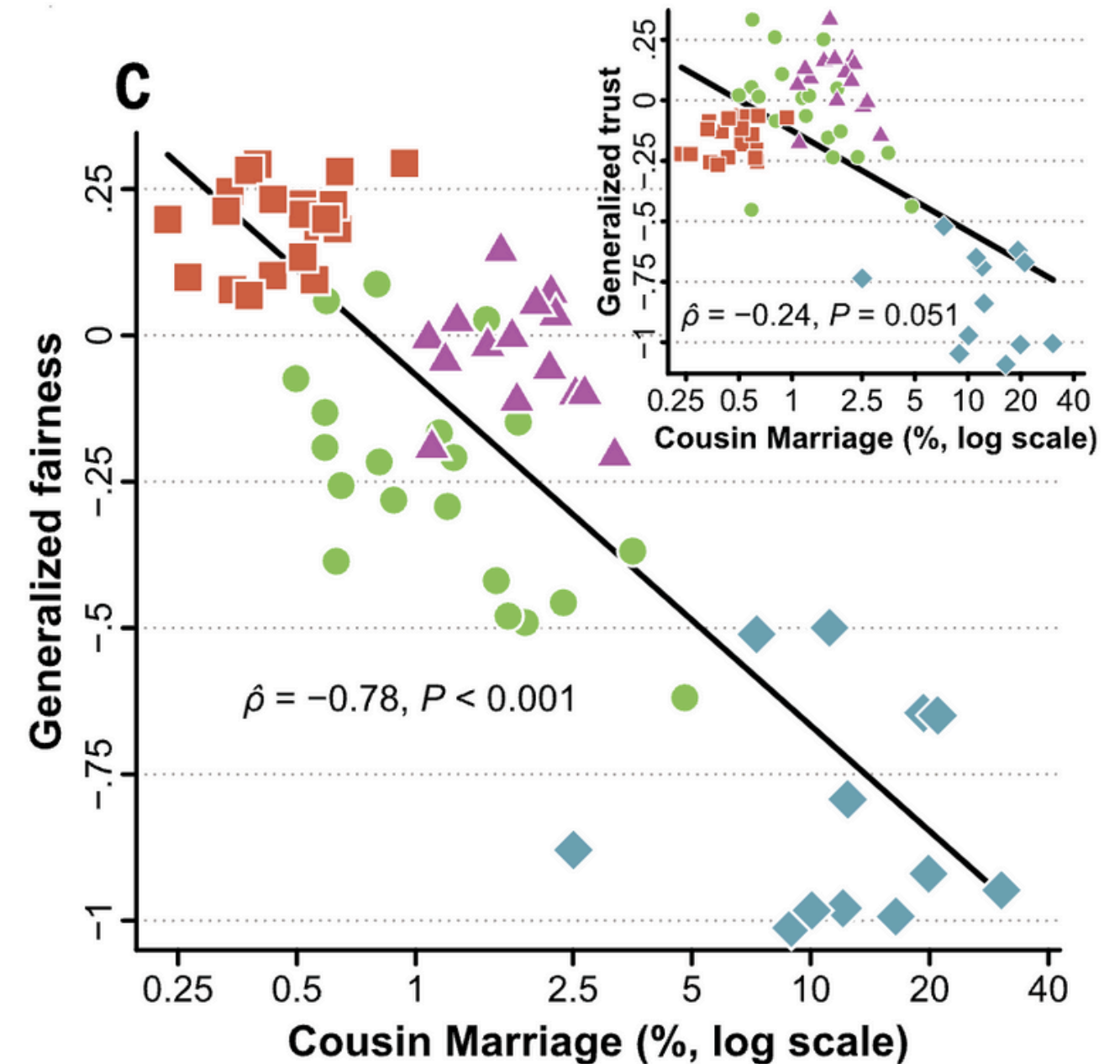
More years under the Western church is correlated with higher individualism.



Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.

# COUSIN MARRIAGE VS TRUST

Higher rates of cousin marriage correlated with lower amounts of trust in anonymous others.



Schulz, J. F., Bahrami-Rad, D., Beauchamp, J. P., & Henrich, J. (2019). The Church, intensive kinship, and global psychological variation. *Science*, 366(6466), eaau5141.