# Best responses in repeated games Reactive strategies with longer memory.

LEG March 2025

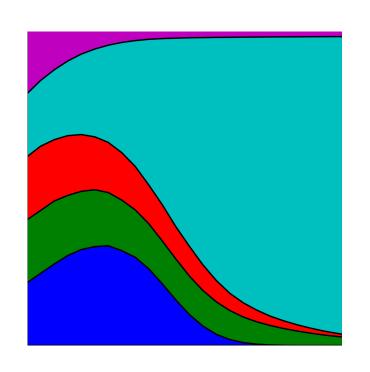


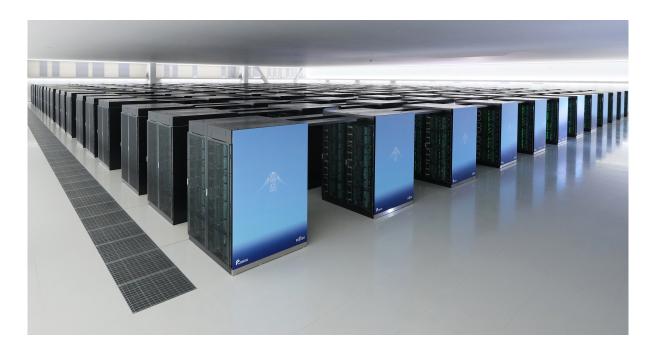
@nikoletaglyn.bsky.social

Nikoleta Glynatsi







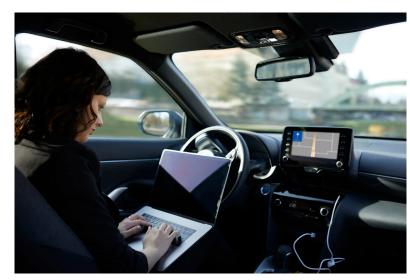


## Social Behavior

**Understand Cooperation** 







2. Conditional cooperation with longer memory

Published PNAS: https://doi.org/10.1073/pnas.2420125121







Complete strategy spaces of direct reciprocity

Under review *PNAS* 







Can I afford to remember less than you?





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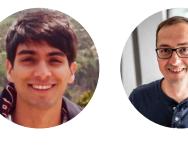






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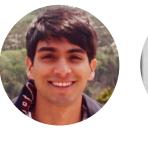




3.

Complete strategy spaces of direct reciprocity

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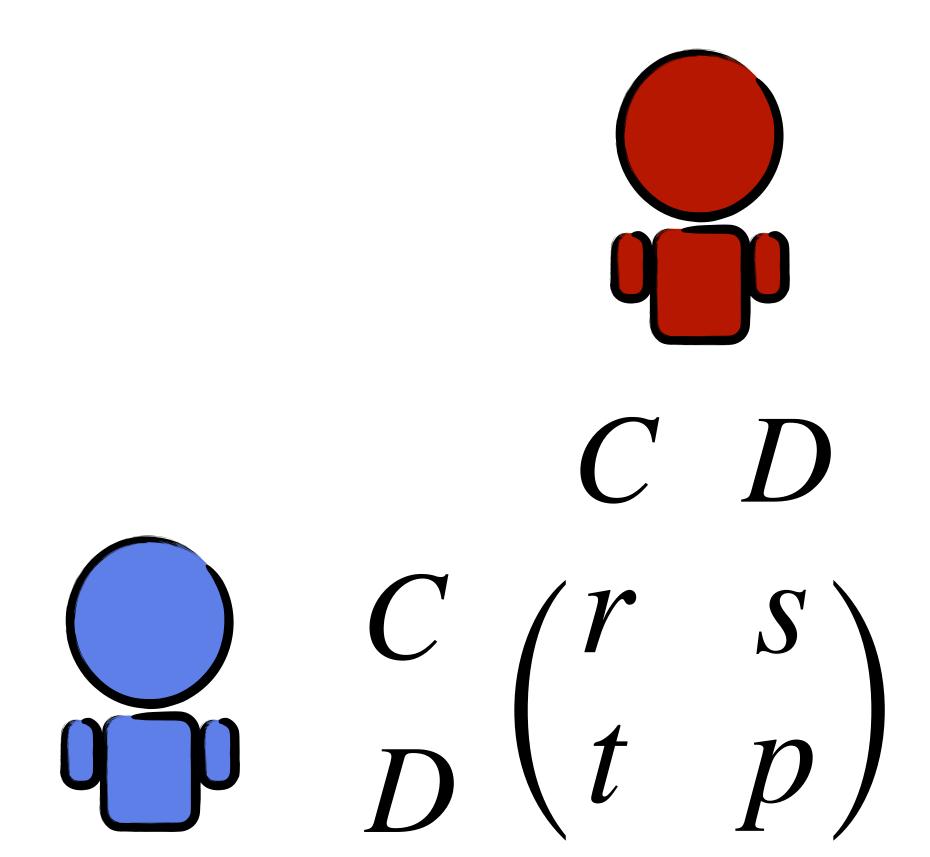


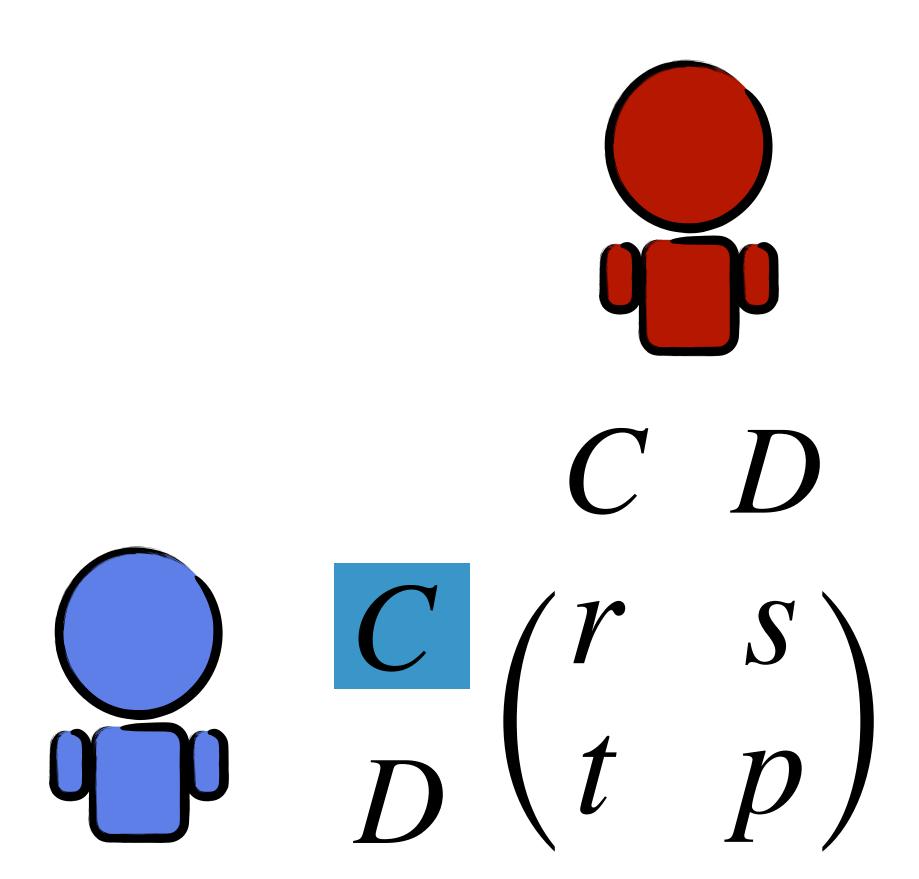


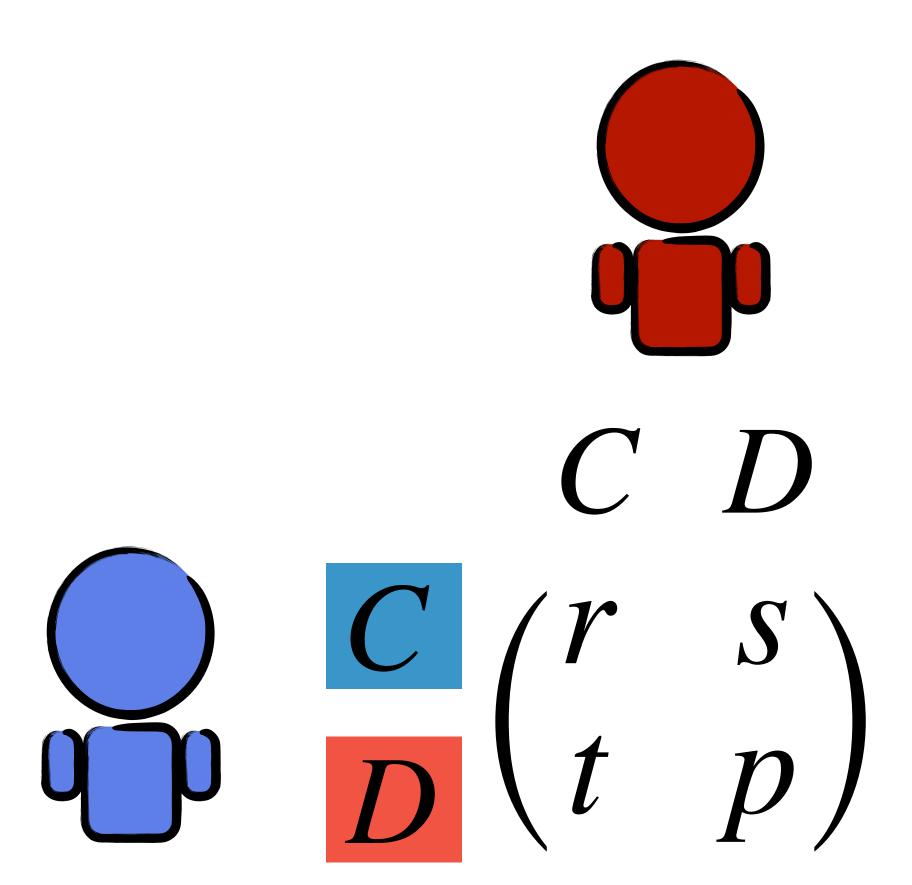
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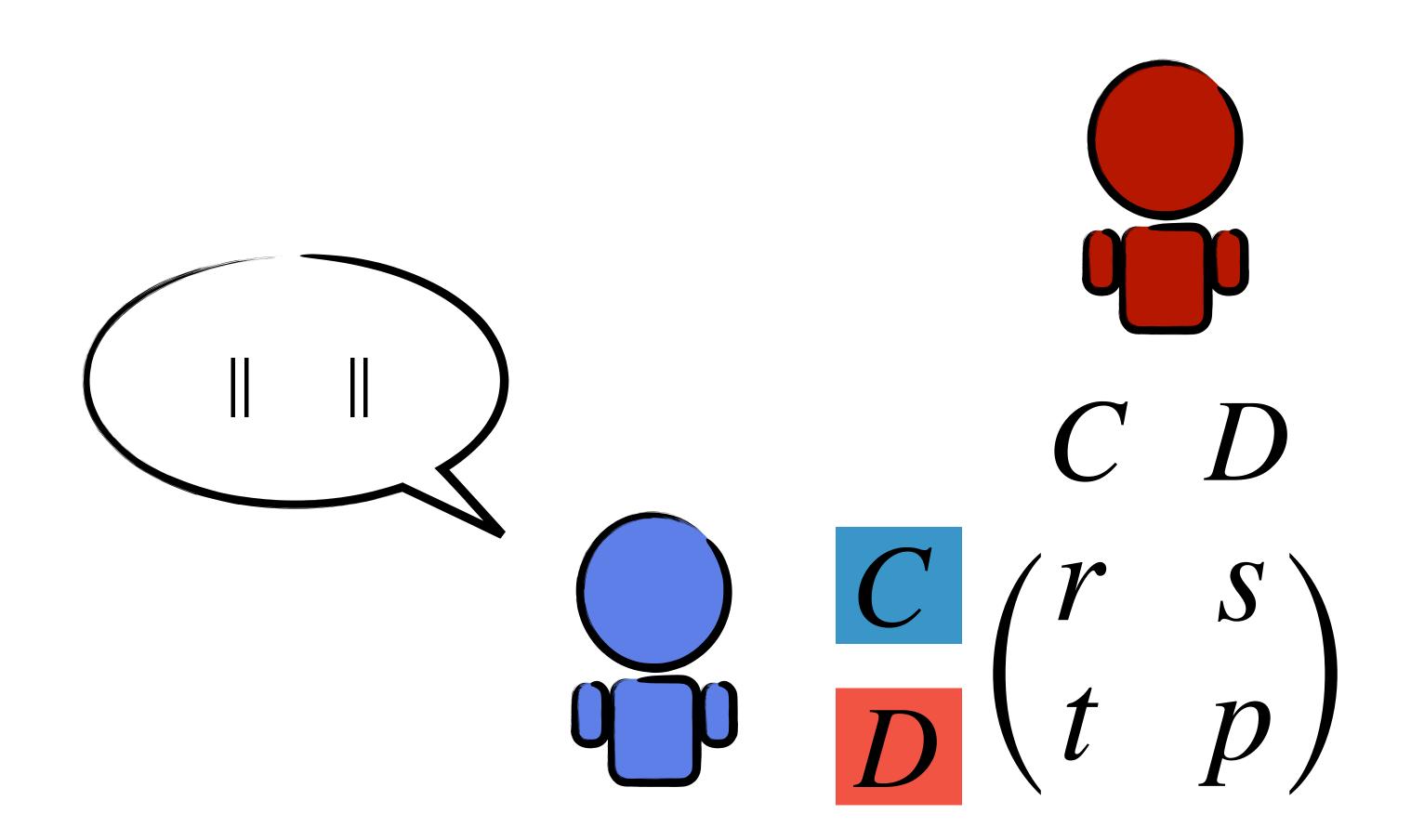


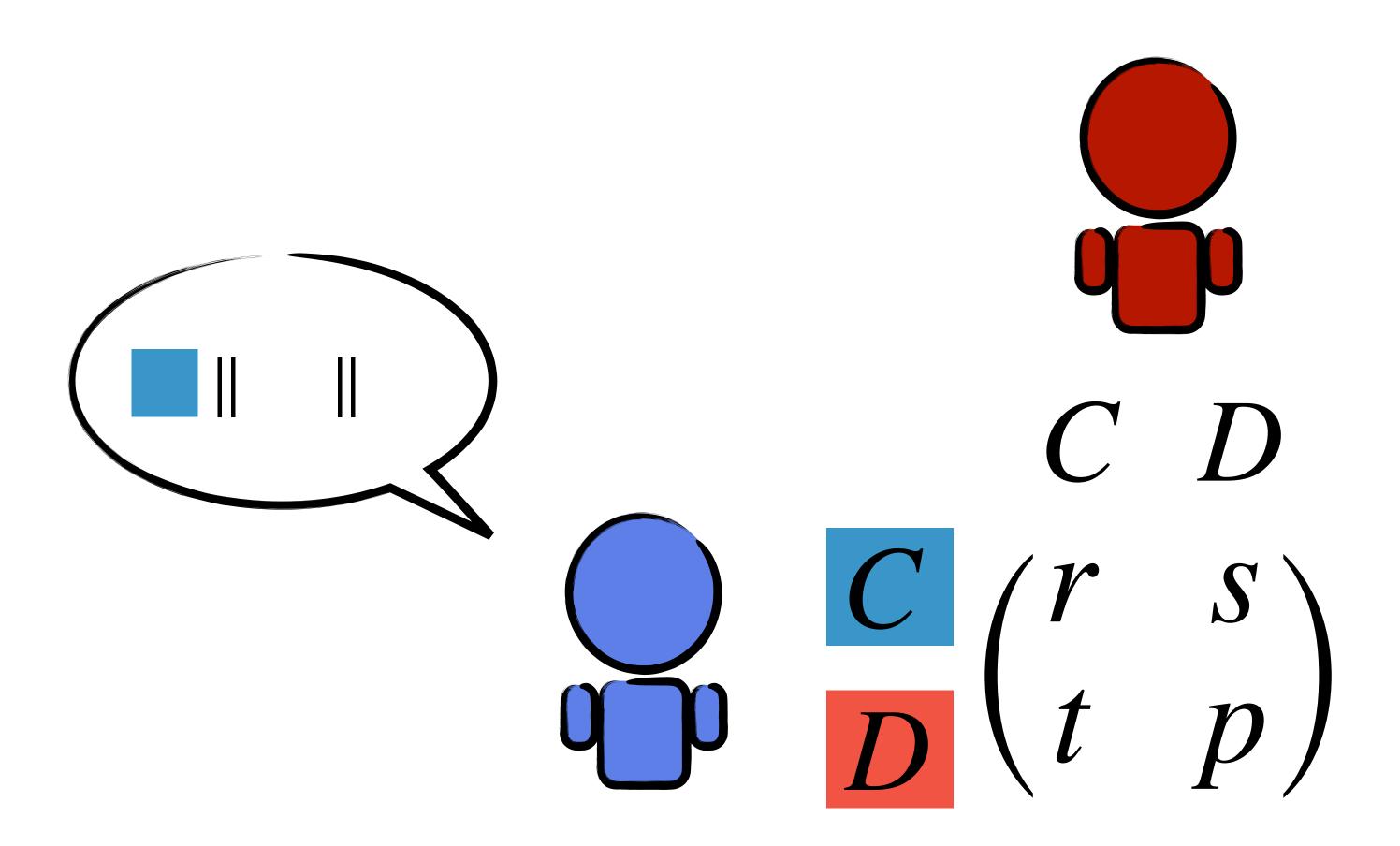


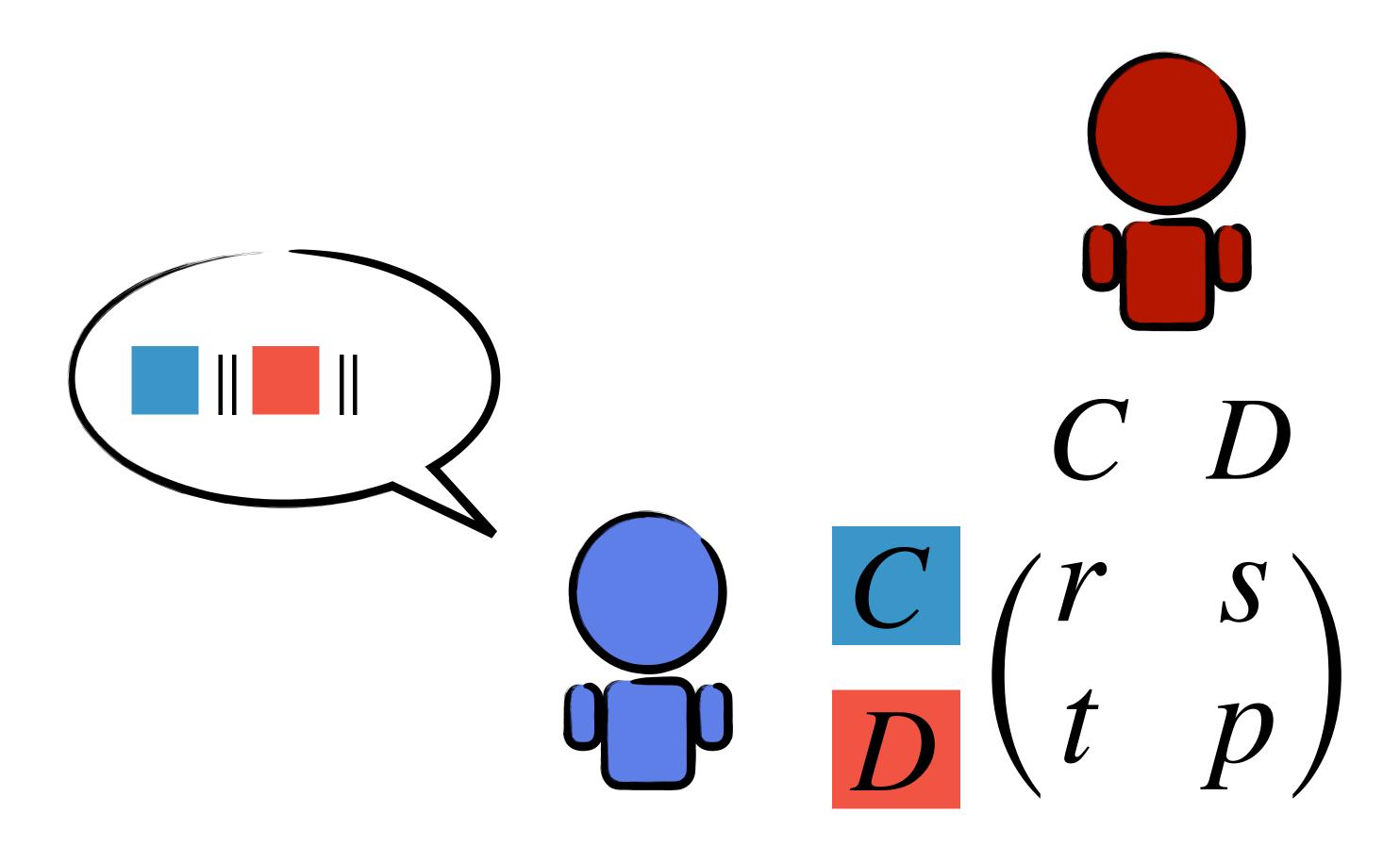


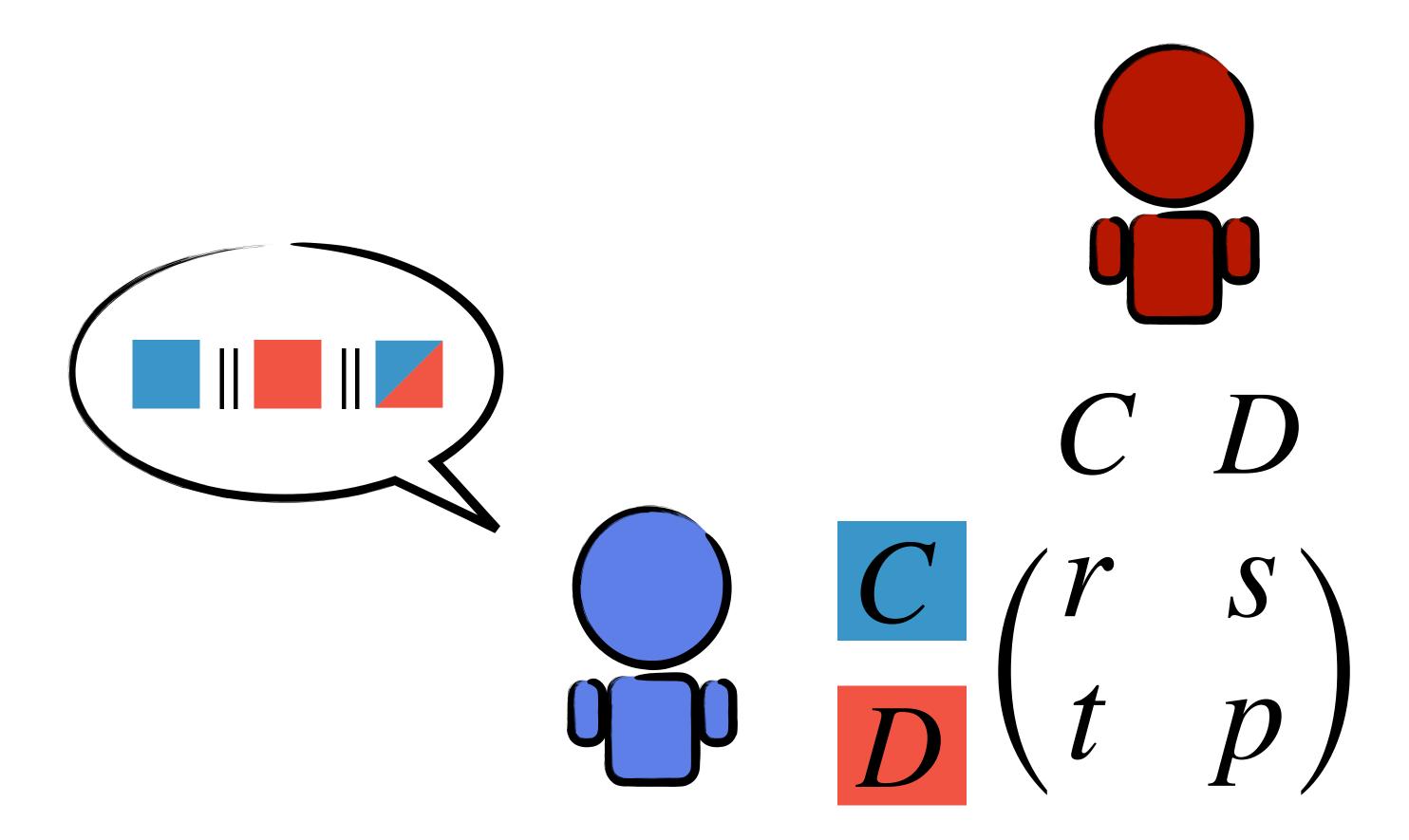


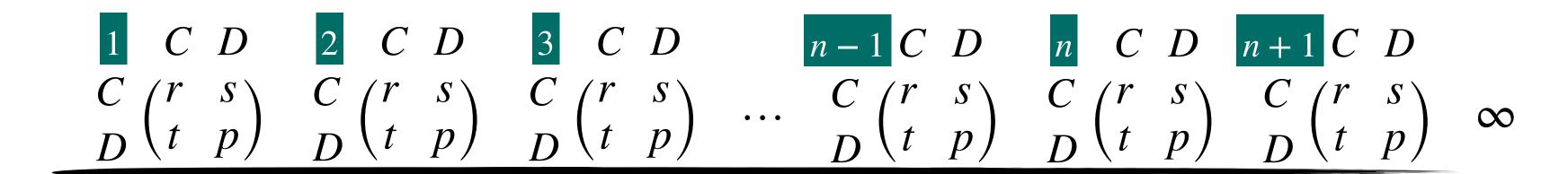


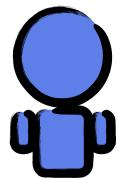












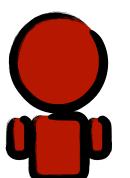
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C

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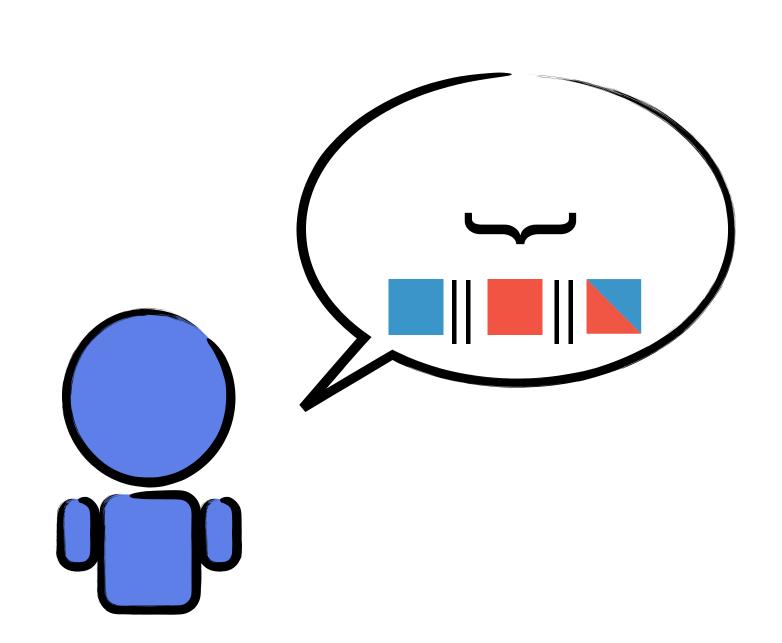


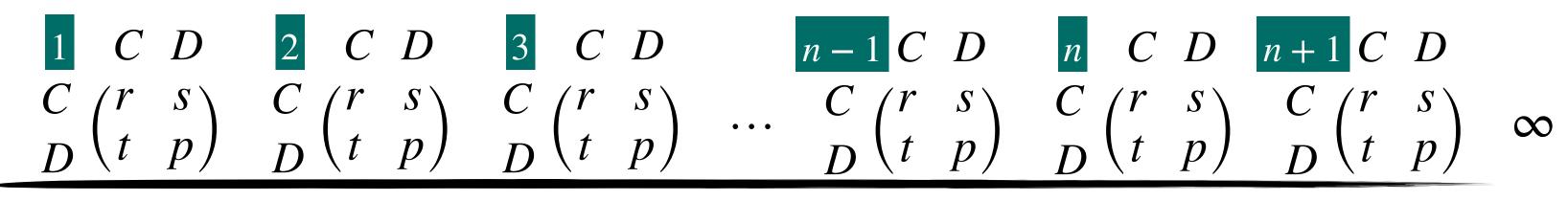
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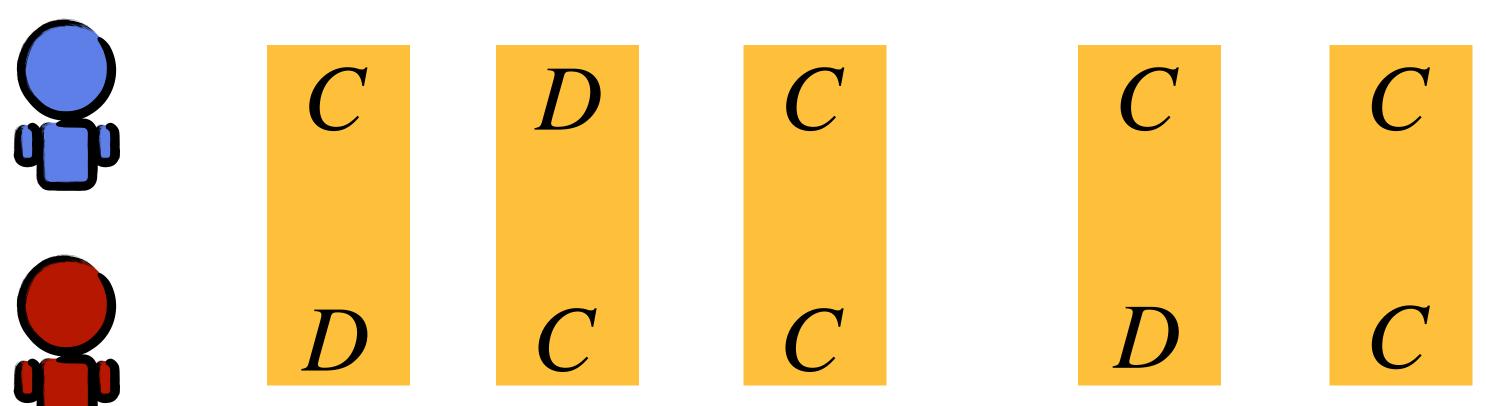
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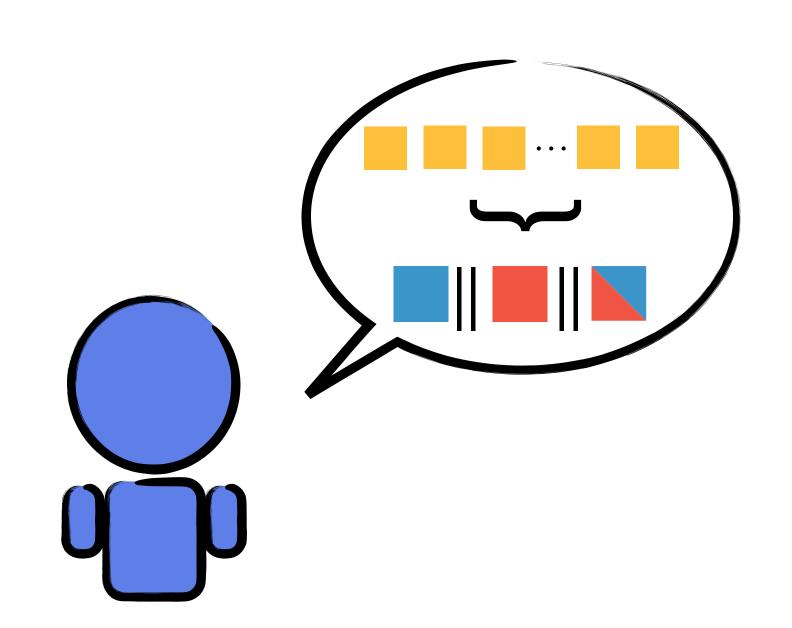
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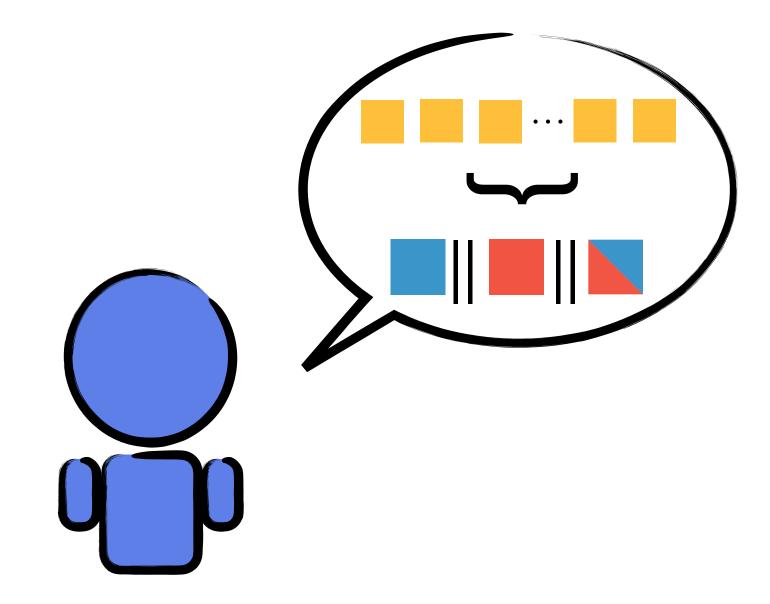
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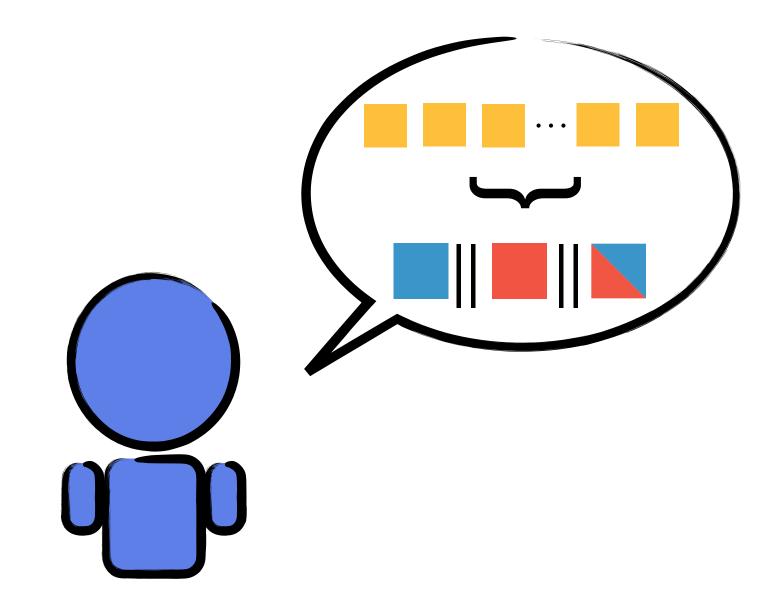






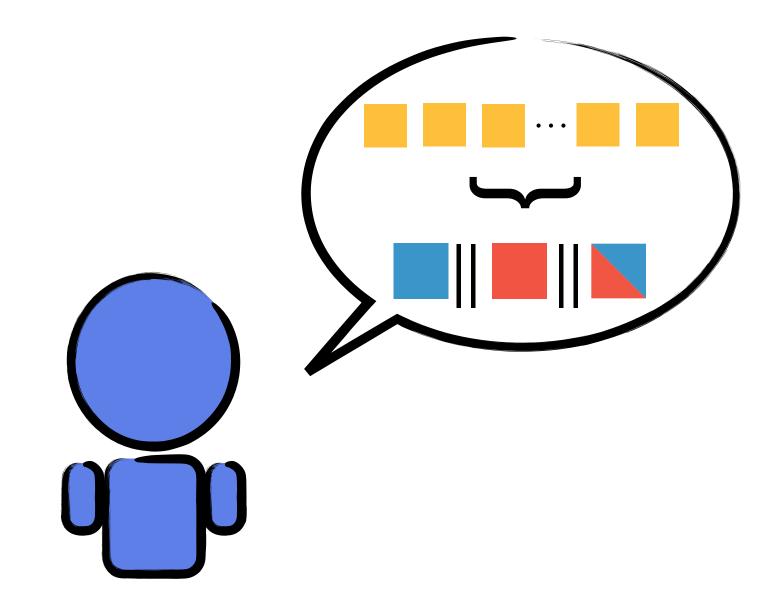


Memory-n



Memory-n

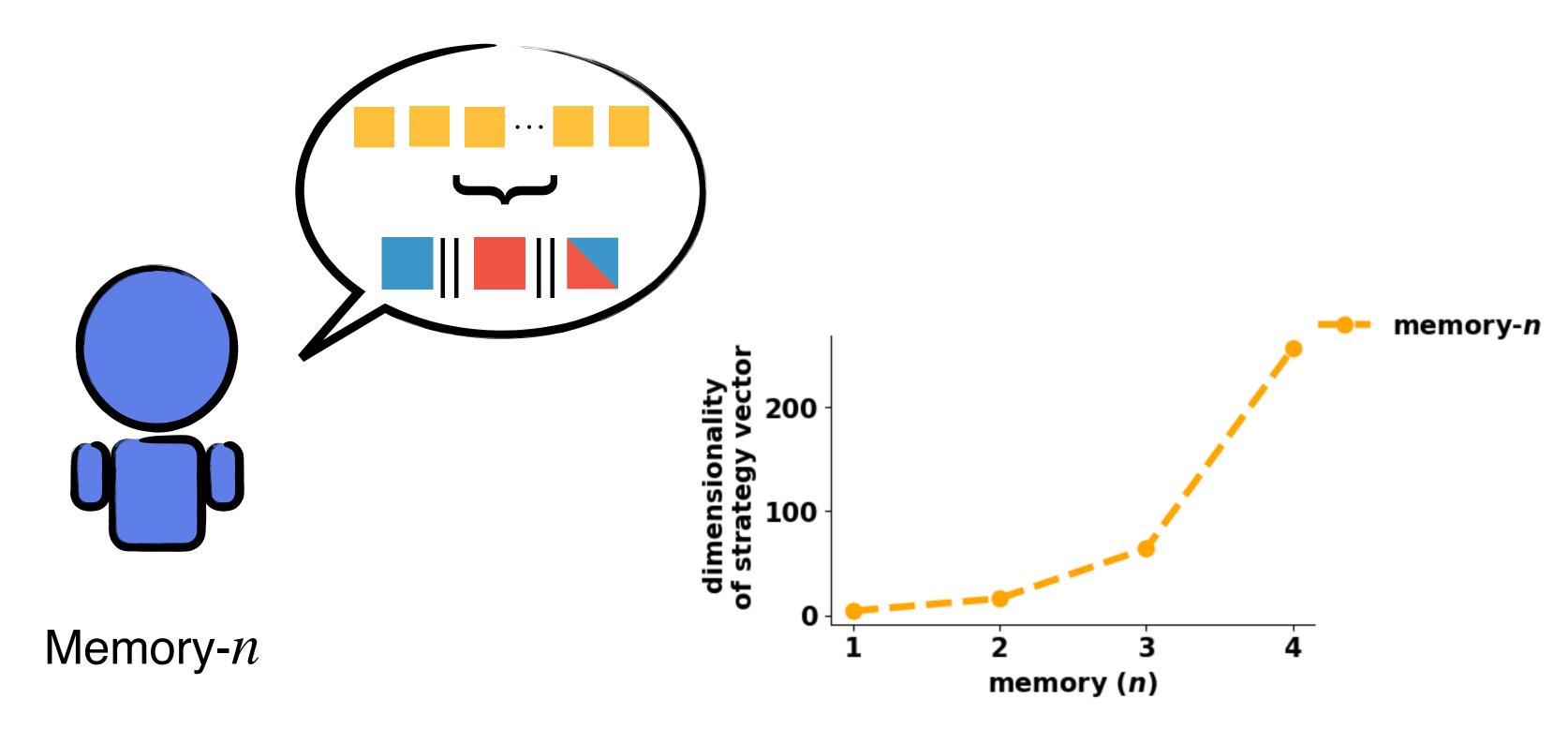
$$\mathbf{m} = (m_{\mathbf{h}})_{\mathbf{h} \in H}$$



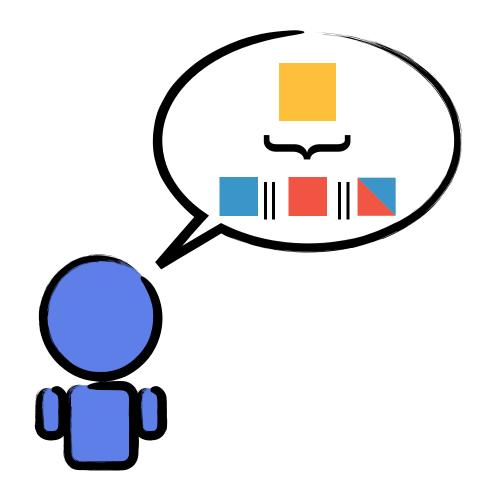
Memory-*n* 

$$\mathbf{m} = (m_{\mathbf{h}})_{\mathbf{h} \in H}$$
$$[0,1]^{2^{2n}}$$

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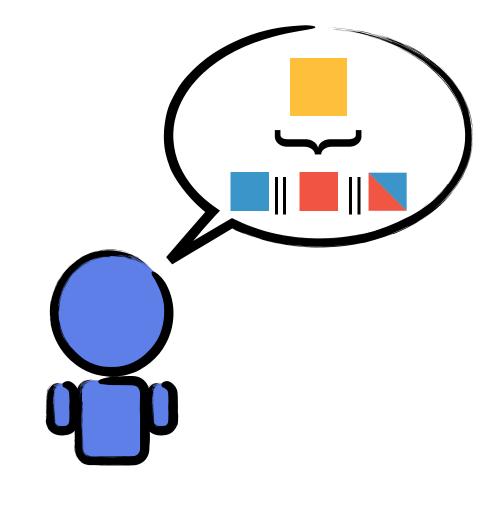


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### Memory-1

- [1] Press, W.H. and Dyson, F.J., 2012. Iterated Prisoner's Dilemma contains strategies that dominate any evolutionary opponent.
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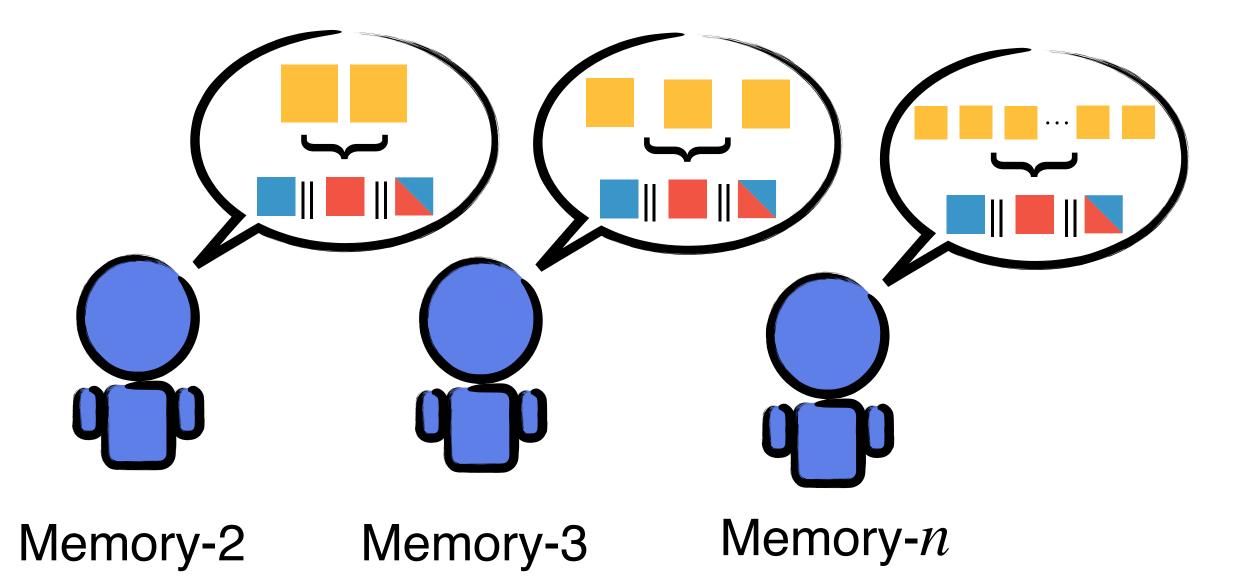


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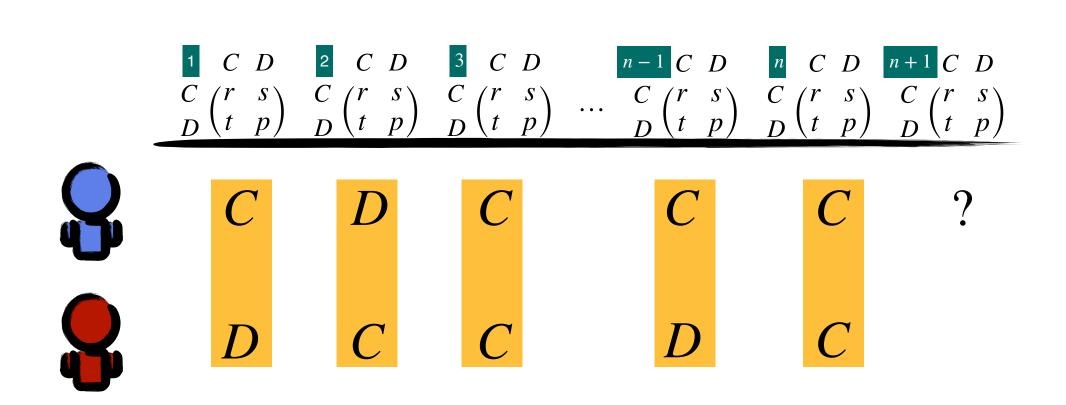
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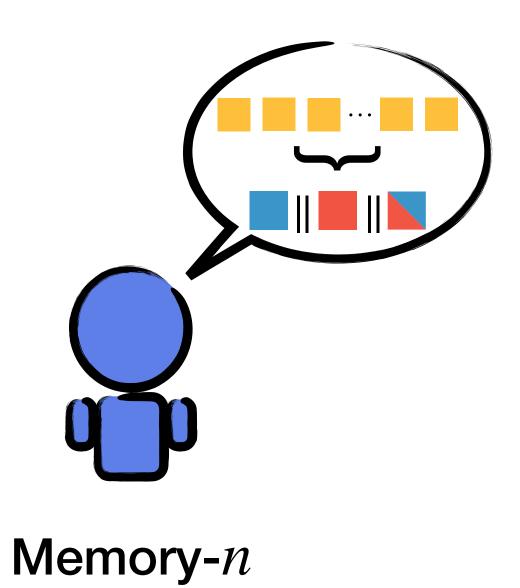
[2] Stewart, A.J. and Plotkin, J.B., 2016. Small groups and long memories promote cooperation.



- [3] Hilbe, C., Martinez-Vaquero, L.A., Chatterjee, K. and Nowak, M.A., 2017. Memory—n strategies of direct reciprocity.
- [4] Murase, Y. and Baek, S.K., 2023. Grouping promotes both partnership and rivalry with long memory in direct reciprocity.
- [5] S Do Yi, SK Baek, JK Choi, 2017. Combination with anti-tit-for-tat remedies problems of tit-for-tat.
- [6] M Ueda, 2021. Memory-two zero-determinant strategies in repeated games.
- [7] J Li, et al., 2022. Evolution of cooperation through cumulative reciprocity.

[8] AJ Stewart, JB Plotkin, 2016. Small groups and long memories promote cooperation.





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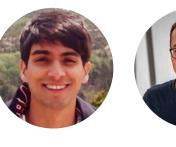






Complete strategy spaces of direct reciprocity

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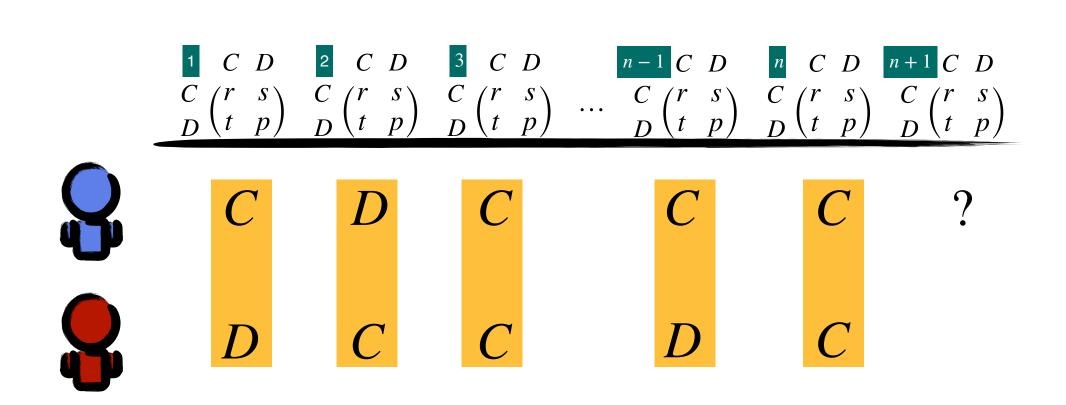


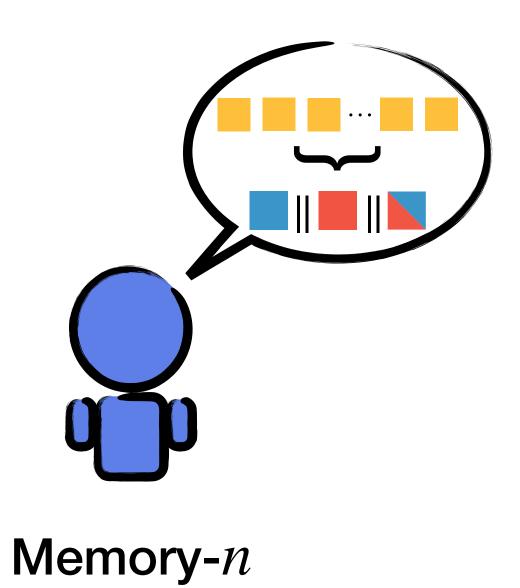


Can I afford to remember less than you?

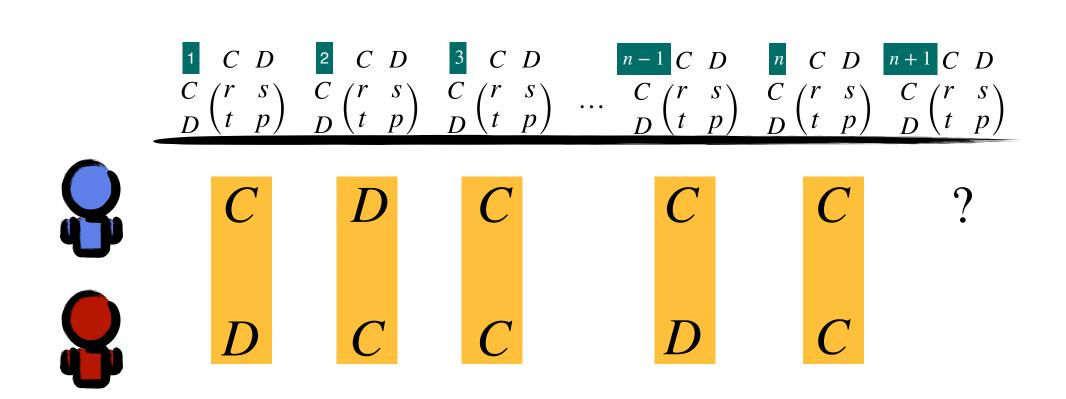


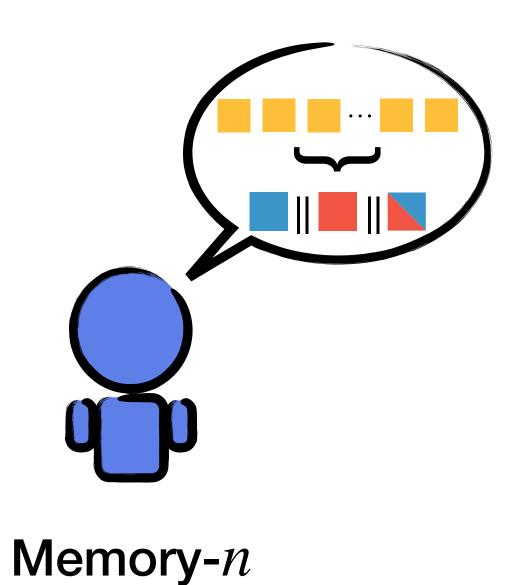




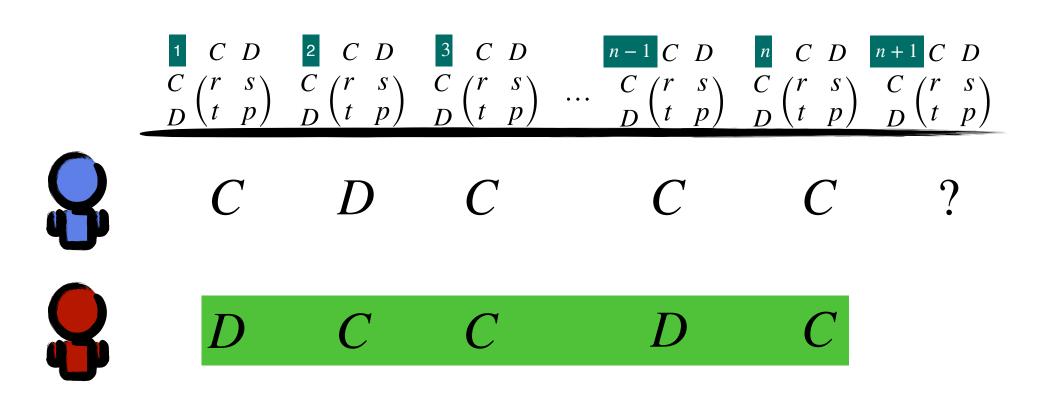


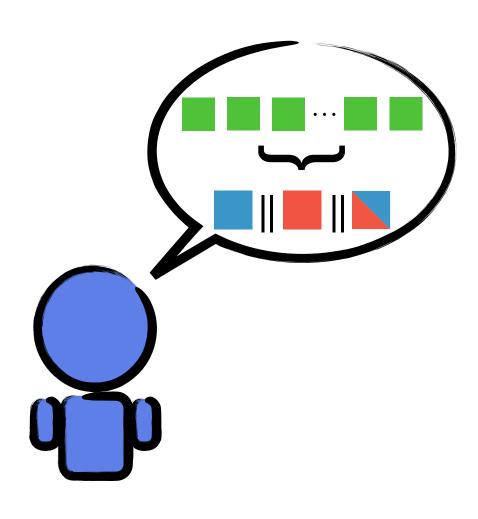












Reactive-*n* 

A reactive-n strategy can be defined as  $2^n$ -dimensional vector  $\mathbf{p} = (p_{\mathbf{h}^{-\mathbf{i}}})_{\mathbf{h}^{-\mathbf{i}} \in H^{-\mathbf{i}}}$  with  $0 \le p_{\mathbf{h}^{-\mathbf{i}}} \le 1$  where  $\mathbf{h}^{-\mathbf{i}}$  refers to an n-history of the co-player from the space of all possible co-player histories.

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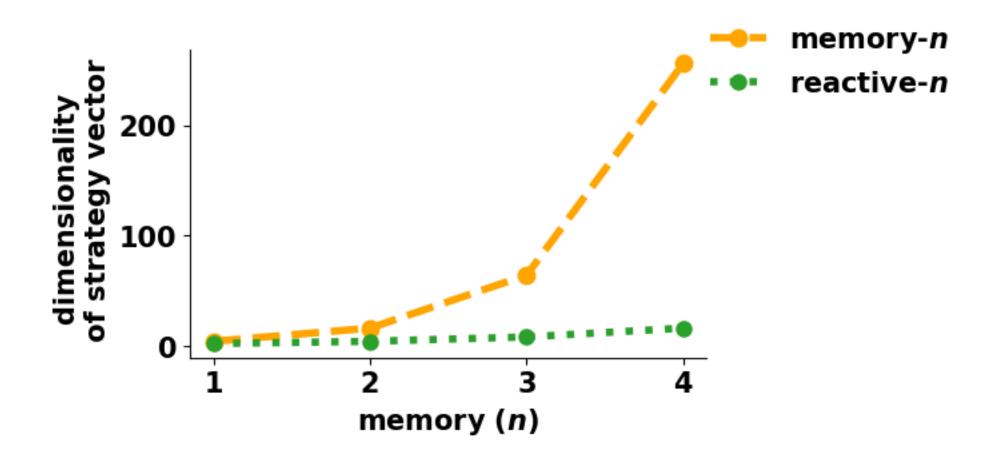
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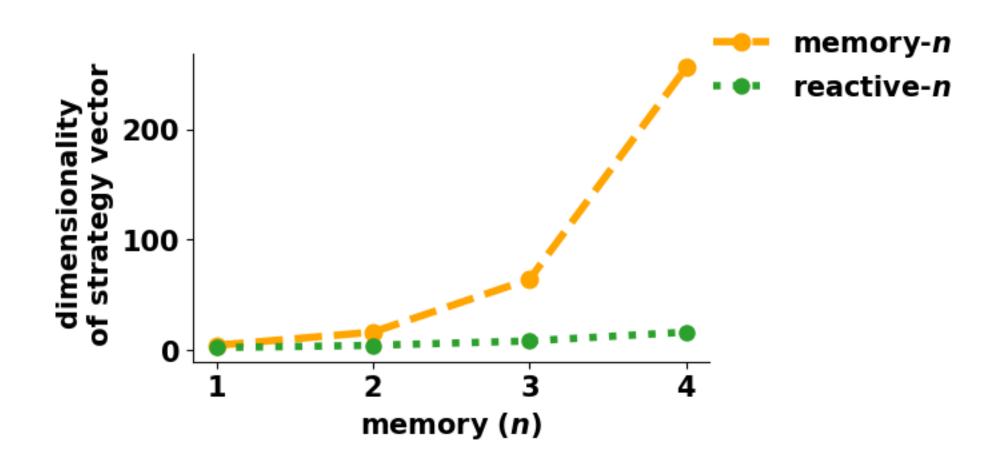
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Tit for tat (1,0)



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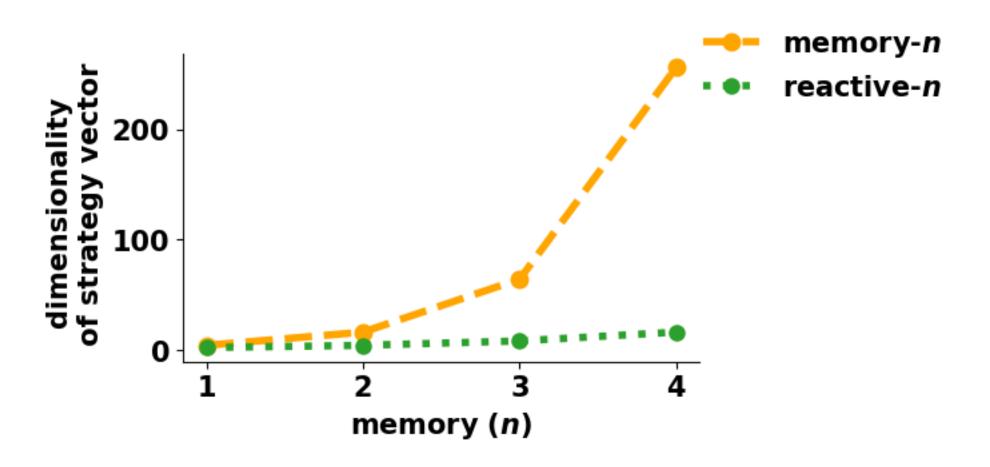
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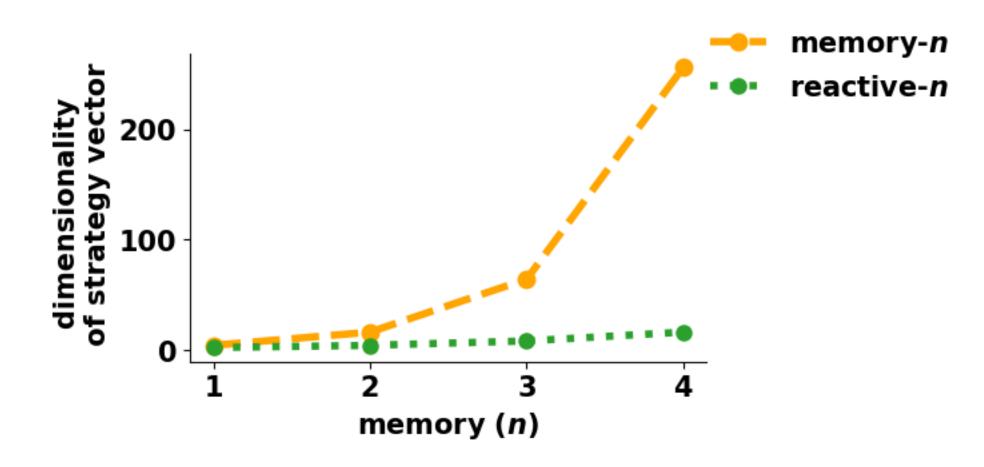
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Tit for tat (1,0)Random (1/2,1/2)Two for Two Tats (1,1,1,0)



A strategy is considered pure if all conditional cooperation probabilities are either zero or one. If all cooperation probabilities are strictly between zero and one, the strategy is described as stochastic.

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Tit for tat  $(1,0) \leftarrow$  pure Random  $(1/2,1/2) \leftarrow$  stochastic Two for Two Tats  $(1,1,1,0) \leftarrow$  pure

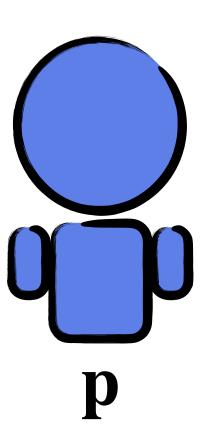
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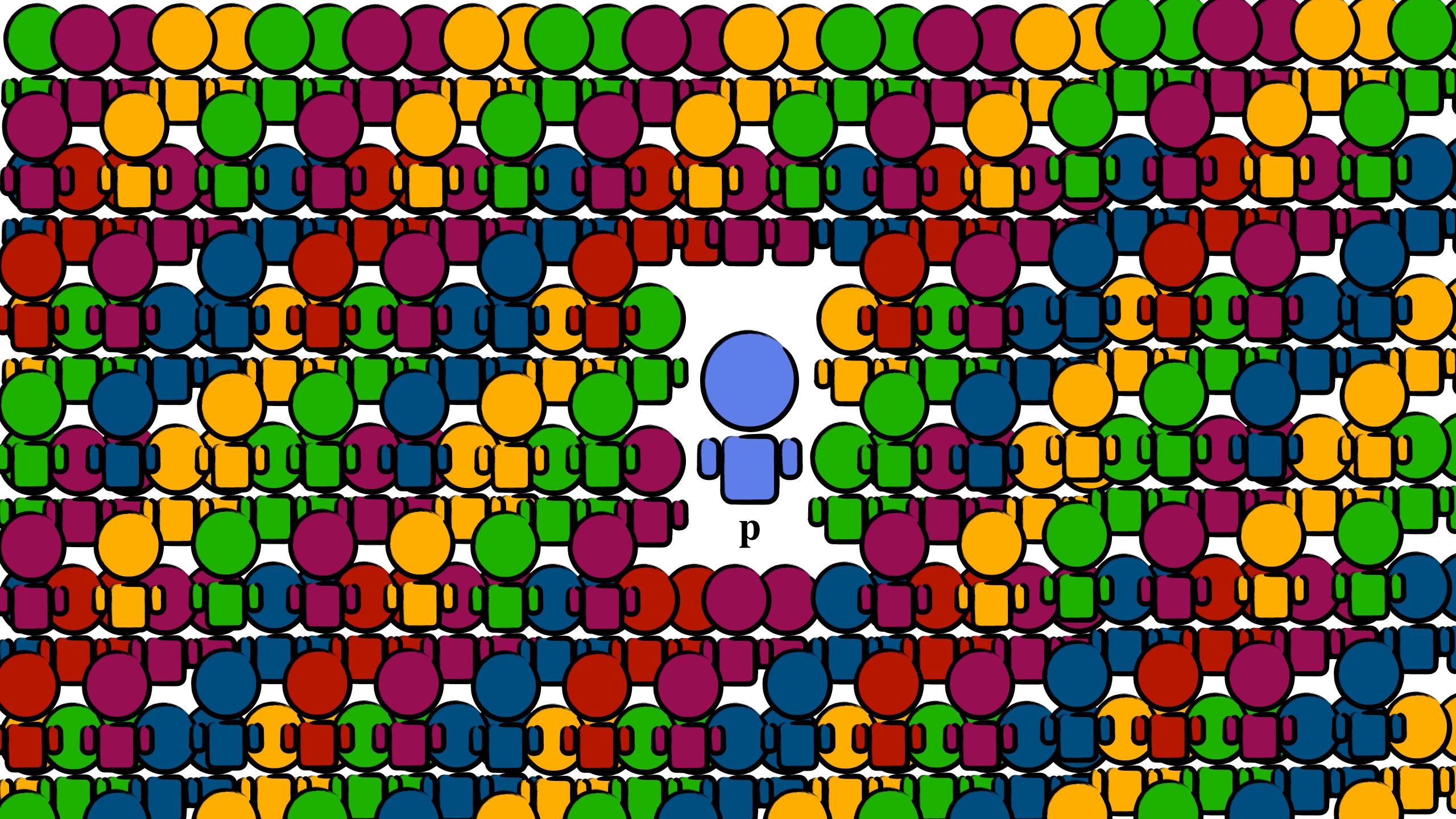
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#### **Nash Definition.**

A strategy **p** for a repeated game is a Nash equilibrium if it is a best response to itself. That is  $\pi(\mathbf{p}, \mathbf{p}) \ge \pi(\sigma, \mathbf{p})$  for all other strategies  $\sigma$ .





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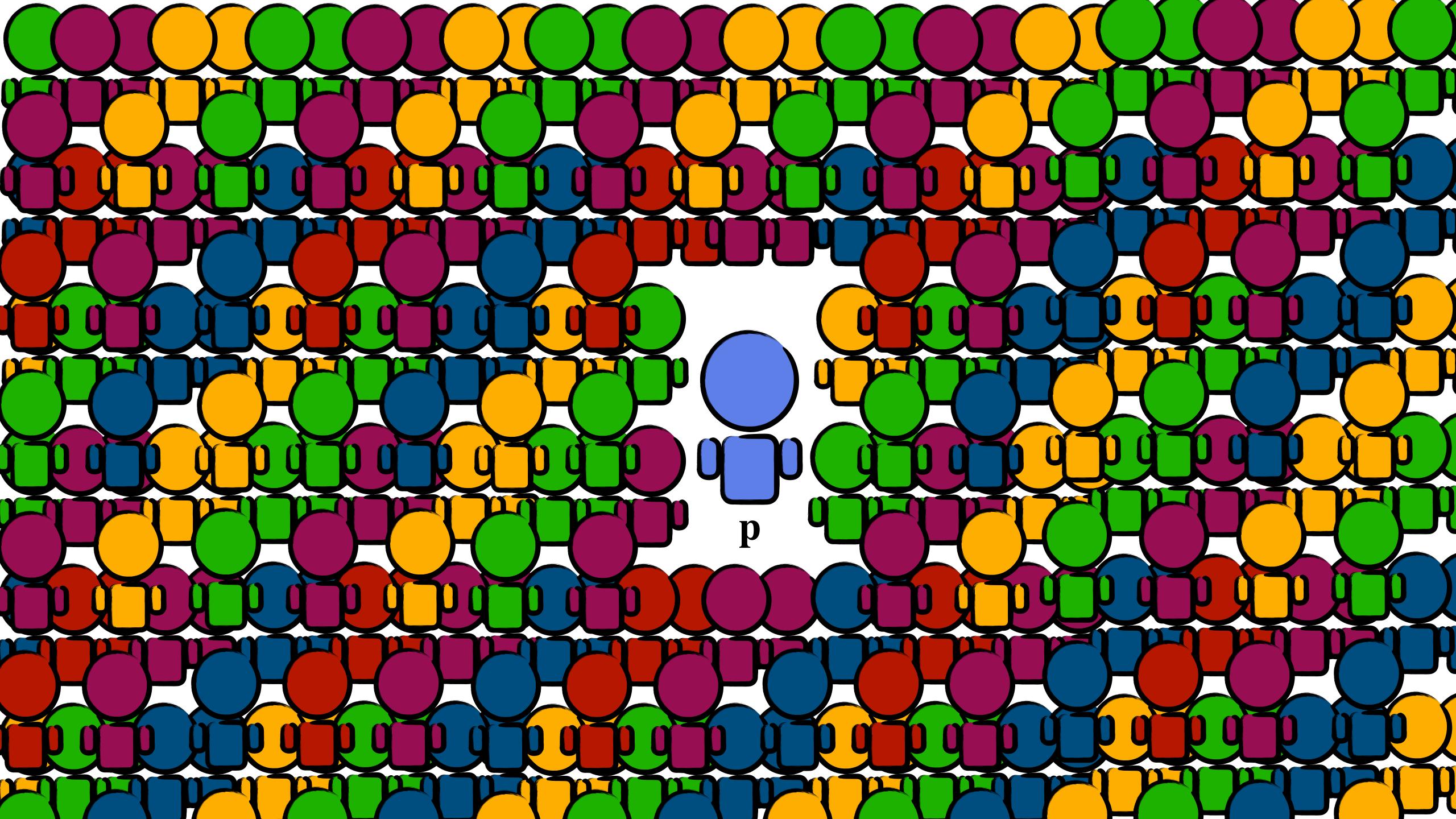
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memory-n strategies  $\sigma$ .

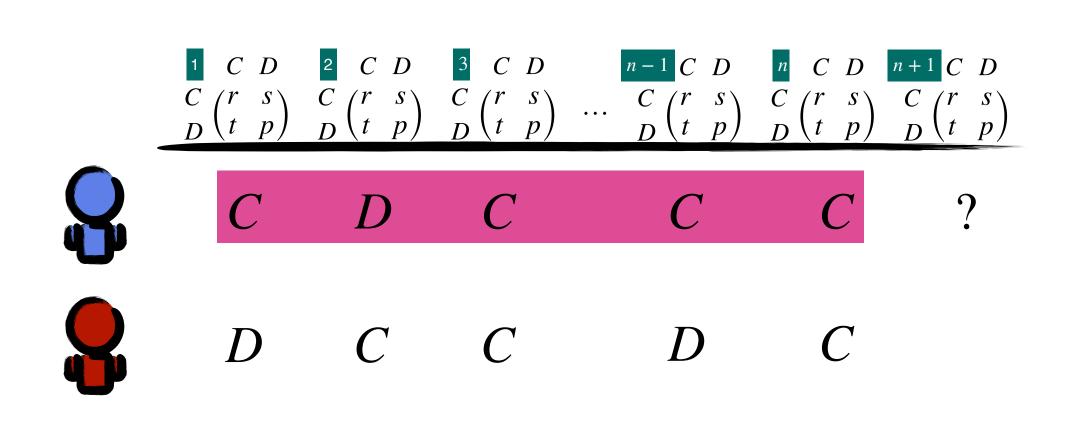


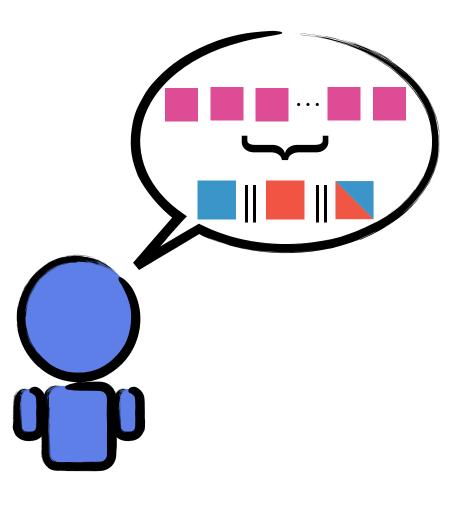
We established the following technical results:

1. Against reactive strategies, any feasible payoff can be generated with self-reactive strategies.

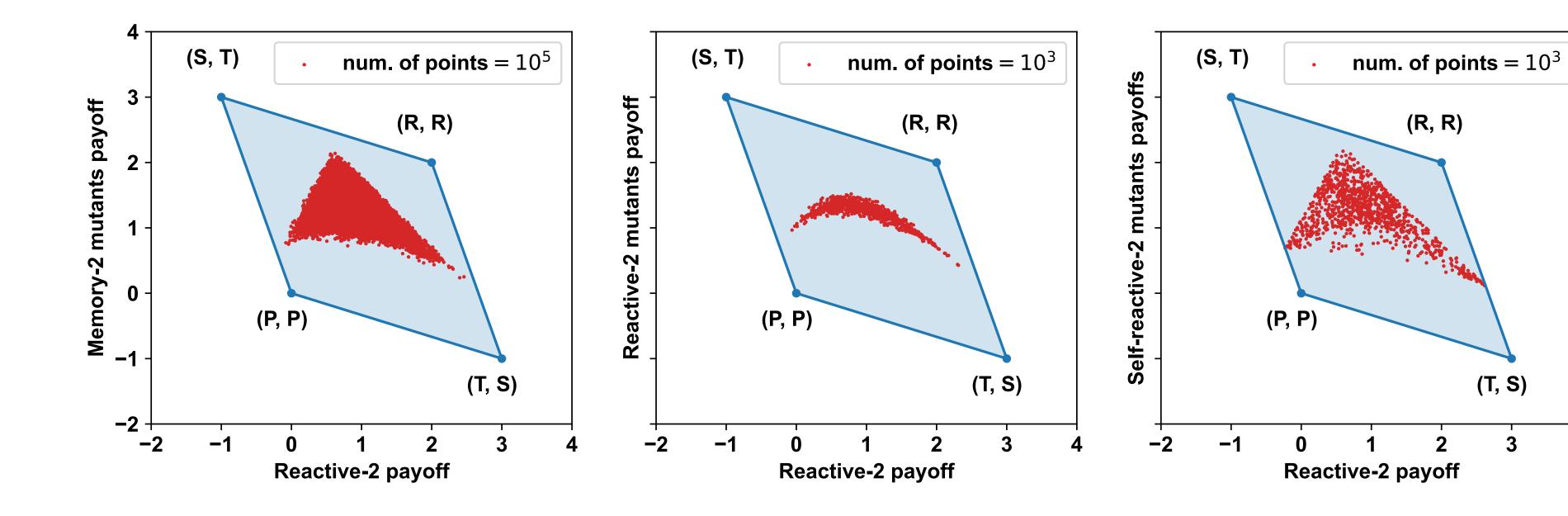
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Self-reactive-*n* 



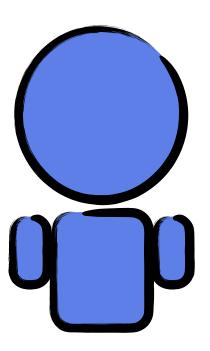
(T, S)

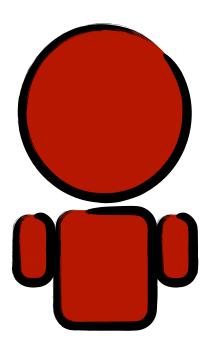
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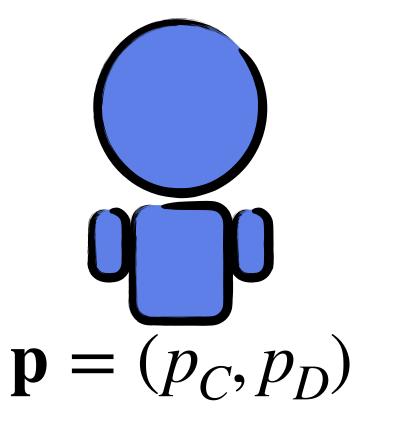
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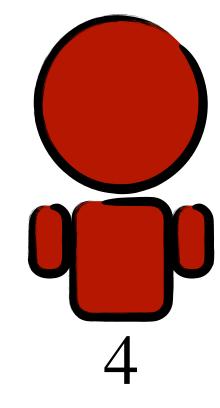
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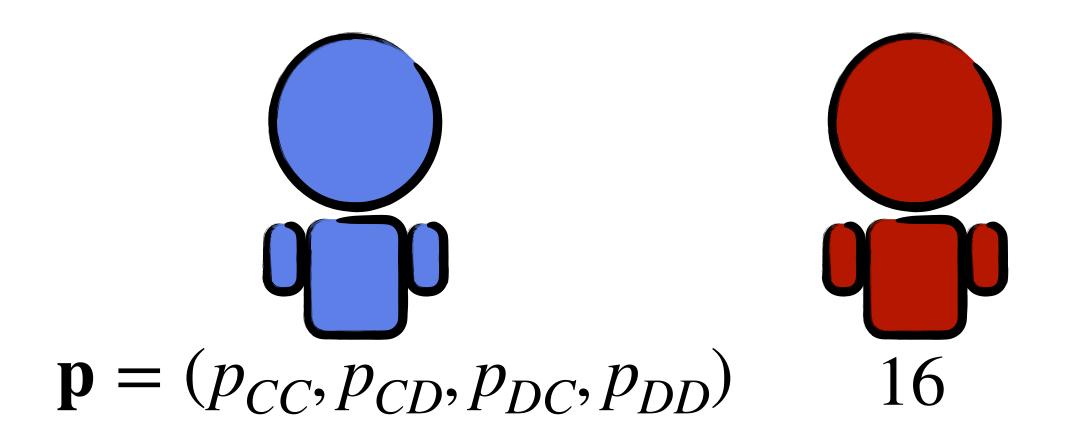
- 1. Against reactive strategies, any feasible payoff can be generated with self-reactive strategies.
- 2. To any reactive strategy, there is a best response among the pure self-reactive strategies.



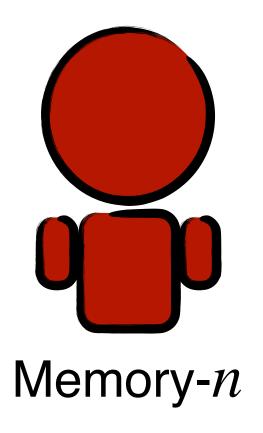


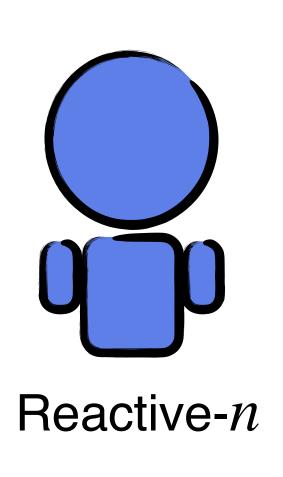




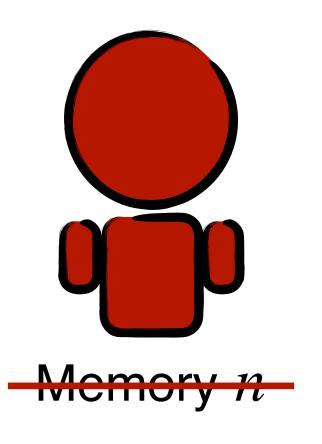




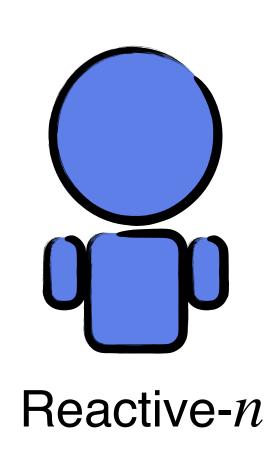




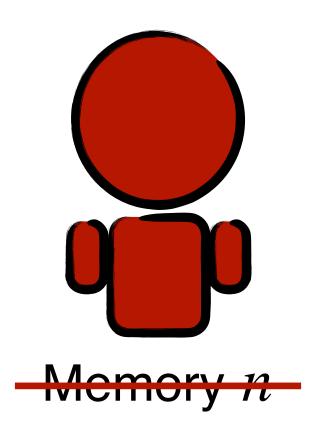
$$2^{2n} \times 2^{2n}$$



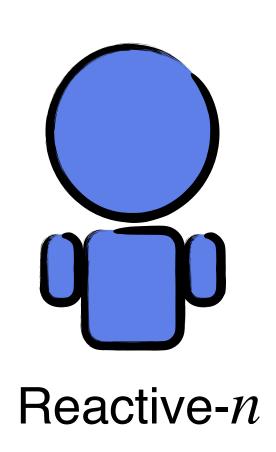
Self-reactive—n



$$2^{2n} \times 2^{2n}$$



Self-reactive—n



$$\frac{2^{2n} \times 2^{2n}}{2^n \times 2^n}$$

```
input: p,n
pure_self_reactive_strategies \leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};
isNash \leftarrowTrue;
for \tilde{\mathbf{p}} \in pure_self_reactive_strategies do

if p is not a best response \tilde{\mathbf{p}} to then

isNash \leftarrowFalse;

return (p, isNash);
```

# Donation game

$$C D$$
 $C \left(b-c-c\right)$ 
 $D \left(b - c - c\right)$ 

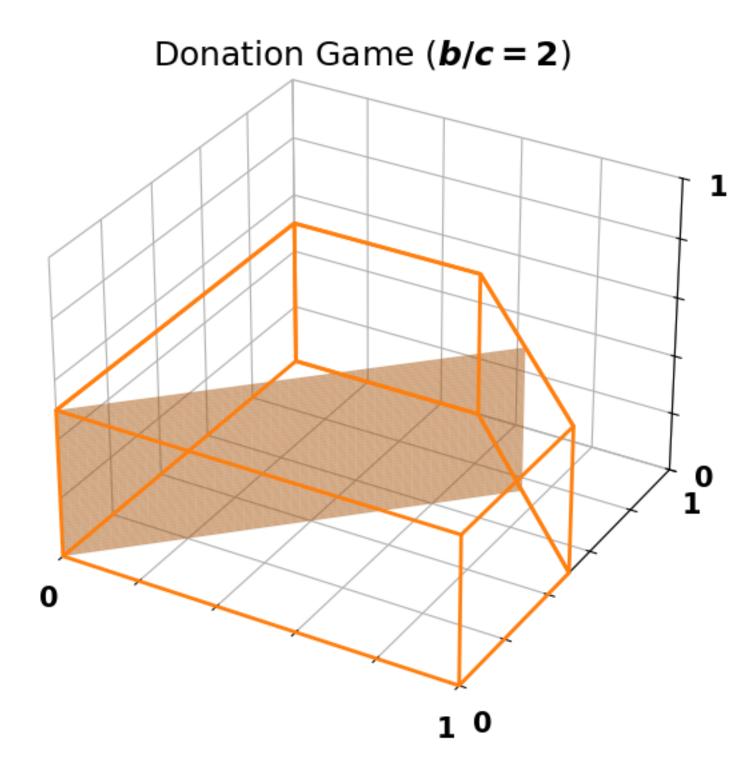
b > c > 0

**Theorem.** A reactive-2 strategy  $\mathbf{p}$  is a cooperative Nash equilibrium if and only if its entries satisfy the conditions,

$$p_{CC} = 1, \quad \frac{p_{CD} + p_{DC}}{2} \le 1 - \frac{1}{2} \cdot \frac{c}{b}, \quad p_{DD} \le 1 - \frac{c}{b}.$$

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# Defective Nash

## Defective Nash

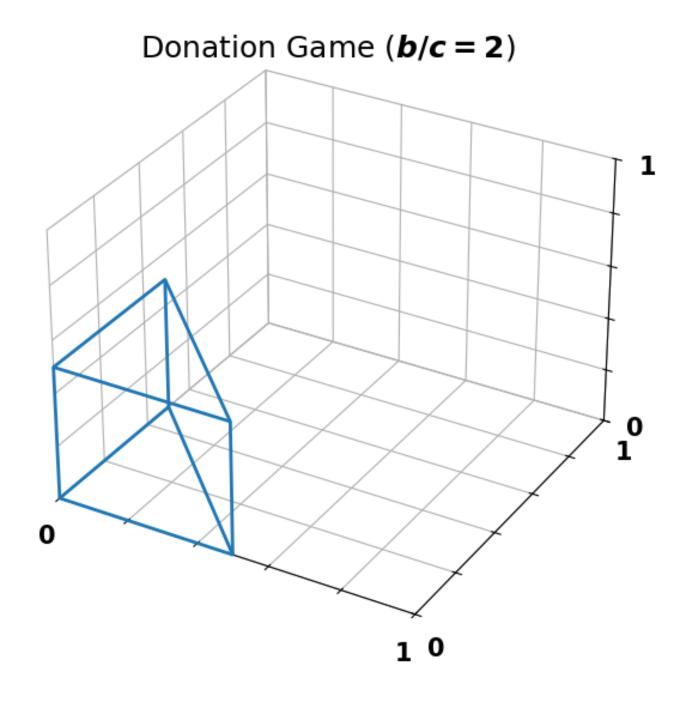
**Theorem.** A reactive-2 strategy  $\mathbf{p}$  is a defective Nash equilibrium if and only if its entries satisfy the conditions,

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## Cooperative Nash

**Theorem.** A reactive-2 strategy  $\mathbf{p}$  is a cooperative Nash equilibrium if and only if its entries satisfy the conditions,

$$p_{CC} = 1, \quad \frac{p_{CD} + p_{DC}}{2} < 1 - \frac{1}{2} \cdot \frac{c}{b}, \quad p_{DD} \le 1 - \frac{c}{b}.$$

**Theorem.** A reactive-3 strategy  $\mathbf{p}$  is a cooperative Nash equilibrium if and only if its entries satisfy the conditions,

$$\begin{aligned} p_{CCC} &= 1 & \frac{p_{CDC} + p_{DCD}}{2} \leq 1 - \frac{1}{2} \cdot \frac{c}{b} \\ \frac{p_{CCD} + p_{CDC} + p_{DCC}}{3} &\leq 1 - \frac{1}{3} \cdot \frac{c}{b} & \frac{p_{CDD} + p_{DCD} + p_{DDC}}{3} \leq 1 - \frac{2}{3} \cdot \frac{c}{b} \\ \frac{p_{CCD} + p_{CDD} + p_{DCC} + p_{DDC}}{4} &\leq 1 - \frac{1}{2} \cdot \frac{c}{b} & p_{DDD} \leq 1 - \frac{c}{b} \end{aligned}$$

#### Defective Nash

**Theorem.** A reactive-2 strategy  $\mathbf{p}$  is a defective Nash equilibrium if and only if its entries satisfy the conditions,

$$p_{CC} \le \frac{c}{b} \quad \frac{p_{CD} + p_{DC}}{2} \le \frac{c}{2b}, \quad p_{DD} = 0.$$

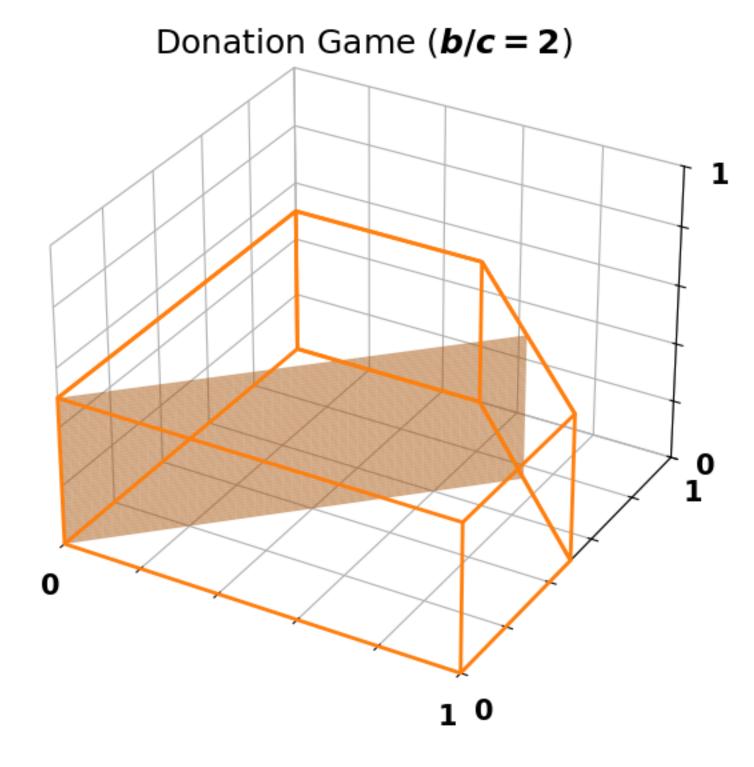
#### Defective Nash

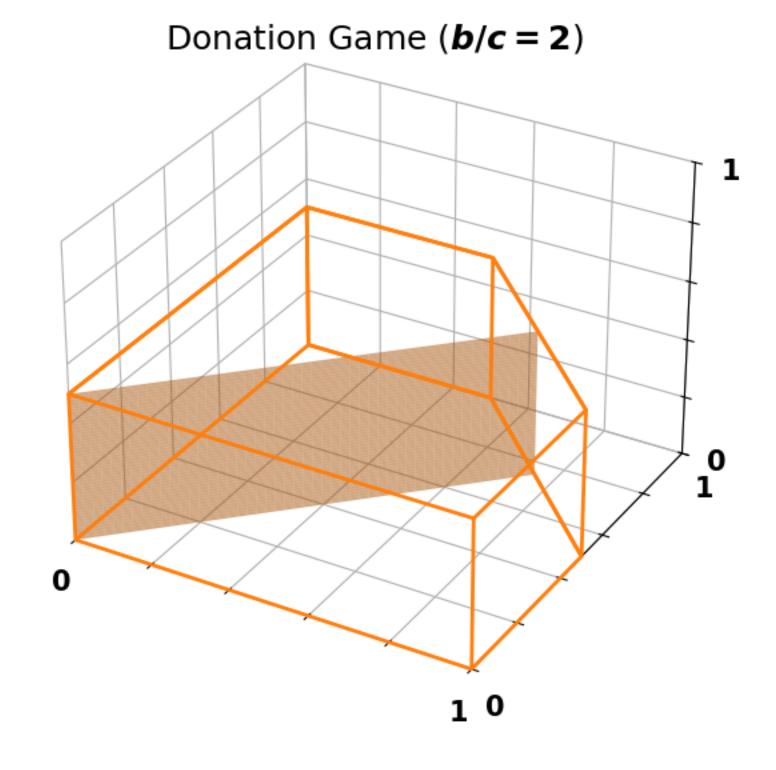
**Theorem.** A reactive-2 strategy  $\mathbf{p}$  is a defective Nash equilibrium if and only if its entries satisfy the conditions,

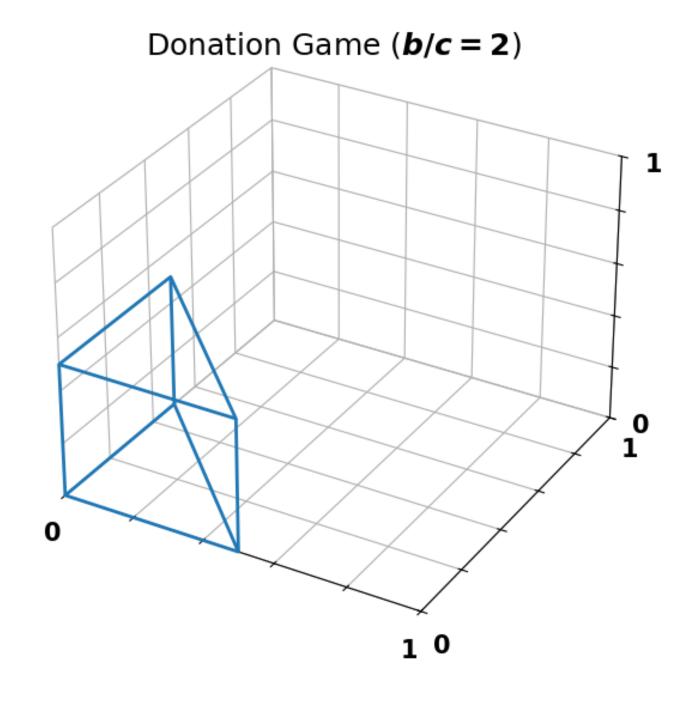
$$p_{CC} \le \frac{c}{b} \quad \frac{p_{CD} + p_{DC}}{2} \le \frac{c}{2b}, \quad p_{DD} = 0.$$

**Theorem.** A reactive-3 strategy  $\mathbf{p}$  is a defecting Nash strategy if and only if its entries satisfy the conditions,

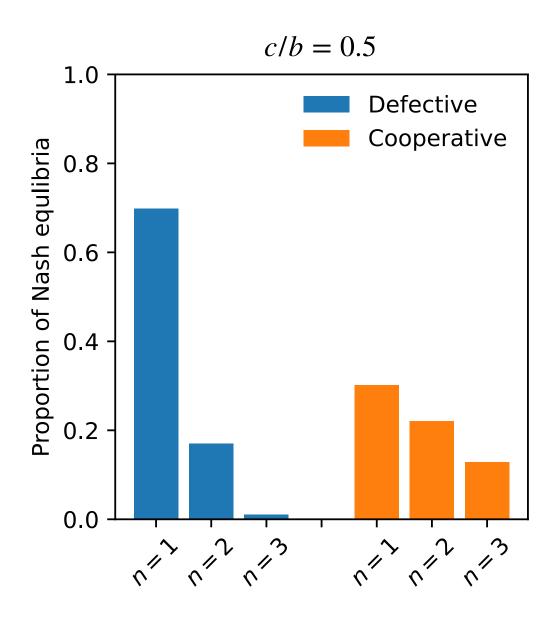
$$\begin{aligned} p_{CCC} & \leq \frac{c}{b}, & \frac{p_{CDC} + p_{DCD}}{2} \leq \frac{1}{2} \cdot \frac{c}{b} \\ & \frac{p_{CCD} + p_{CDC} + p_{DCC}}{3} \leq \frac{2}{3} \cdot \frac{c}{b}, & \frac{p_{CDD} + p_{DCD} + p_{DDC}}{3} \leq \frac{1}{3} \cdot \frac{c}{b} \\ & \frac{p_{CCD} + p_{CDD} + p_{DCC} + p_{DDC}}{4} \leq \frac{1}{2} \cdot \frac{c}{b}, & p_{DDD} & = 0. \end{aligned}$$



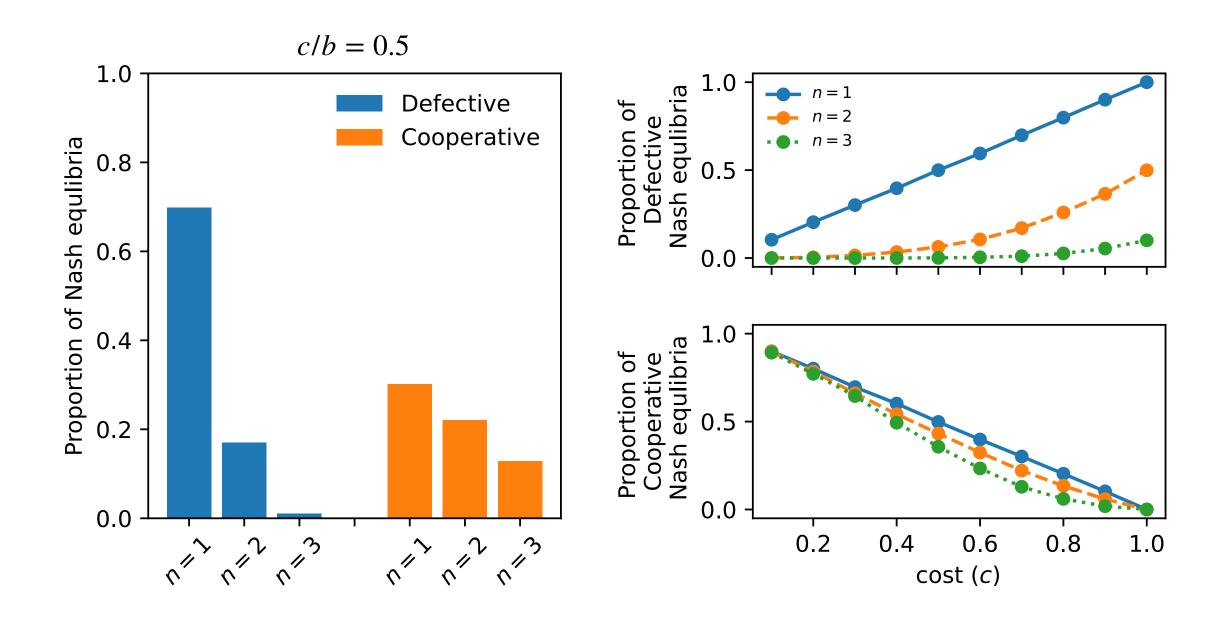




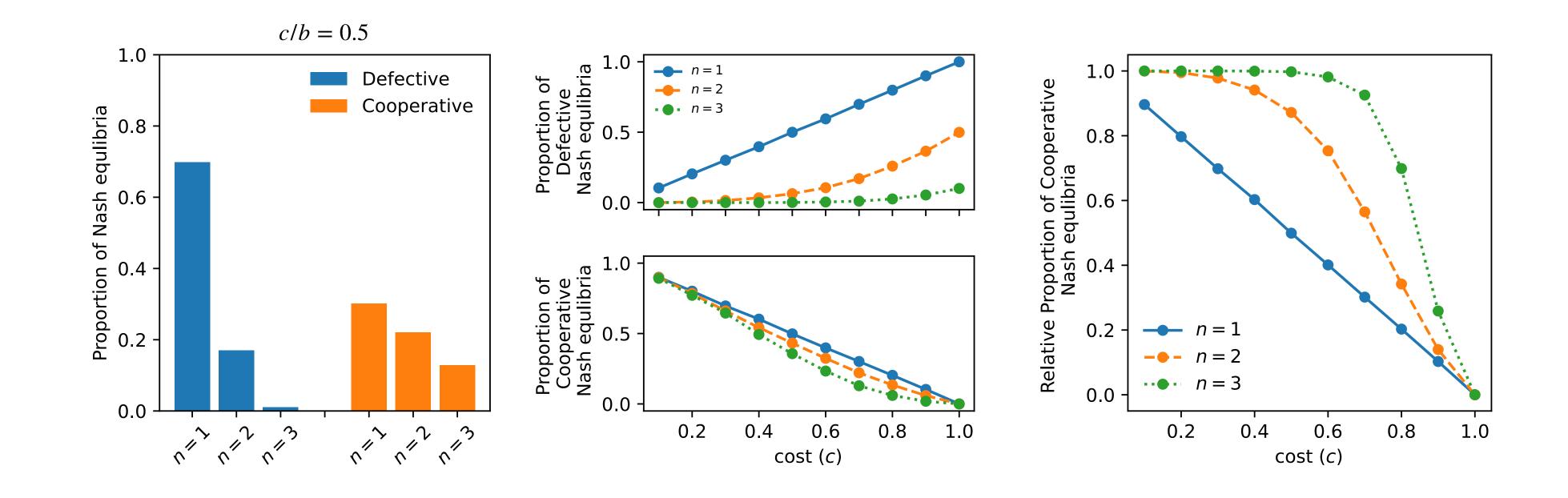
## Cooperative & Defective Nash



### Cooperative & Defective Nash



#### Cooperative & Defective Nash



#### Errors

#### **Definition.**

An individual who intends to cooperate instead defects with some probability  $\varepsilon$ . An individual who intends to defect instead cooperates with the same probability.

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#### **Nash Definition.**

A strategy  $\mathbf{p}$  for a repeated game is a Nash equilibrium if it is a best response to itself. That is  $\pi(\mathbf{p}, \mathbf{p}) \ge \pi(\sigma, \mathbf{p})$  for all other pure self-reactive-n strategies  $\sigma$ .

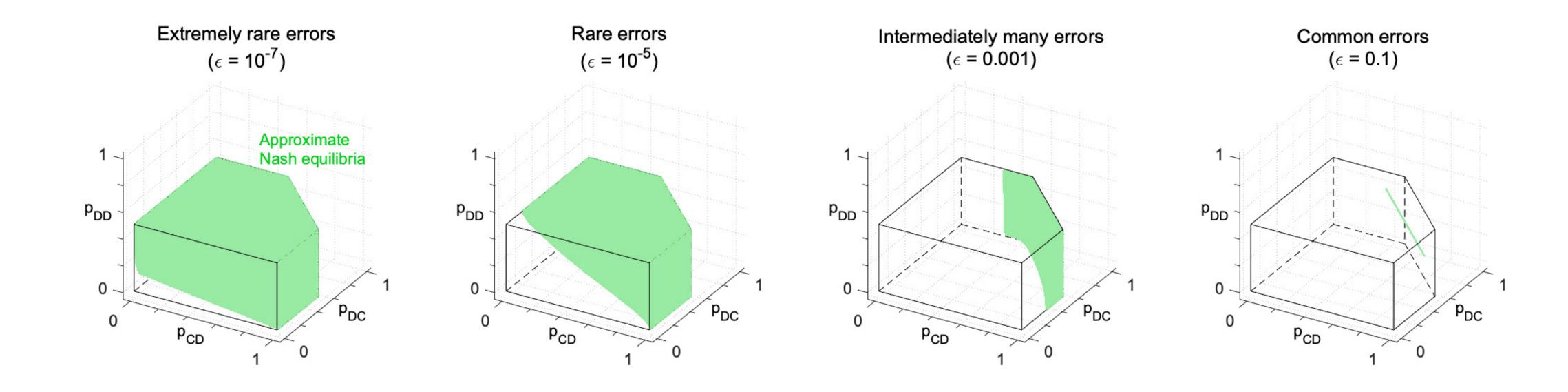
#### **Errors**

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### Reactive counting strategies

#### **Definition.**

A reactive-n counting strategy records how often the co-player has cooperated during the last n rounds.

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**Theorem.** A reactive-n counting strategy  $\mathbf{r}=(r_k)_{k\in\{n,n-1,\dots,0\}}$ , is a cooperative Nash equilibrium if and only if

$$r_n = 1$$
 and  $r_{n-k} \le 1 - \frac{k}{n} \cdot \frac{c}{b}$  for  $k \in \{1, 2, ..., n\}$ .

### Reactive counting strategies

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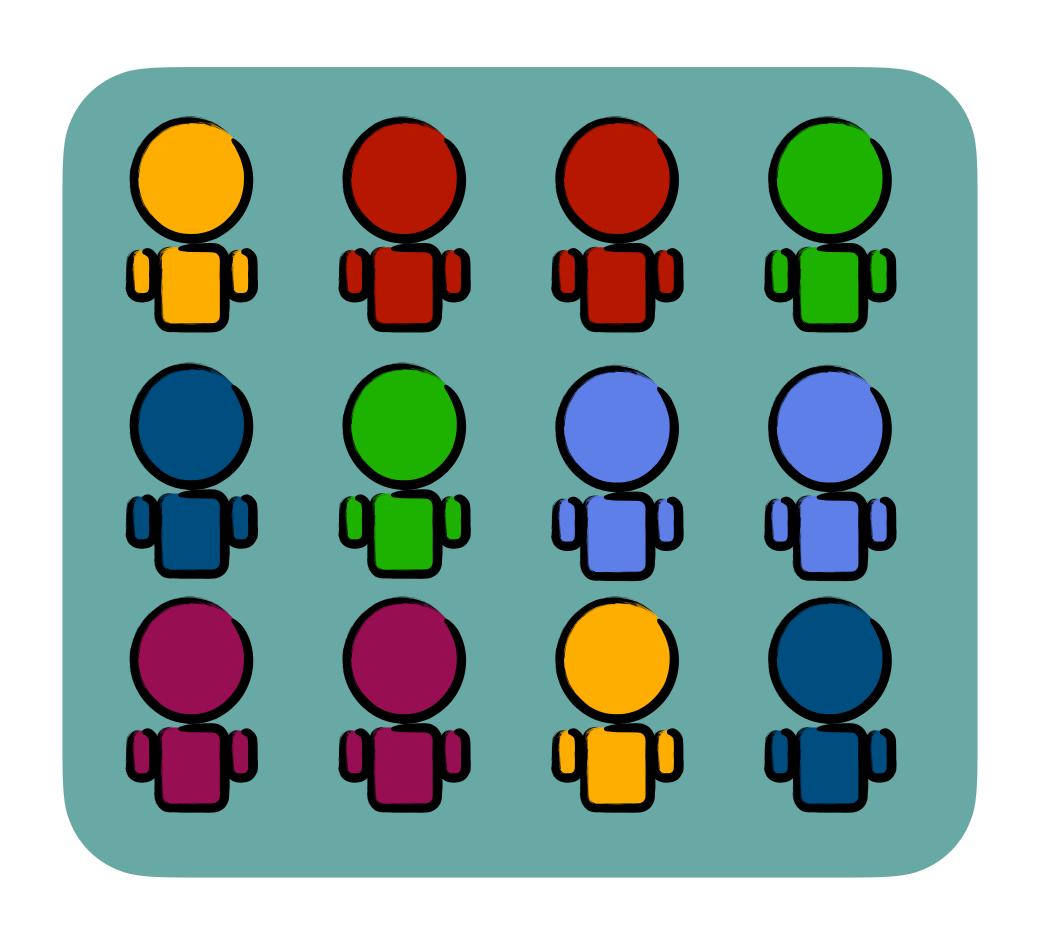
A reactive-n counting strategy records how often the co-player has cooperated during the last n rounds.

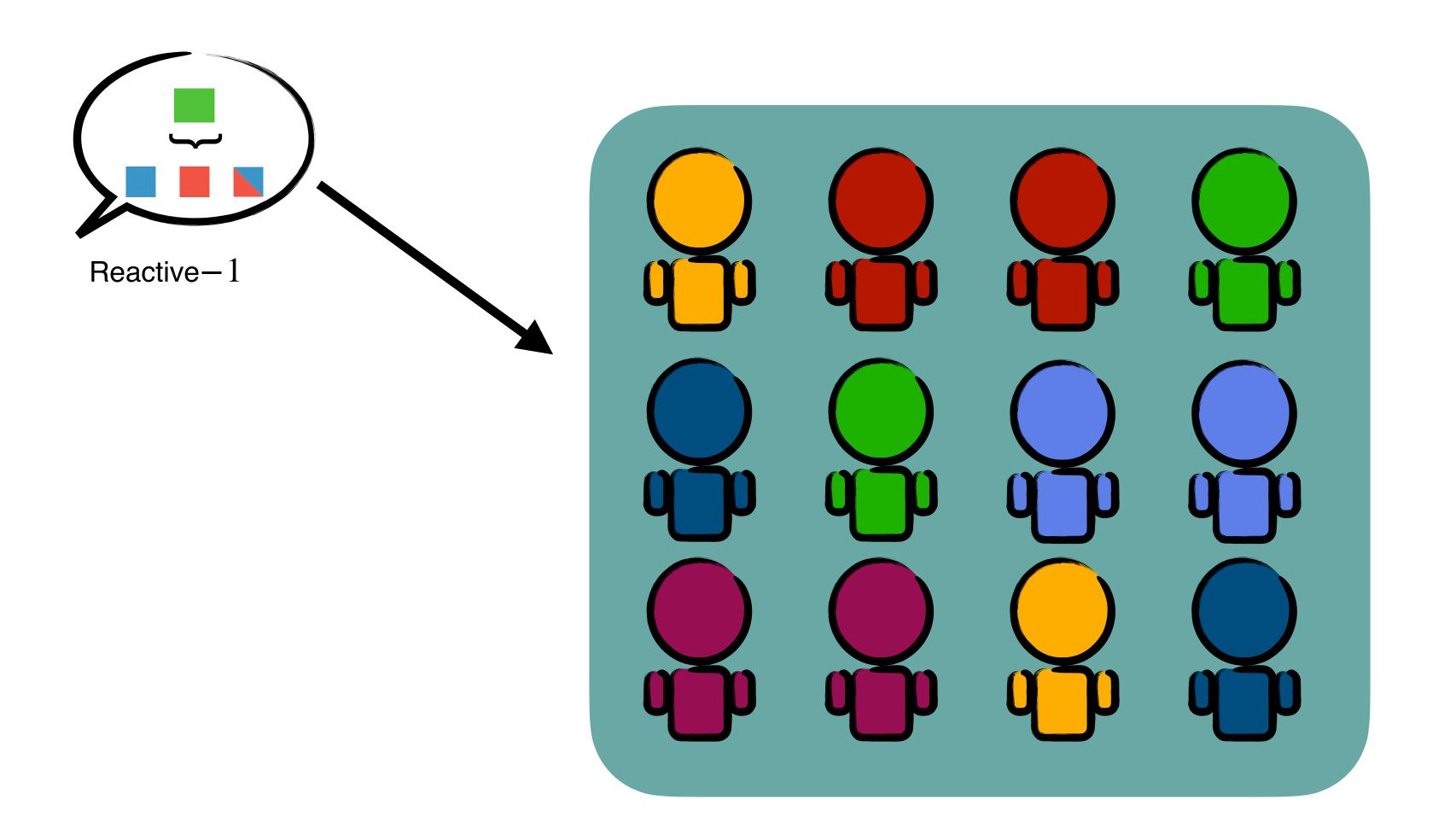
**Theorem.** A reactive-n counting strategy  $\mathbf{r} = (r_k)_{k \in \{n, n-1, \dots, 0\}}$ , is a cooperative Nash equilibrium if and only if

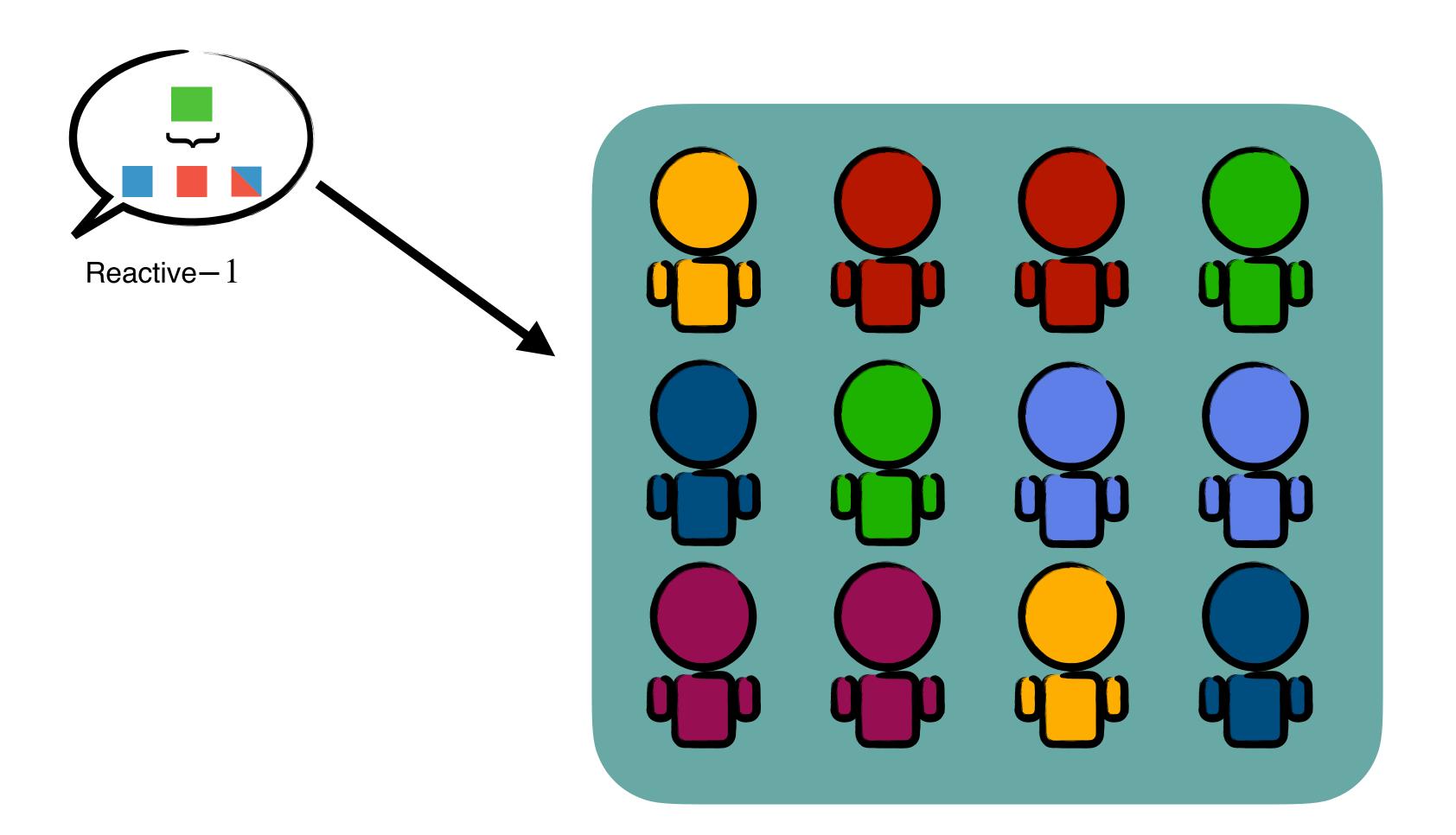
$$r_n = 1$$
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**Theorem.** A reactive-n counting strategy  $\mathbf{r}=(r_k)_{k\in\{n,n-1,\dots,0\}}$ , is a defective Nash equilibrium if and only if

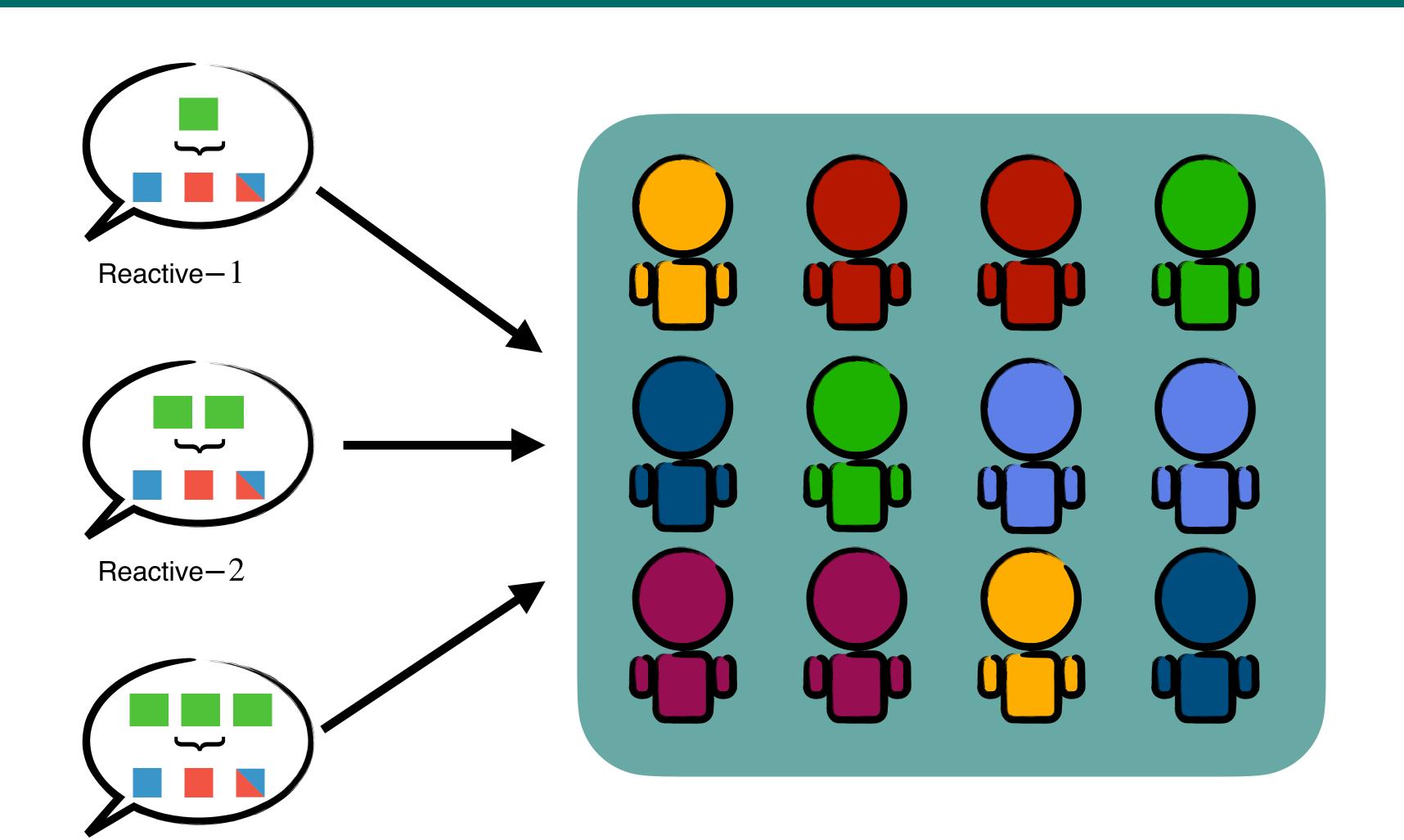
$$r_0 = 0$$
 and  $r_k \le \frac{k}{n} \cdot \frac{c}{b}$  for  $k \in \{0, 1, ..., n\}$ .





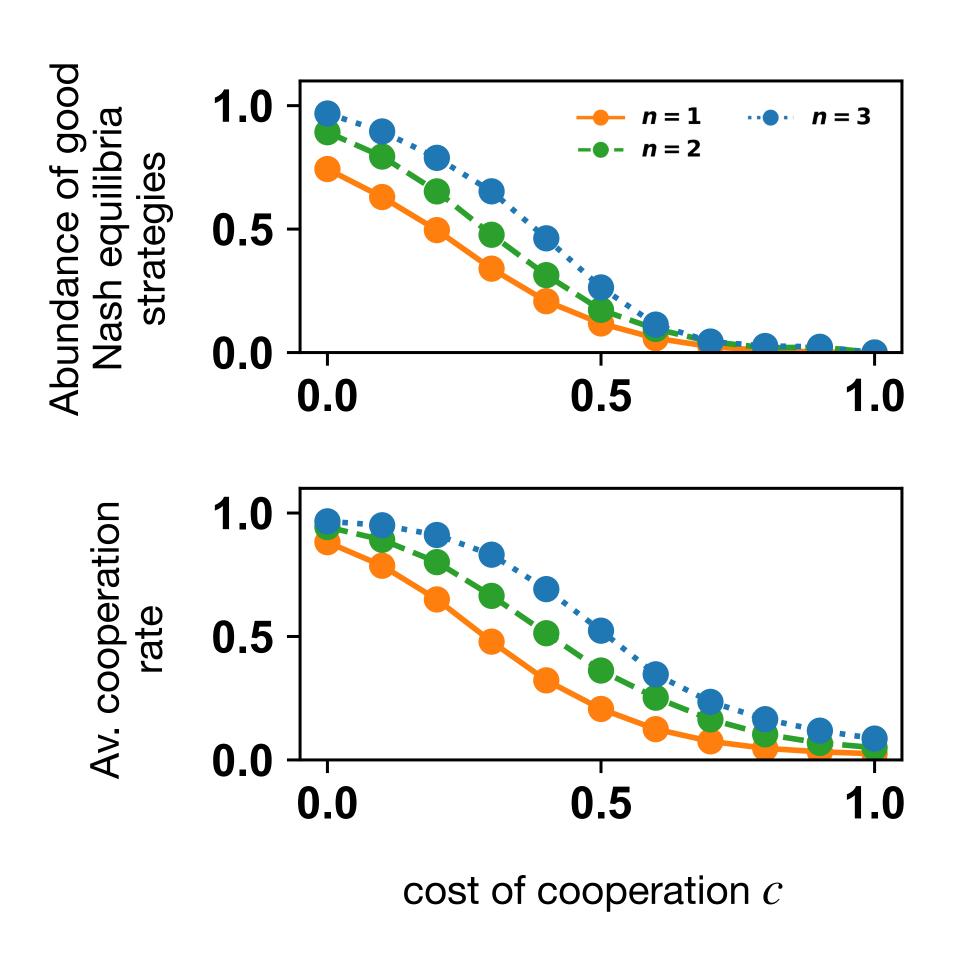


Av. cooperation rate

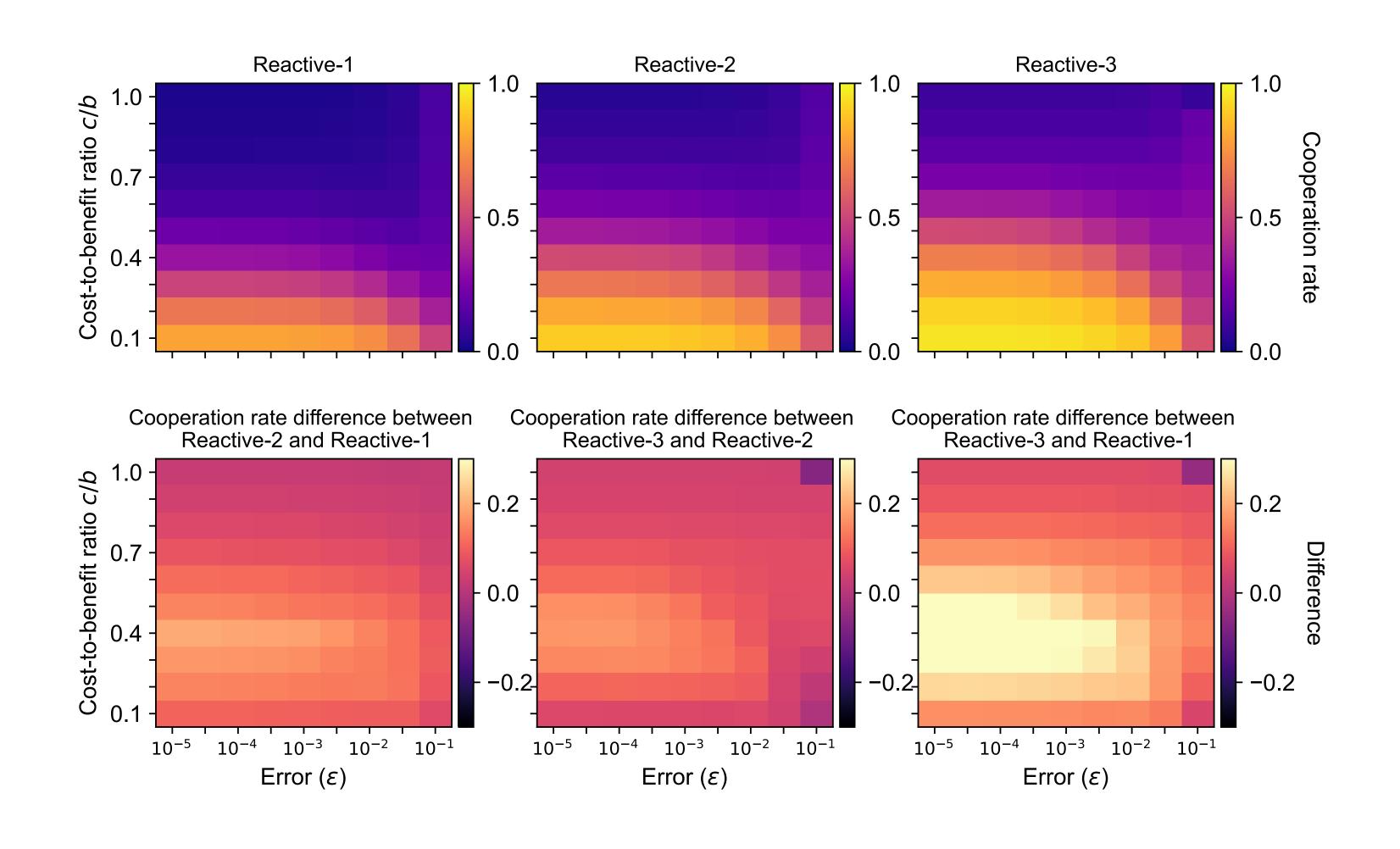


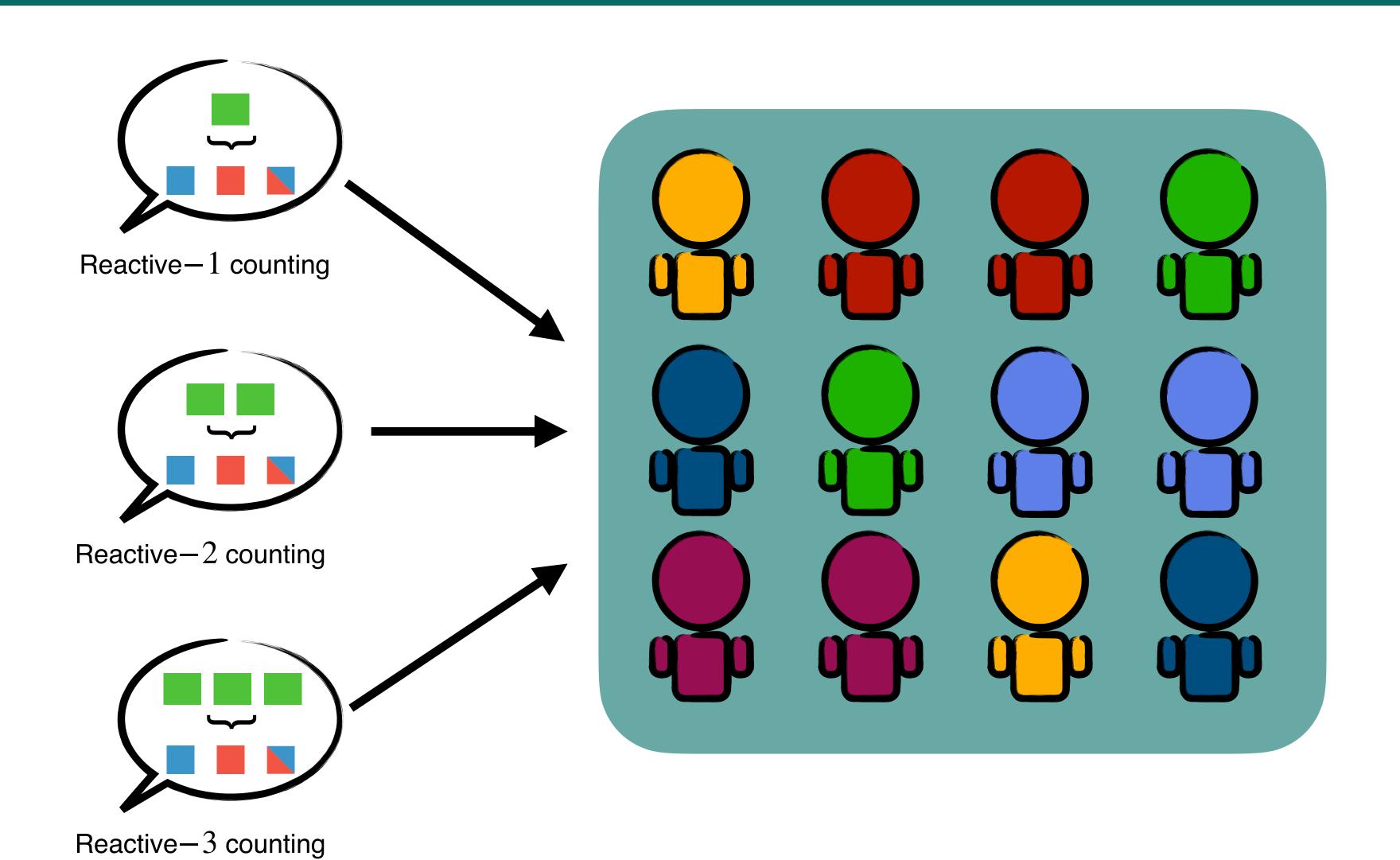
Reactive-3

Av. cooperation rate

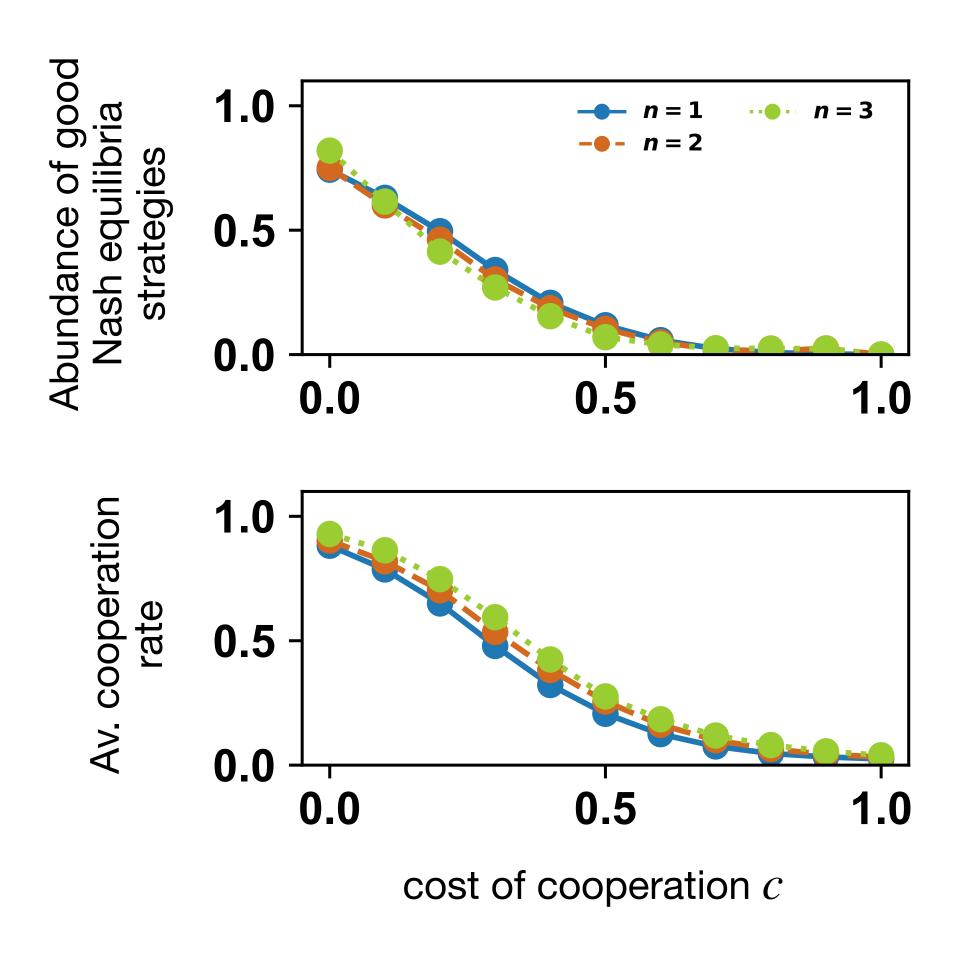


# Evolutionary Simulations with Errors

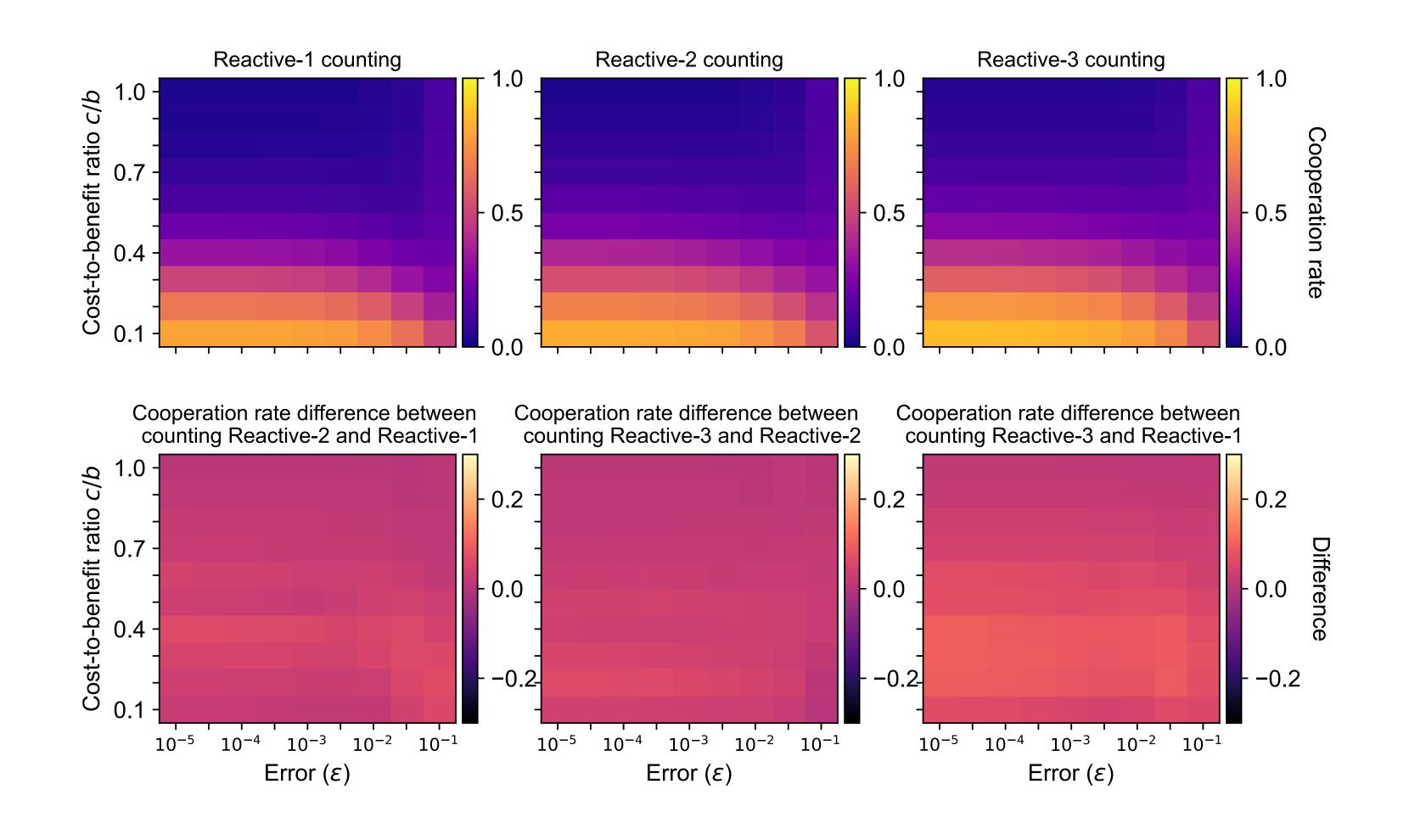




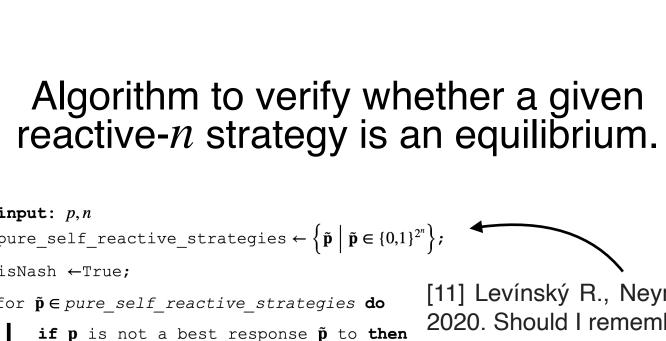
Av. cooperation rate



## Evolutionary Simulations with Errors



pure\_self\_reactive\_strategies  $\leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};$ isNash ←True; [11] Levínský R., Neyman A., Zelený M., for  $\tilde{\mathbf{p}} \in pure\_self\_reactive\_strategies$  **do** 2020. Should I remember more than you?  $\textbf{if } p \text{ is not a best response } \tilde{p} \text{ to } \textbf{then}$ Best responses to factored strategies. isNash ←False; return (p, isNash);



## Algorithm to verify whether a given reactive-n strategy is an equilibrium.

1.

```
input: p,n

pure_self_reactive_strategies \leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};

isNash \leftarrowTrue;

for \tilde{\mathbf{p}} \in pure\_self\_reactive\_strategies do

if \mathbf{p} is not a best response \tilde{\mathbf{p}} to then

isNash \leftarrowFalse;

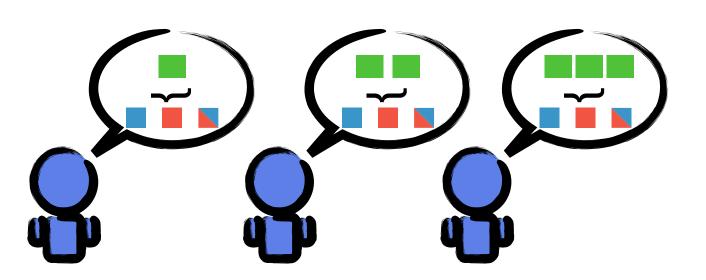
return (\mathbf{p}, \text{ isNash});

[11] Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you?

Best responses to factored strategies.
```

2

## Fully characterize cooperative & defective equilibria for n=2 and n=3.



## Algorithm to verify whether a given reactive-n strategy is an equilibrium.

1.

input: 
$$p,n$$

pure\_self\_reactive\_strategies  $\leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};$ 

isNash  $\leftarrow$ True;

for  $\tilde{\mathbf{p}} \in pure\_self\_reactive\_strategies$  do

if  $\mathbf{p}$  is not a best response  $\tilde{\mathbf{p}}$  to then

isNash  $\leftarrow$ False;

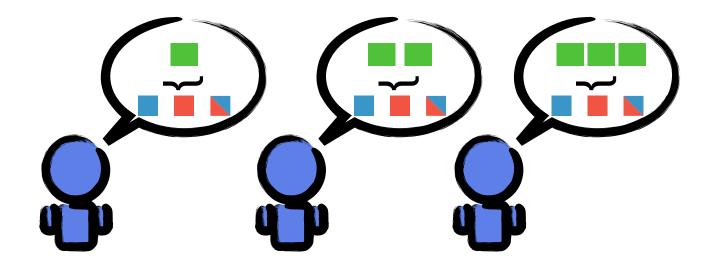
return  $(\mathbf{p}, \text{ isNash});$ 

[11] Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you?

Best responses to factored strategies.

2.

## Fully characterize cooperative & defective equilibria for n=2 and n=3.



3.

Fully characterize cooperative & defective equilibria for any *n* for reactive counting strategies.

$$r_{n-k} \le 1 - \frac{k}{n} \cdot \frac{c}{b}$$
 for  $k \in \{1, 2, ..., n\}$ .

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pure\_self\_reactive\_strategies 
$$\leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};$$
isNash  $\leftarrow$ True;
for  $\tilde{\mathbf{p}} \in pure_self_reactive_strategies$  do

if p is not a best response  $\tilde{\mathbf{p}}$  to then
lisNash  $\leftarrow$ False;

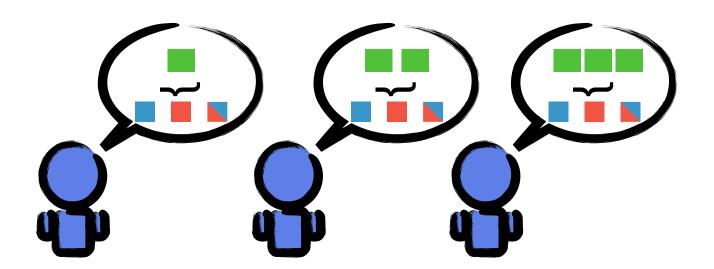
return (p, isNash);

4

[11] Levínský R., Neyman A., Zelený M.,2020. Should I remember more than you?Best responses to factored strategies.

2.

Fully characterize cooperative & defective equilibria for n=2 and n=3.

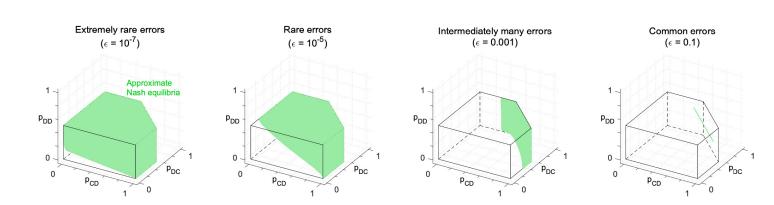


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Fully characterize cooperative & defective equilibria for any *n* for reactive counting strategies.

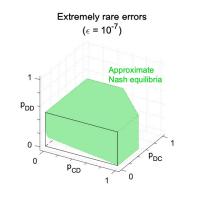
$$r_{n-k} \le 1 - \frac{k}{n} \cdot \frac{c}{b}$$
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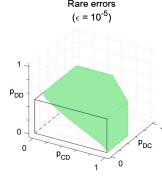
## Explore the effects of implementation errors.

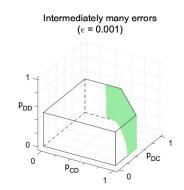


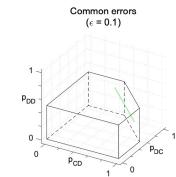
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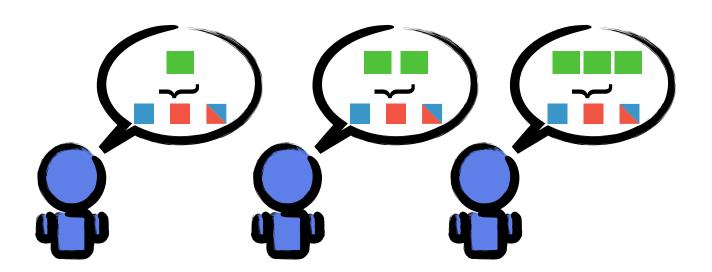








Fully characterize cooperative & defective equilibria for n=2 and n = 3.

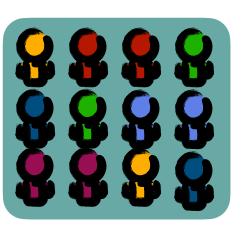


**5.** 

Performed evolutionary simulations varying several key parameters.

Explore the effects of implementation

errors.



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Fully characterize cooperative & defective equilibria for any n for reactive counting strategies.

$$r_{n-k} \le 1 - \frac{k}{n} \cdot \frac{c}{b}$$
 for  $k \in \{1, 2, ..., n\}$ .

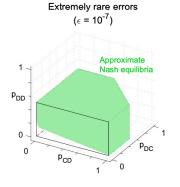
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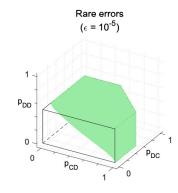
pure\_self\_reactive\_strategies  $\leftarrow \left\{ \tilde{\mathbf{p}} \mid \tilde{\mathbf{p}} \in \{0,1\}^{2^n} \right\};$ 

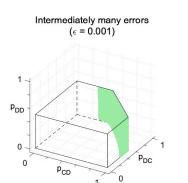
for  $\tilde{\mathbf{p}} \in pure\_self\_reactive\_strategies$  do  $\mbox{if } p \mbox{ is not a best response } \tilde{p} \mbox{ to } \mbox{then}$ isNash ←False;

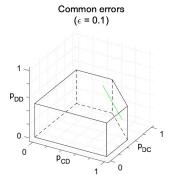
return (p, isNash);

[11] Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you? Best responses to factored strategies.

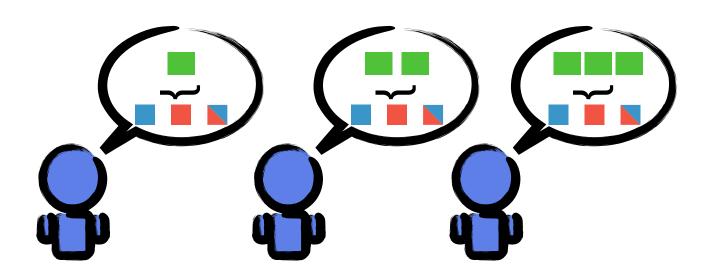








Fully characterize cooperative & defective equilibria for n=2 and n = 3.

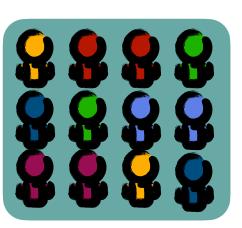


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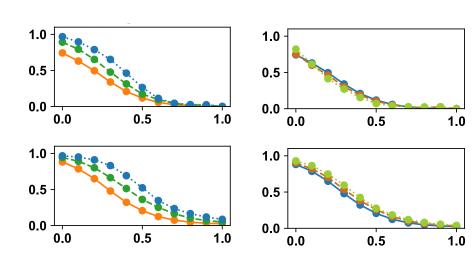
3.

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6.

Longer memory helps sustain cooperation.



## 1. Introduction and motivation

2. Conditional cooperation with longer memory

Published PNAS: https://doi.org/10.1073/pnas.2420125121

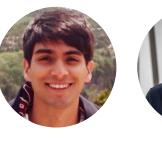






Complete strategy spaces of direct reciprocity

Under review *PNAS* 







Can I afford to remember less than you?

Under review Economics Letters





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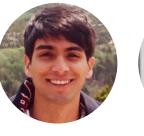






Complete strategy spaces of direct reciprocity

Under review *PNAS* 





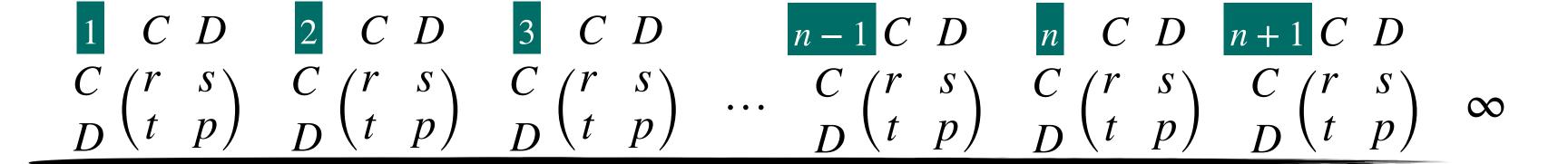


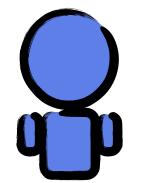
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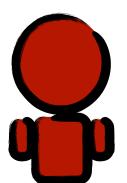




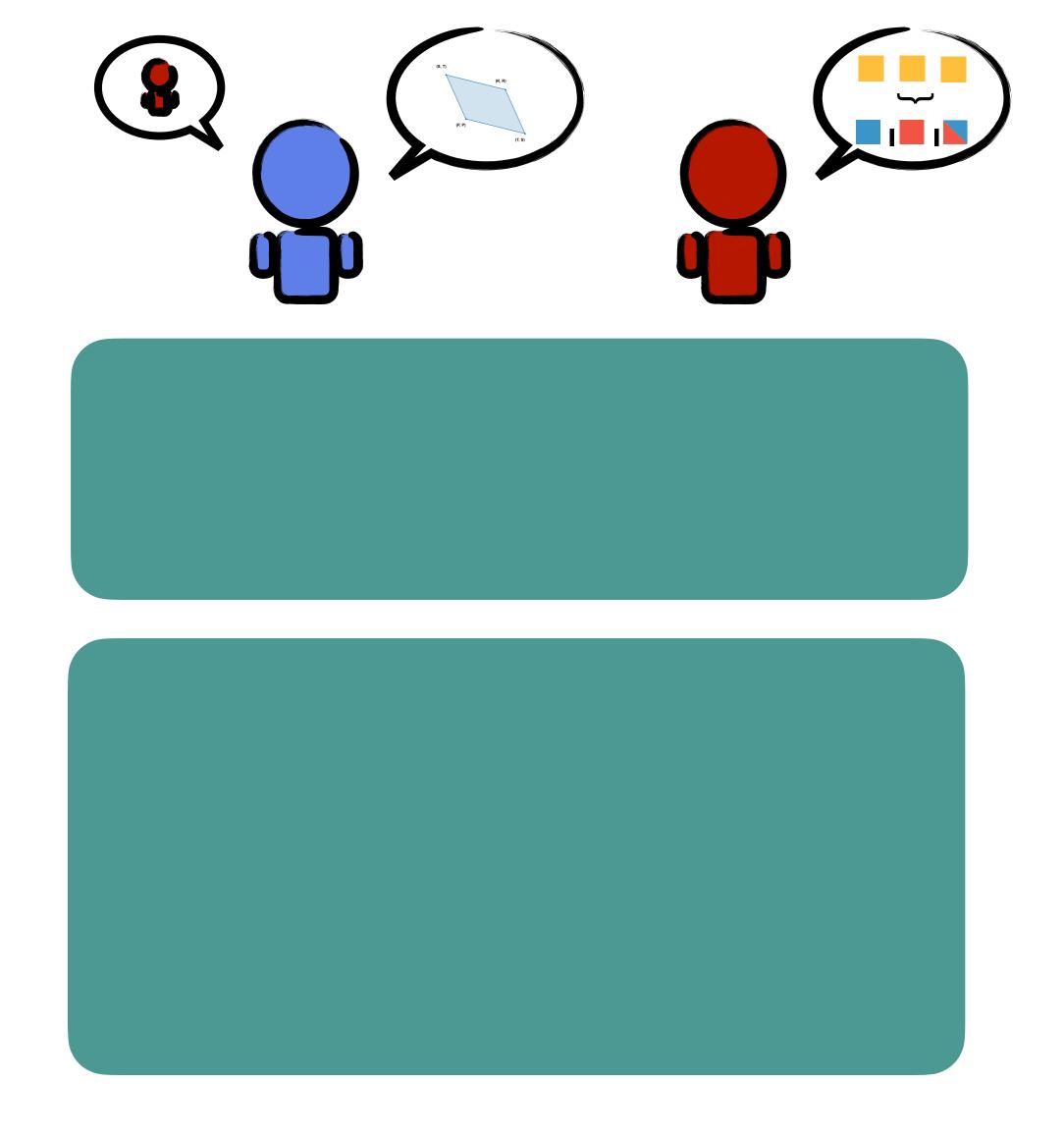




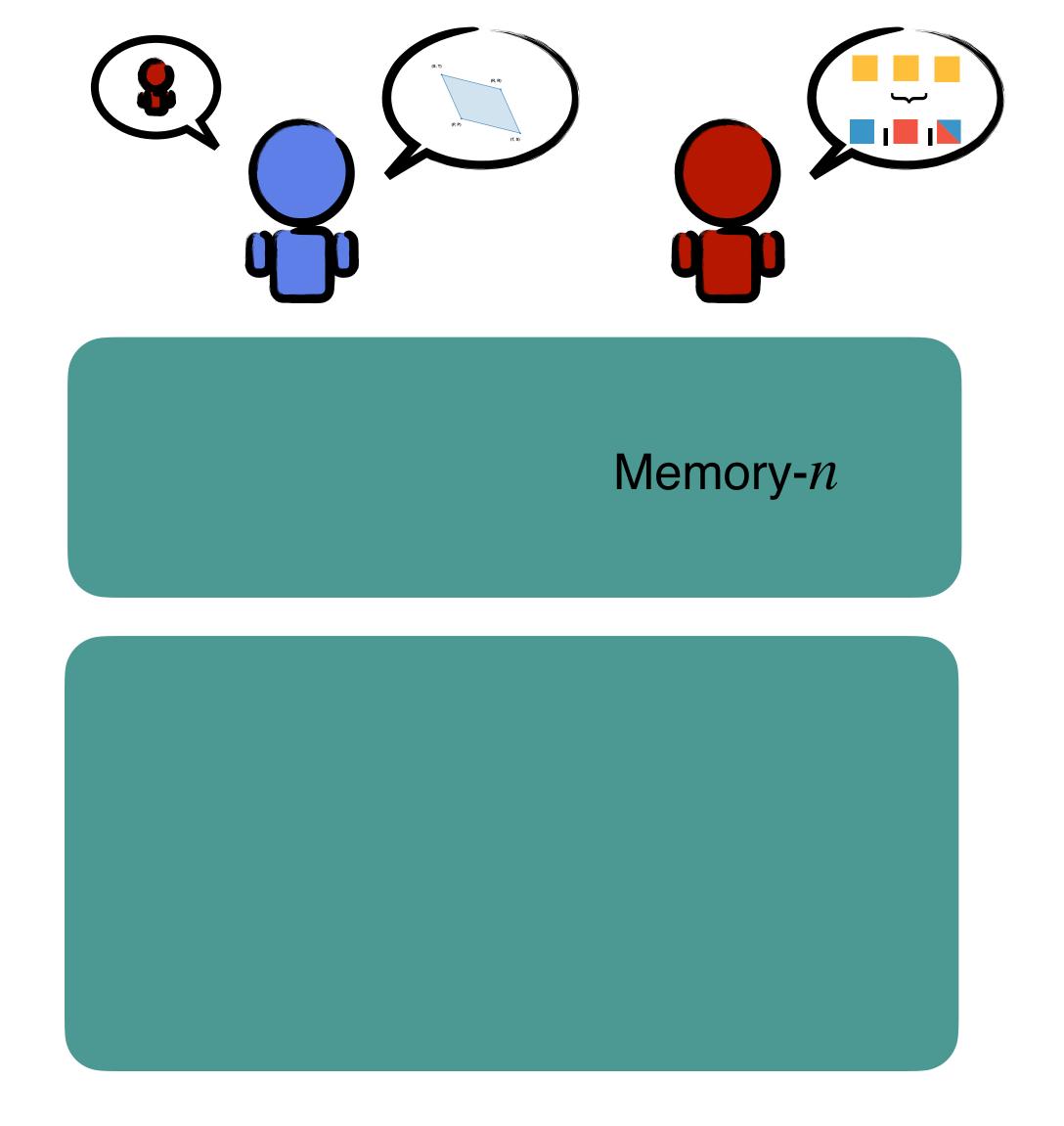
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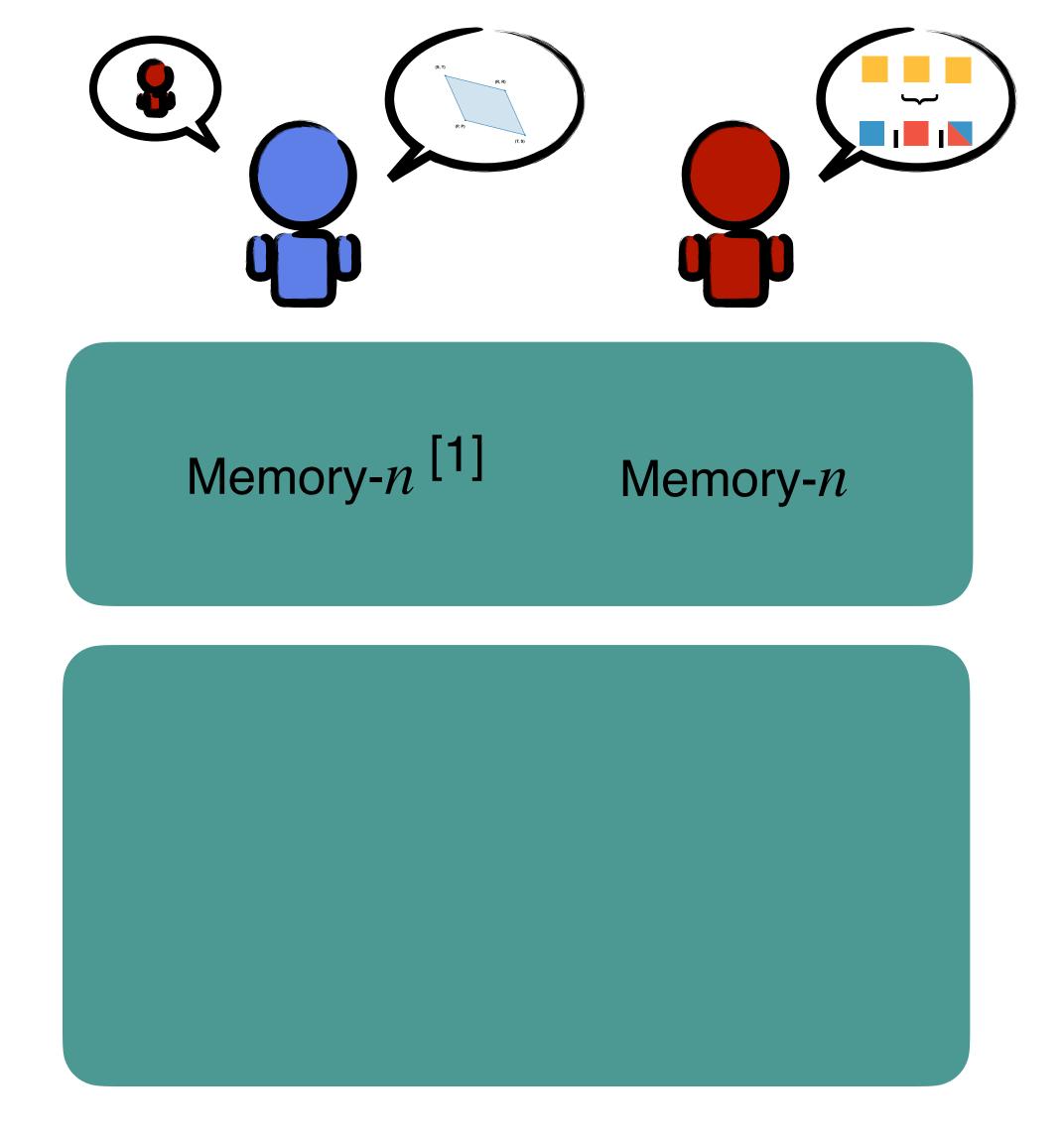


- [1] Press, W.H. and Dyson, F.J., 2012. Iterated Prisoner's Dilemma contains strategies that dominate any evolutionary opponent.
- [12] Glynatsi N.E., Akin E., Nowak M.A., Hilbe C. 2024. Conditional strategies with longer memory.



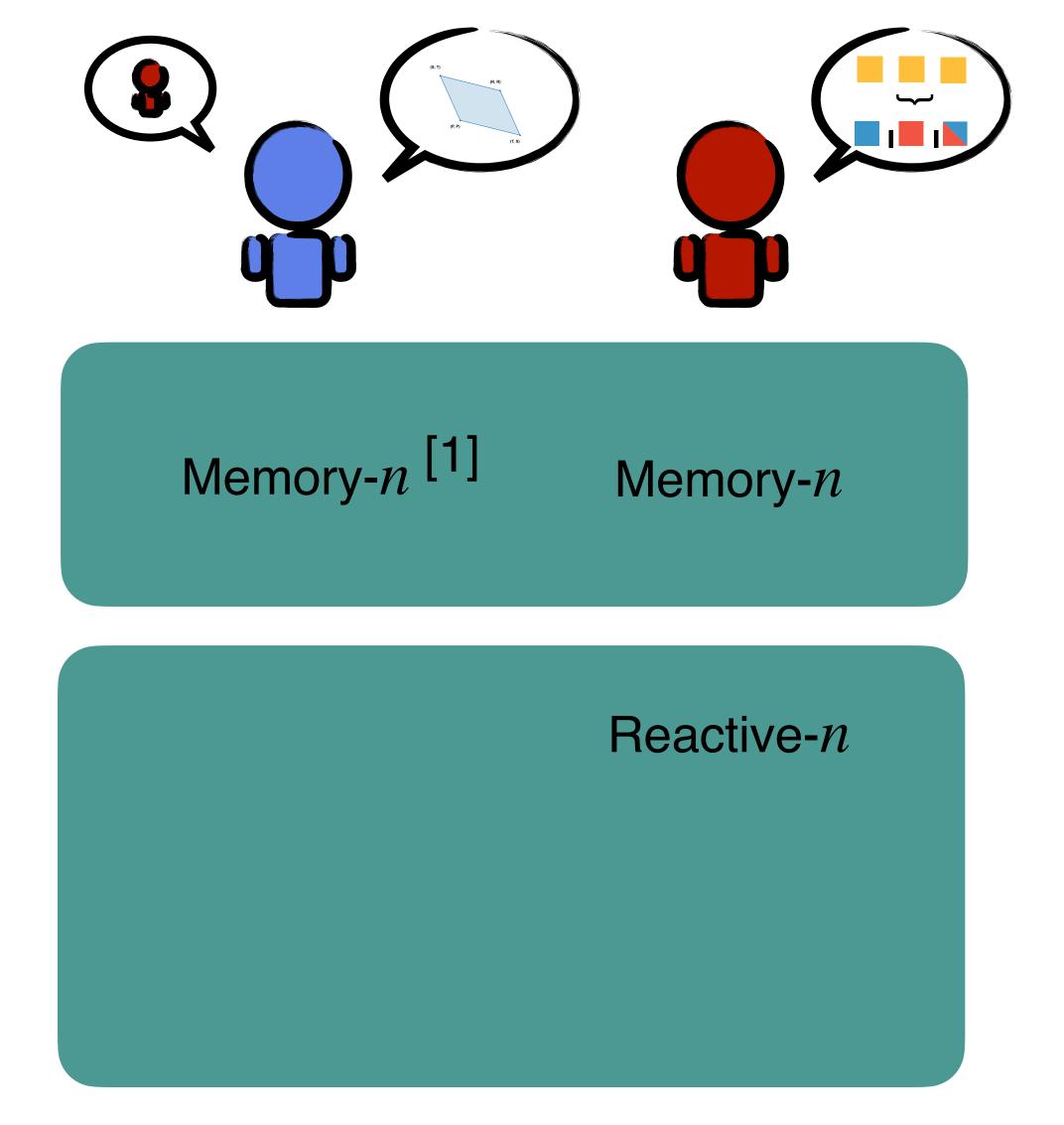
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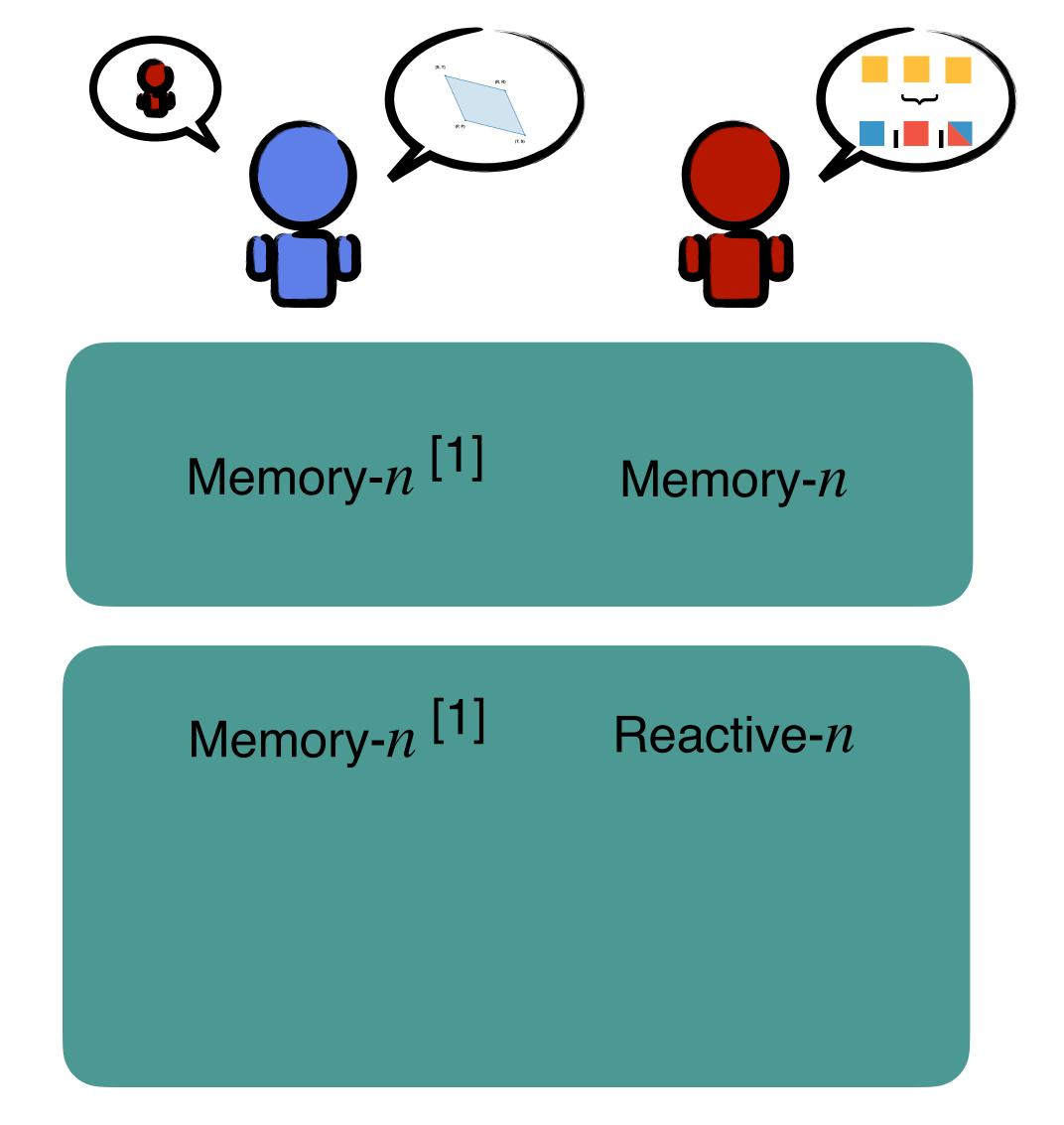
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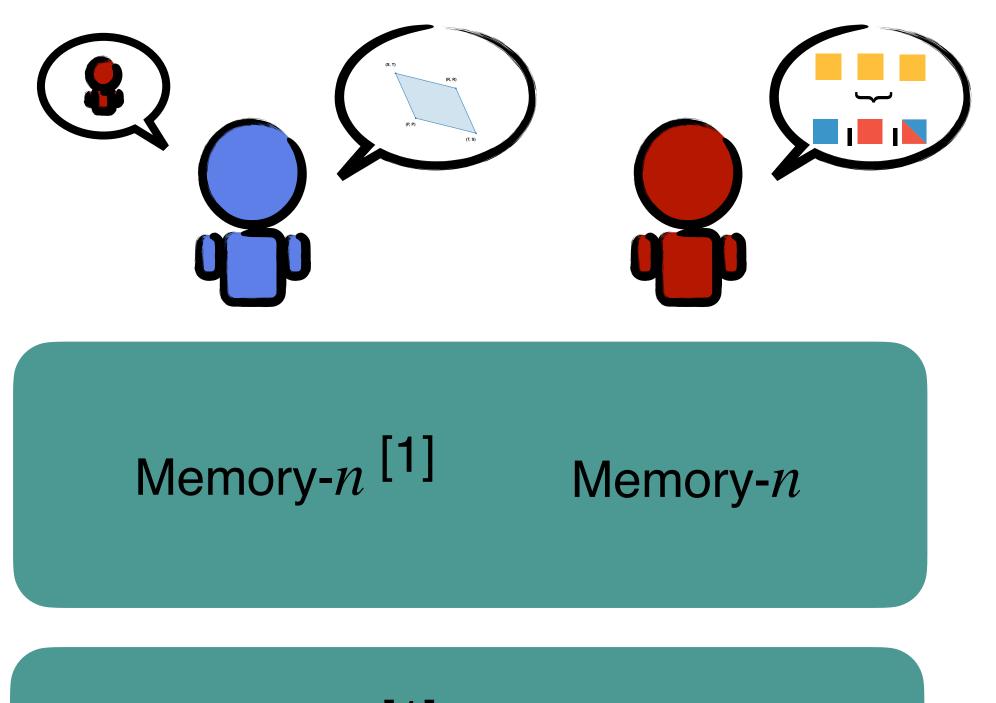
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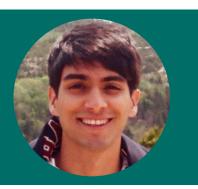


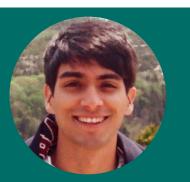
Memory-n [1] Reactive-n

Self reactive-n [12] Reactive-n

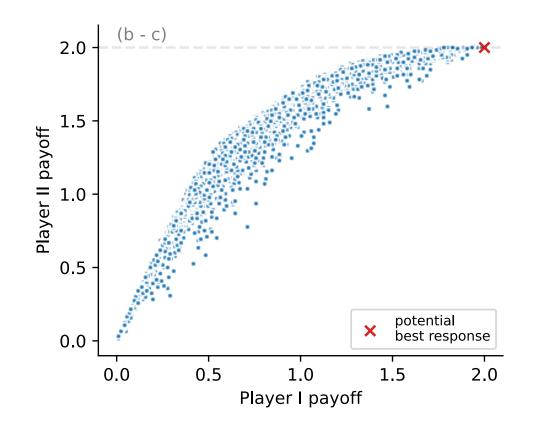
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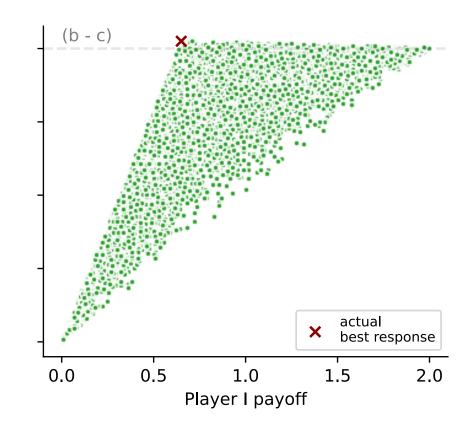


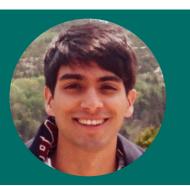


Player II play as reactive-2

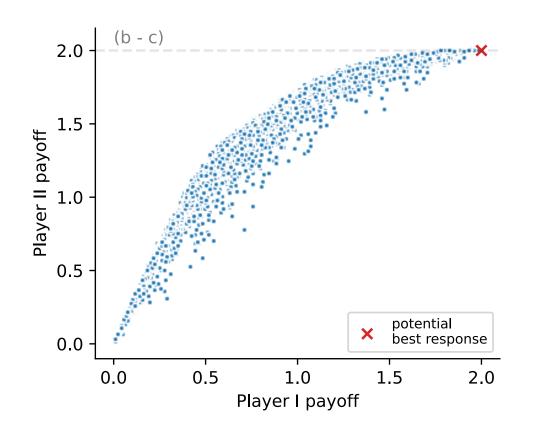


Player II play as self-reactive-2

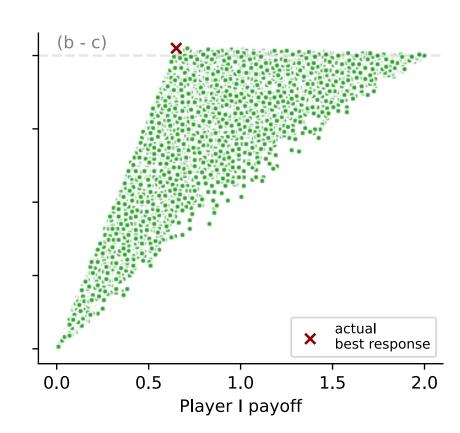


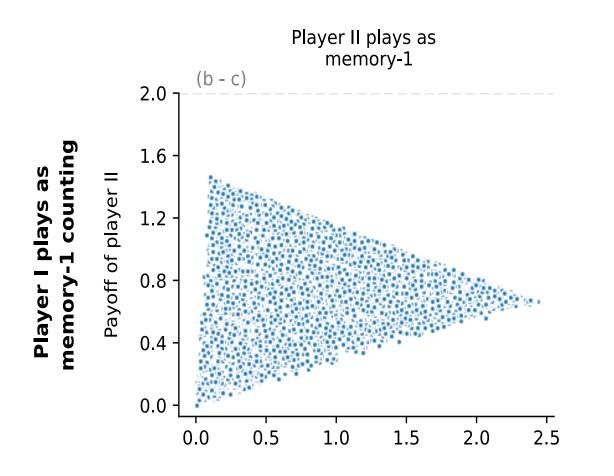


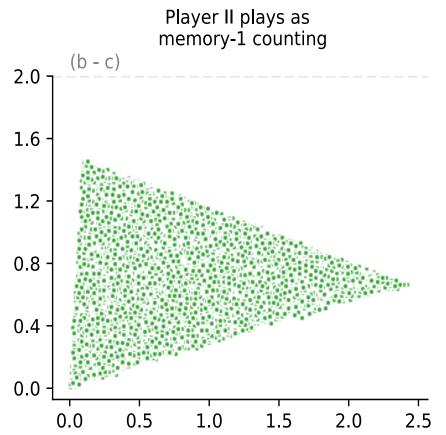
Player II play as reactive-2

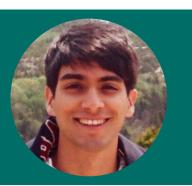


Player II play as self-reactive-2









1.0

Player I payoff

2.0

1.5

0.0

0.5

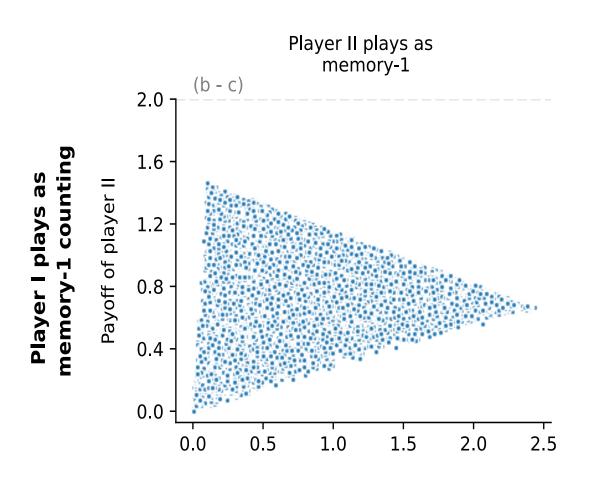
Player II play as self-reactive-2

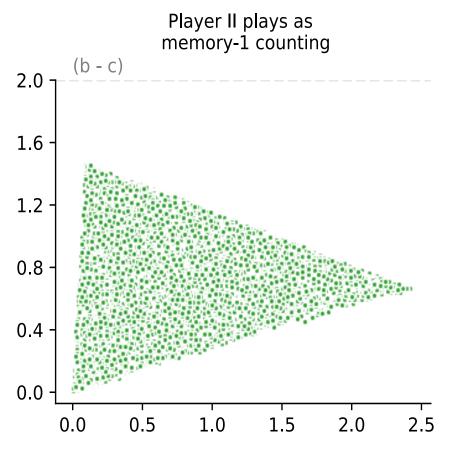
(b - c)

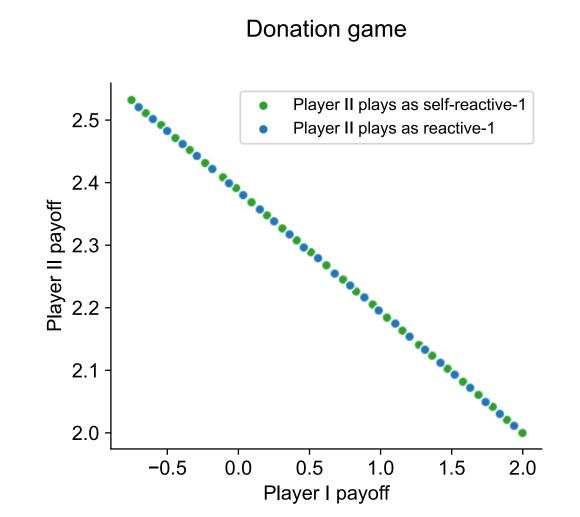
\*

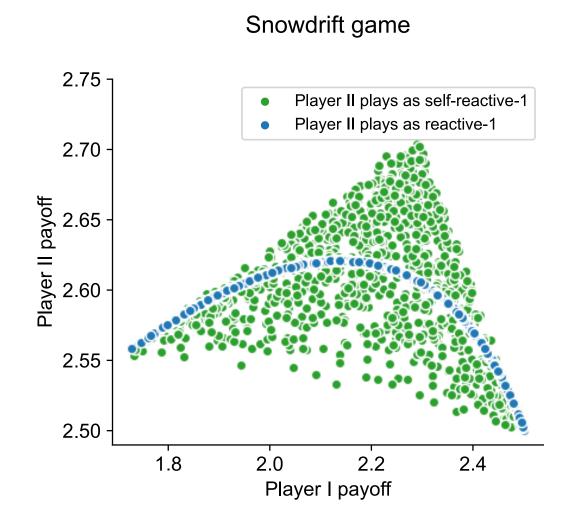
actual best response

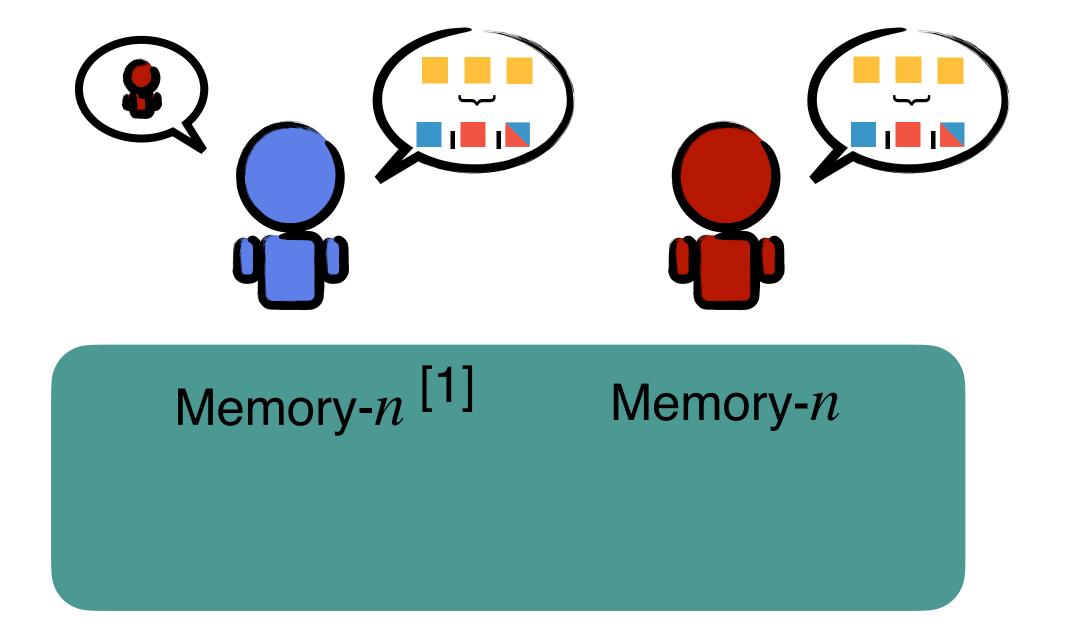
0.0 0.5 1.0 1.5 2.0 Player I payoff











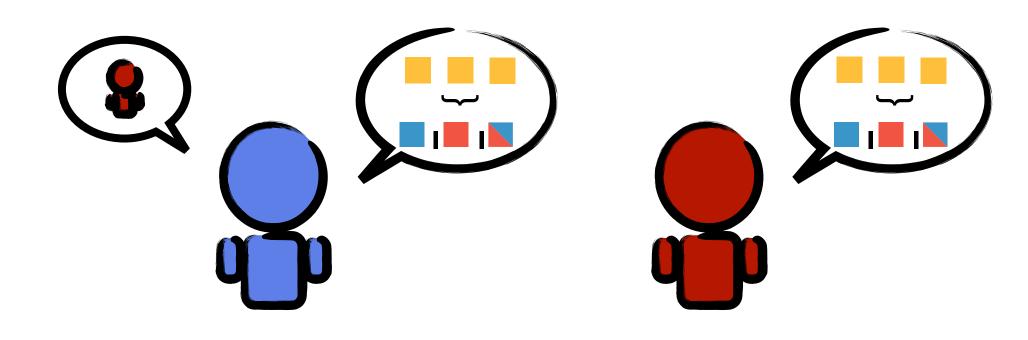
Memory-n [1] Reactive-n

Self reactive-n [11], [12] Reactive-n

[1] Press, W.H. and Dyson, F.J., 2012. Iterated Prisoner's Dilemma contains strategies that dominate any evolutionary opponent.

[11] Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you? Best responses to factored strategies.

[12] Glynatsi N.E., Akin E., Nowak M.A., Hilbe C. 2024. Conditional strategies with longer memory.



Memory-n [1]

Memory-*n* 

Pure memory-n [11] Memory-n

Memory-n [1]

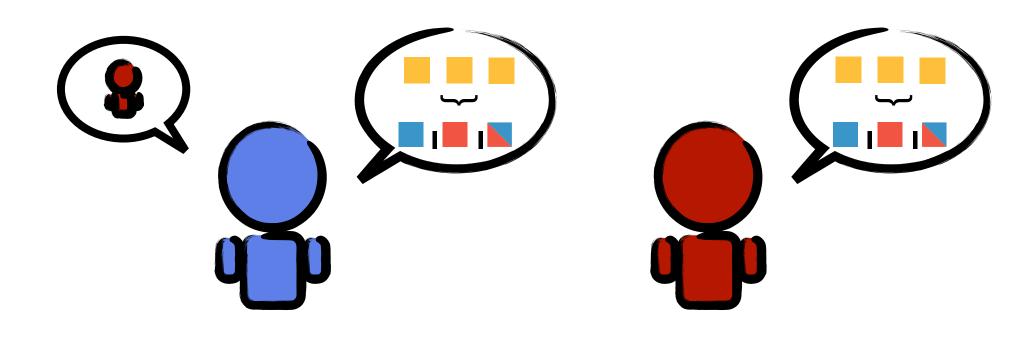
Reactive-*n* 

Self reactive-n [11], [12] Reactive-n

<sup>[1]</sup> Press, W.H. and Dyson, F.J., 2012. Iterated Prisoner's Dilemma contains strategies that dominate any evolutionary opponent.

<sup>[11]</sup> Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you? Best responses to factored strategies.

<sup>[12]</sup> Glynatsi N.E., Akin E., Nowak M.A., Hilbe C. 2024. Conditional strategies with longer memory.



Memory-n [1]

Memory-*n* 

Pure memory-*n* [11]

Memory-*n* 

Memory-n [1]

Reactive-*n* 

Self reactive-n [11], [12]

Reactive-n

Pure self reactiven [11], [12]

Reactive-*n* 

<sup>[1]</sup> Press, W.H. and Dyson, F.J., 2012. Iterated Prisoner's Dilemma contains strategies that dominate any evolutionary opponent.

<sup>[11]</sup> Levínský R., Neyman A., Zelený M., 2020. Should I remember more than you? Best responses to factored strategies.

<sup>[12]</sup> Glynatsi N.E., Akin E., Nowak M.A., Hilbe C. 2024. Conditional strategies with longer memory.





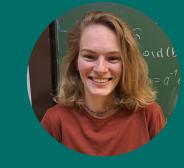














- - b > c > 0
- 2. The opponent follows a reactive-*n* strategy.

<u> </u>	1	2	3	4	5	
pure memory-n						
pure self-reactive- $n$						
pure self-reactive- $(n-1)$						

$\underline{\hspace{1cm}}$	1	2	3	4	5	
pure memory-n	16					
pure self-reactive- $n$	4					
pure self-reactive- $(n-1)$	2					

$\underline{\hspace{1cm}}$	1	2	3	4	5	
pure memory-n	16	65,536				
pure self-reactive- $n$	4	16				
pure self-reactive- $(n-1)$	2	4				

n	1	2	3	4	5	
pure memory-n	16	65,536	1,844,6	74,407,370	,955,161	
pure self-reactive- $n$	4	16	256			
pure self-reactive- $(n-1)$	2	4	16			

n	1	2	3	4	5	
pure memory- <i>n</i>	16	65,536	1,844,6	74,4 💢 170	,955,161	
pure self-reactive-n	4	16	256	65,536		
pure self-reactive- $(n-1)$	2	4	16	256		

	1	2	3	4	5
pure memory-n	16	65,536	1,844,6	74,4 💢 370	,95: 💢 1
pure self-reactive-n	4	16	256	65,536	4,294,967,296
pure self-reactive- $(n-1)$	2	4	16	256	65,536

### 1. Introduction and motivation

2. Conditional cooperation with longer memory

Published PNAS: https://doi.org/10.1073/pnas.2420125121







Complete strategy spaces of direct reciprocity

Under review *PNAS* 







Can I afford to remember less than you?

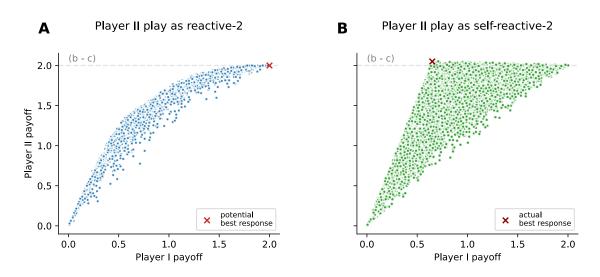
Under review Economics Letters





1.

# Complete strategy spaces in memory-*n* strategies.

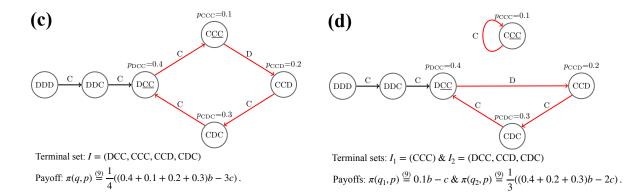








There exists a best response in pure self-reactive n-1 for additive games for any actions for non symmetric games

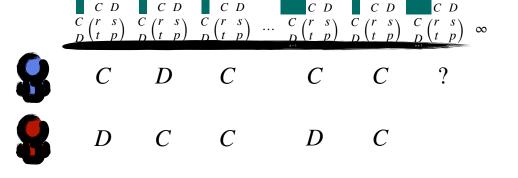








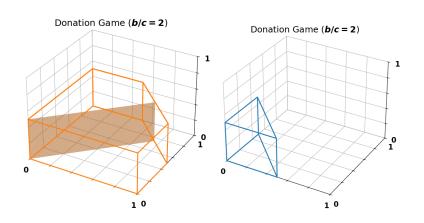
#### Best Responses



### Nash Equilibria

n	1	2	3	4	5
pure memory-n	16	65,536	1,844,6	74,4 🗶 70,	,95ŧ 🗙
pure self-reactive-n	4	16	256	65,536	4,294,967,296
pure self-reactive- $(n-1)$	2	4	16	256	65,536

#### **Evolution of** Cooperation



Conditional cooperation with longer memory: https://doi.org/10.1073/pnas.242012512

@nikoletaglyn.bsky.social

Github: Nikoleta-v3

https://nikoleta-v3.github.io/













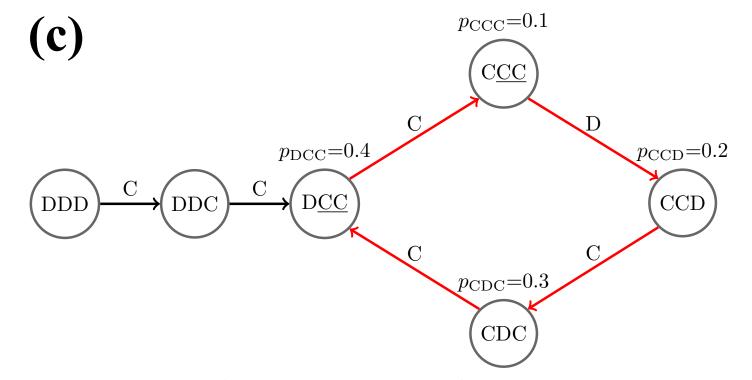
social

### Thank you!



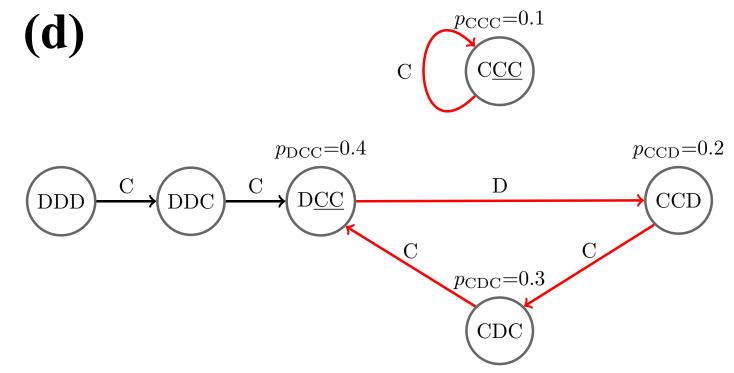






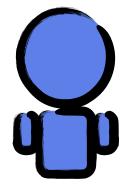
Terminal set: I = (DCC, CCC, CCD, CDC)

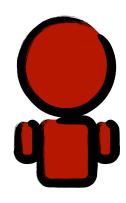
Payoff: 
$$\pi(q, p) \stackrel{(9)}{=} \frac{1}{4} ((0.4 + 0.1 + 0.2 + 0.3)b - 3c)$$
.

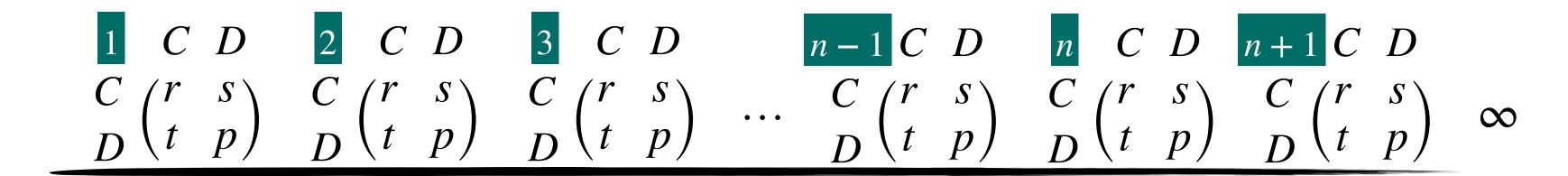


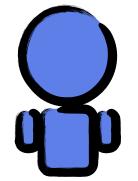
Terminal sets:  $I_1 = (CCC) \& I_2 = (DCC, CCD, CDC)$ 

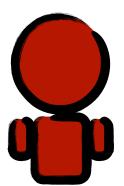
Payoffs: 
$$\pi(q_1, p) \stackrel{(9)}{=} 0.1b - c \& \pi(q_2, p) \stackrel{(9)}{=} \frac{1}{3} ((0.4 + 0.2 + 0.3)b - 2c)$$
.



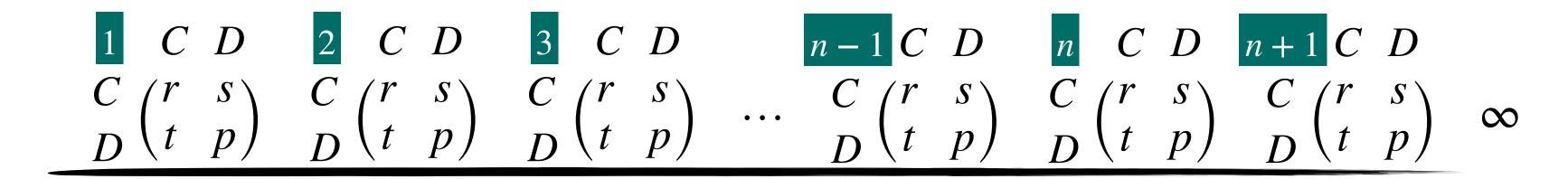


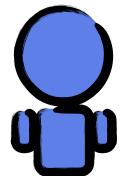






 $D \quad C \quad C$ 





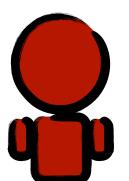
C

D

C

C

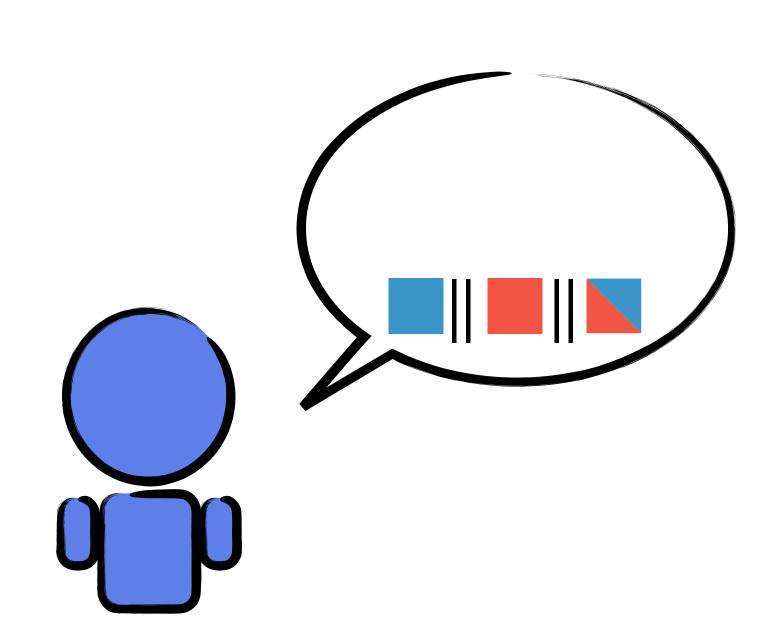
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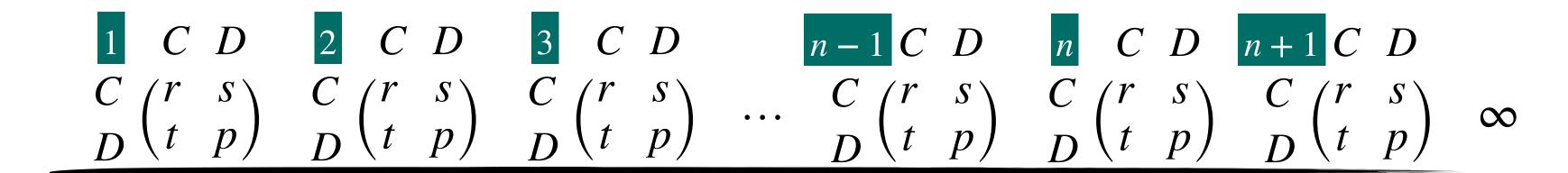


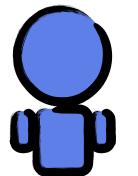
D

C

D







C

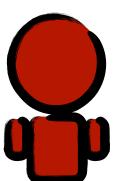
D

C

<u>C</u>

C

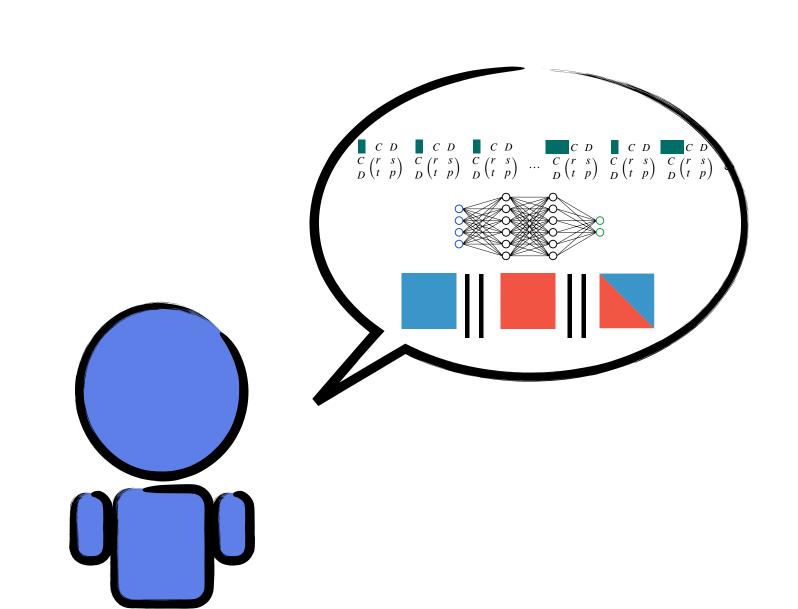
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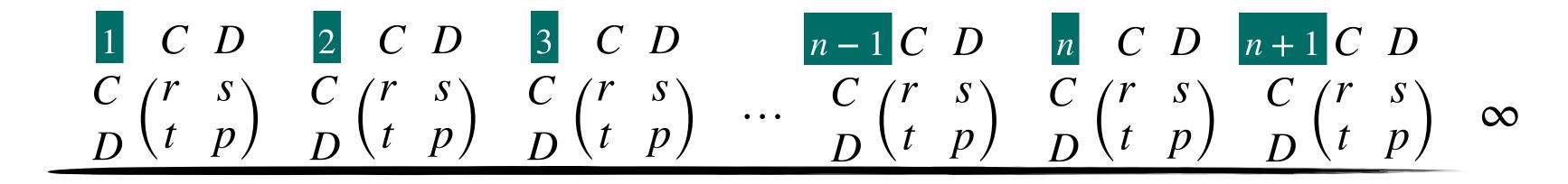


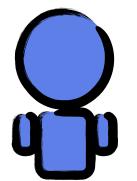
D

C

D







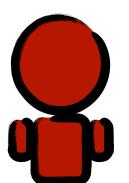
C

D

C

C

?



D

C

C

D

