



# Reachability of Fair Allocations via Sequential Exchanges

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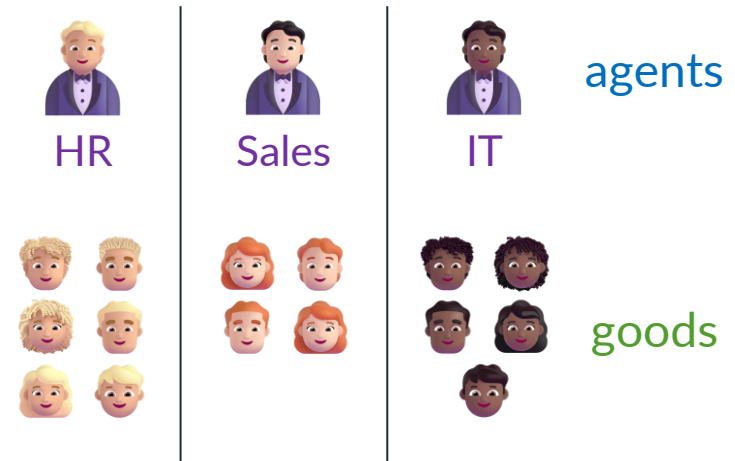
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# Fair Division of Indivisible Goods

- **Fair Division of Indivisible Goods**
  - The study of allocating **goods** fairly among competing **agents**.
- **Example.** A company wishes to allocate its **employees** to different **departments** in a fair manner.

- **agent** → **head of department**
- **good** → **employee**

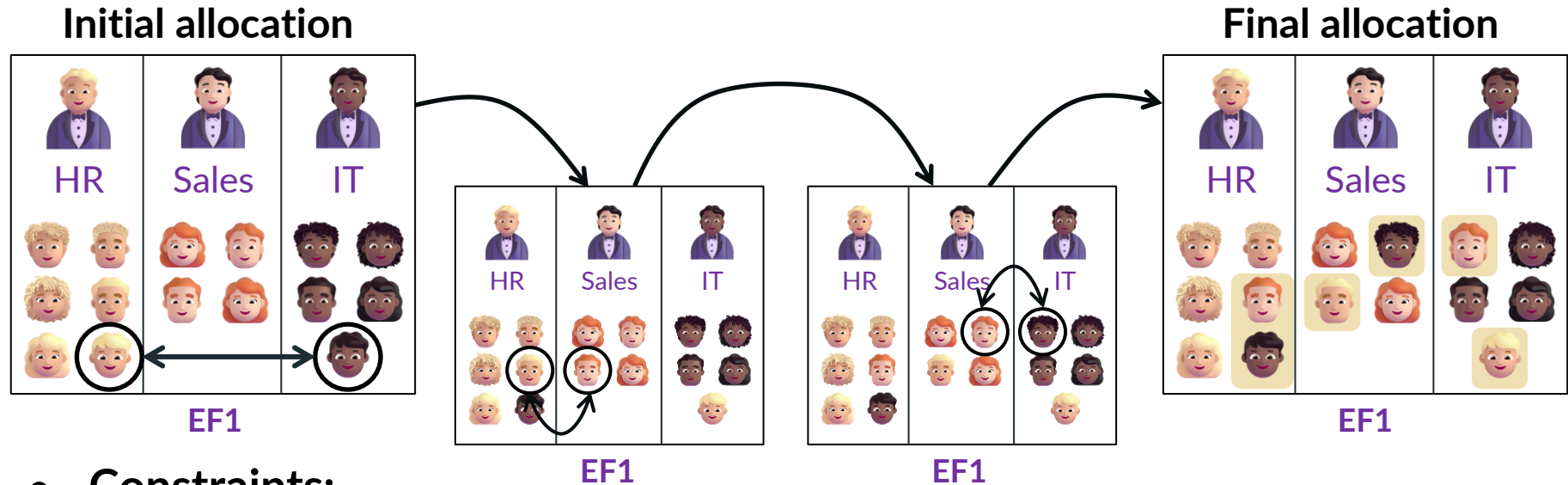
- **Fairness notion**
  - Envy-freeness up to one good (**EF1**)
- An EF1 allocation always exists<sup>†</sup>



<sup>†</sup> On Approximately Fair Allocations of Indivisible Goods (Lipton, Markakis, Mossel, and Saberi, 2004)

# Reachability of Fair Allocations

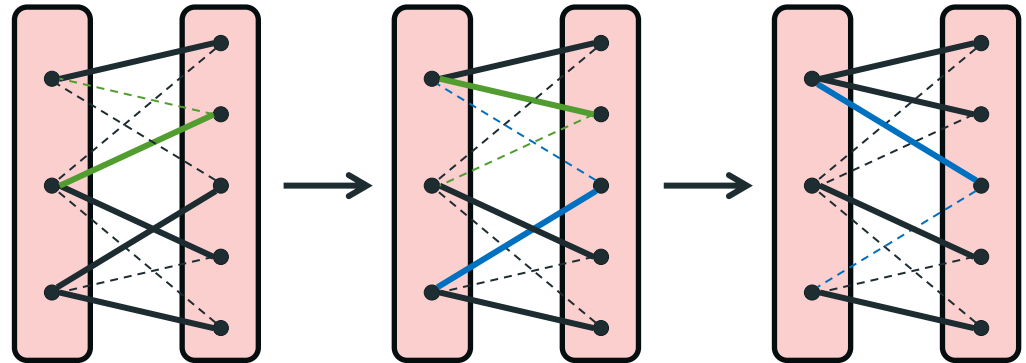
- We take a “dynamic” perspective.



- **Constraints:**
  - Every month, **two employees** from different departments will be selected to **exchange positions**.
  - **EF1** must be maintained throughout the whole process.
- **Question:** Is it always possible to reach the desired final allocation?

# Reconfiguration

- Reachability problems are also known as **reconfiguration** problems
- Examples:
  - Minimum spanning tree<sup>1</sup>
  - Graph coloring<sup>2</sup>
  - Perfect matching<sup>3</sup>



- Reachability has also been studied in voting<sup>4 5</sup>

<sup>1</sup> On the Complexity of Reconfiguration Problems (Ito, Demaine, Harvey, Papadimitriou, Sideri, Uehara, and Uno, 2011)

<sup>2</sup> Finding Shortest Paths between Graph Colorings (Johnson, Kratsch, Kratsch, Patel, and Paulusma, 2016)

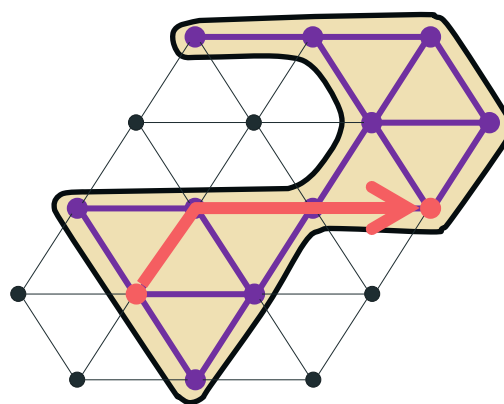
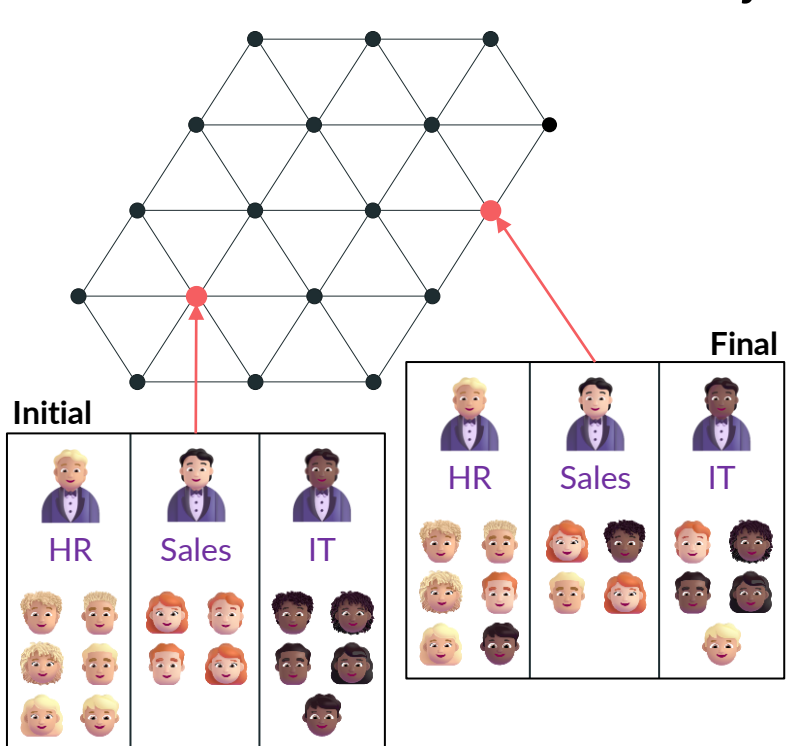
<sup>3</sup> The Perfect Matching Reconfiguration Problem (Bonamy, Bousquet, Heinrich, Ito, Kobayashi, Mary, Mühlenthaler, and Wasa, 2019)

<sup>4</sup> On Swap-Distance Geometry of Voting Rules (Obraztsova, Elkind, Faliszewski, and Slinko, 2013)

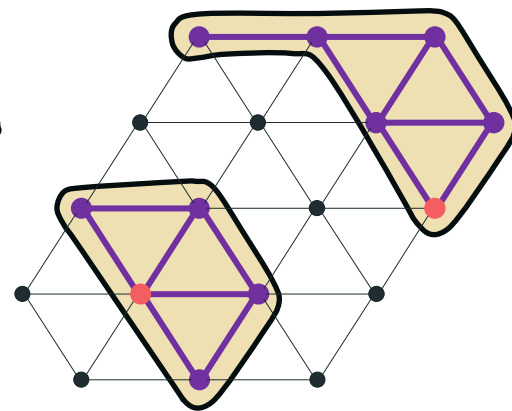
<sup>5</sup> On Swap Convexity of Voting Rules (Obraztsova, Elkind, and Faliszewski, 2020)

# Exchange Graph

- **Vertices**
  - All allocations with the same size vector.
- **Edges**
  - Two allocations are adjacent iff they can be reached via an exchange.



EF1 exchange graph  
is connected






















EF1 exchange graph  
is **not** connected

- **Question:** Is the EF1 exchange graph always connected?








# Two Agents, General Utilities

- Theorem.** ✗ There exists an instance for **two agents** such that the EF1 exchange graph is **not connected**.

								
 agent 1	3	3	0	0	2	2	2	2
 agent 2	3	3	0	0	1	1	1	1

								
 agent 1	3	3	0	0	2	2	2	2

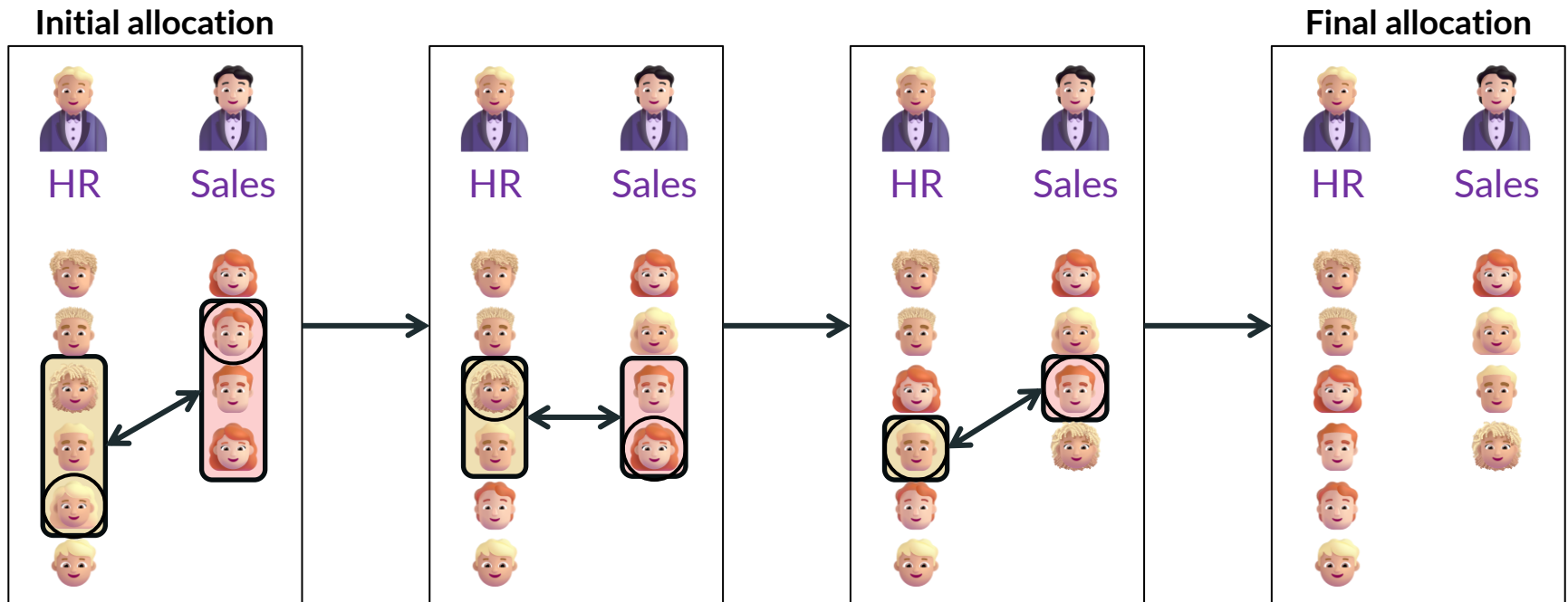
agent 1 envies agent 2 by more than one good!

								
 agent 2	3	3	0	0	1	1	1	1

agent 2 envies agent 1 by more than one good!



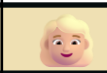







# Two Agents, Identical / Binary Utilities

- **Theorem.** ✓ The EF1 exchange graph is **connected** for any instance with **two agents** and **identical utilities**.
- **Theorem.** ✓ The EF1 exchange graph is **connected** for any instance with **two agents** and **binary utilities**.



# Three or More Agents

- **Theorem.** ✗ For every  $n \geq 3$ , there exists an instance for  $n$  agents with **identical utilities** such that the EF1 exchange graph is **not connected**.

							
 agent 1	4	3	1				
 agent 2				4	2	2	
 agent 3							4

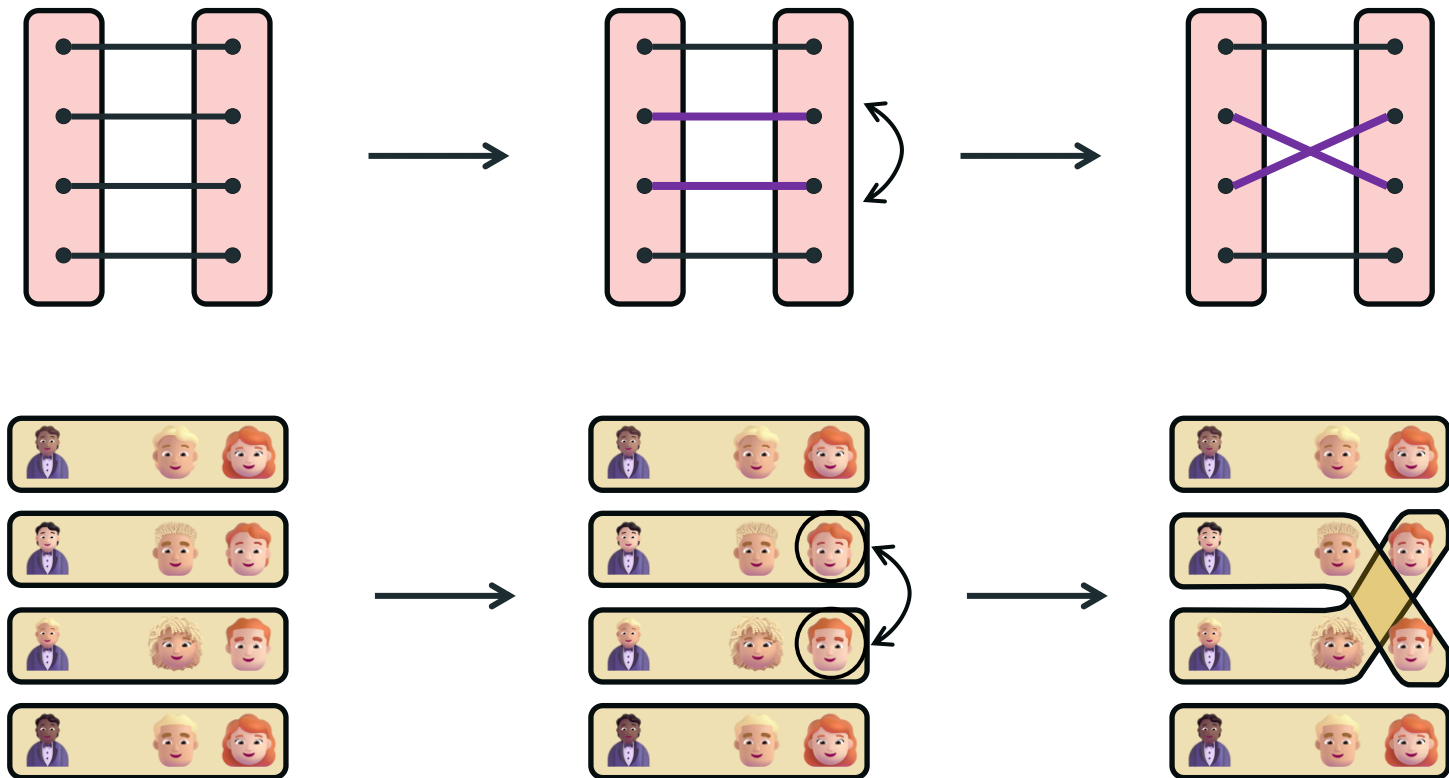
An arrow points from the cell containing '1' (agent 1, column 3) to the cell containing '2' (agent 2, column 6).

- **Theorem.** ✗ For every  $n \geq 3$ , there exists an instance for  $n$  agents with **binary utilities** such that the EF1 exchange graph is **not connected**.
- **Theorem.** ✓ The EF1 exchange graph is **connected** for any instance with **identical binary utilities**.











# Connectivity is PSPACE-Complete

- **Theorem.** Determining the existence of an EF1 exchange path between two EF1 allocations is PSPACE-complete.
- *Proof.* Use a reduction from Perfect Matching Reconfiguration.<sup>†</sup>



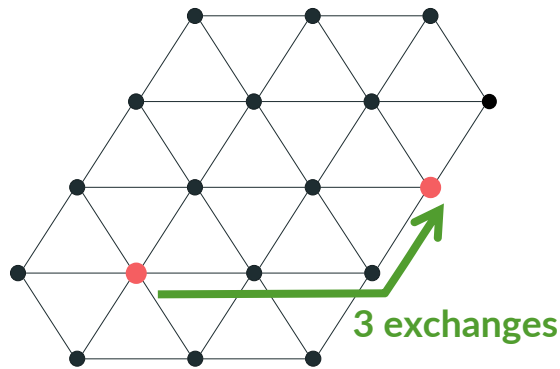
<sup>†</sup> The Perfect Matching Reconfiguration Problem (Bonamy, Bousquet, Heinrich, Ito, Kobayashi, Mary, Mühlenthaler, and Wasa, 2019)

# Summary for Connectivity

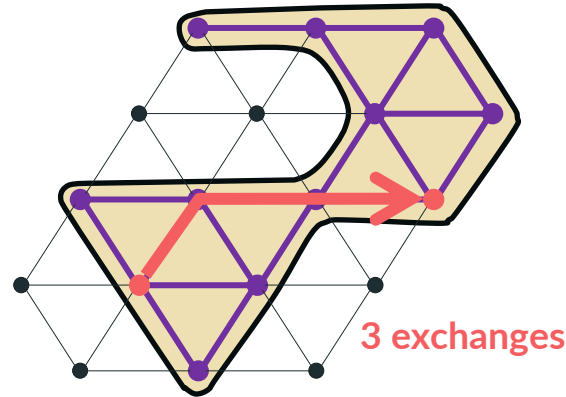
utilities	general	identical	binary	identical binary
two agents				
$\geq$ three agents	 PSPACE-complete			

# Optimality of EF1 Exchange Path

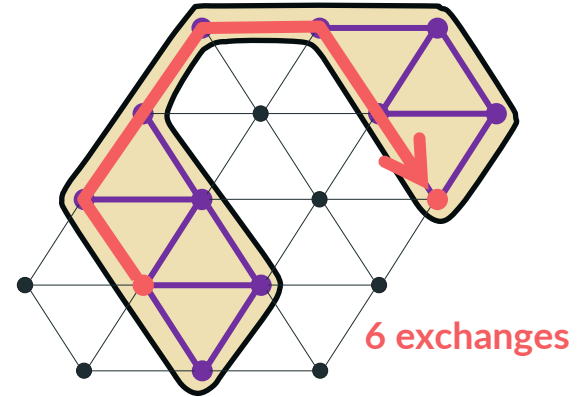
- We only consider instances where the EF1 exchange graph is connected.



Exchange graph



Optimal EF1 exchange path exists



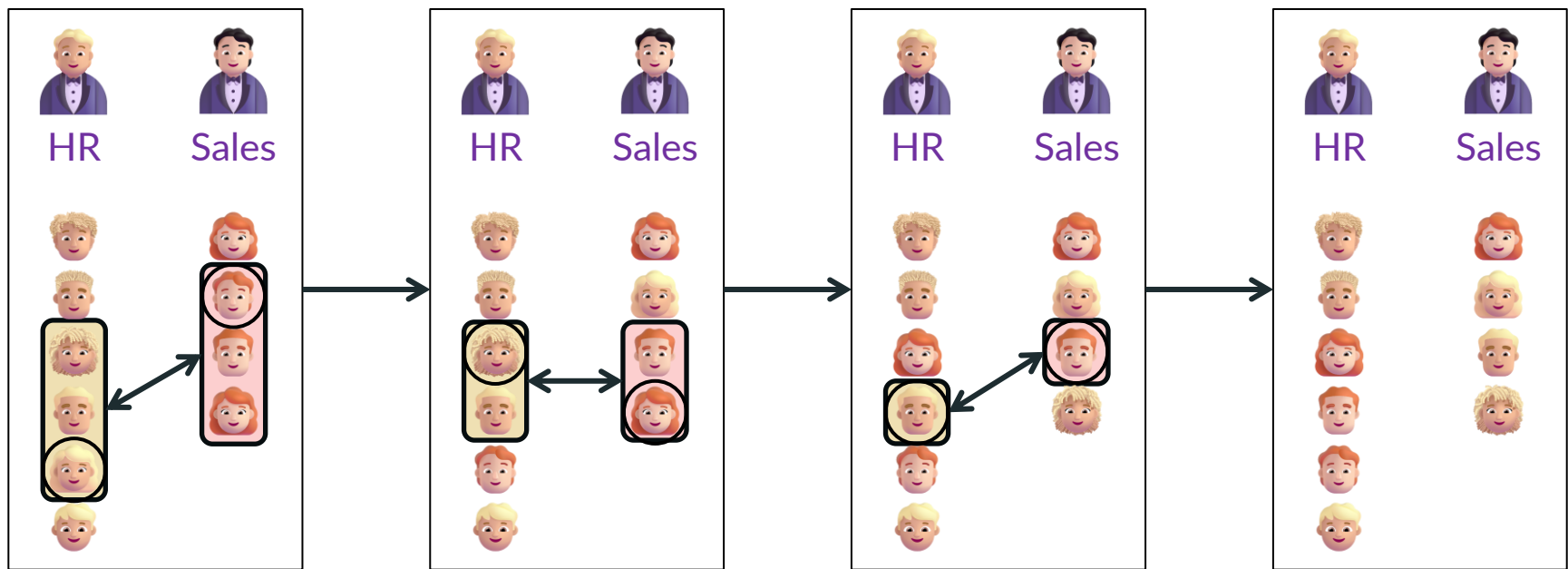
Optimal EF1 exchange path does **not** exist

- Question:** Is there always an optimal EF1 exchange path?
- Theorem.** **X** There exists an instance for **two agents** such that the EF1 exchange graph is connected, but for some pair of EF1 allocations, **no optimal EF1 exchange path exists** between them.

utilities		general	identical	binary	identical binary
two agents	connected?	X	✓	✓	✓
	optimal?	X			
≥ three agents	connected?	X	X	X	✓
	optimal?				

# Two Agents, Identical / Binary Utilities

- Theorem.** ✓ An optimal EF1 exchange path exists between any two allocations in any instance with **two agents** and **identical or binary utilities**.



utilities		general	identical	binary	identical binary
two agents	connected?	✗	✓	✓	✓
	optimal?	✗	✓	✓	✓
≥ three agents	connected?	✗	✗	✗	✓
	optimal?				

# Three or More Agents

- **Theorem.** ✗ For every  $n \geq 3$ , there exists an instance for  $n$  agents with **identical binary utilities** such that the EF1 exchange graph is connected, but for some pair of EF1 allocations, **no optimal EF1 exchange path exists** between them.
- **Theorem.** Determining the **existence of an optimal EF1 exchange path** between two EF1 allocations is **NP-hard**, even for four agents with identical utilities.
- **Theorem.** Finding the **optimal number of exchanges** from the initial allocation to the final allocation on the exchange graph is **NP-hard** (disregarding the EF1 property).

utilities		general	identical	binary	identical binary
two agents	connected?	<span style="color: red;">✗</span>	<span style="color: green;">✓</span>	<span style="color: green;">✓</span>	<span style="color: green;">✓</span>
	optimal?	<span style="color: red;">✗</span>	<span style="color: green;">✓</span>	<span style="color: green;">✓</span>	<span style="color: green;">✓</span>
$\geq$ three agents	connected?	<span style="color: red;">✗</span>	<span style="color: red;">✗</span>	<span style="color: red;">✗</span>	<span style="color: green;">✓</span>
	optimal?	<span style="color: red;">✗</span>	<span style="color: red;">✗</span>	<span style="color: red;">✗</span>	<span style="color: red;">✗</span>

# Conclusion

- Summary

- | utilities      |            | general | identical | binary | identical binary |
|----------------|------------|---------|-----------|--------|------------------|
| two agents     | connected? | ✗       | ✓         | ✓      | ✓                |
|                | optimal?   | ✗       | ✓         | ✓      | ✓                |
| ≥ three agents | connected? | ✗       | ✗         | ✗      | ✓                |
|                | optimal?   | ✗       | ✗         | ✗      | ✗                |

- Connectivity of EF1 exchange graph is PSPACE-complete.
- Optimality of EF1 exchange path is NP-hard.
- Finding optimal number of exchanges (disregarding EF1) is NP-hard.

- Future work

- Transfers, instead of exchanges
- Other fairness notions besides EF1