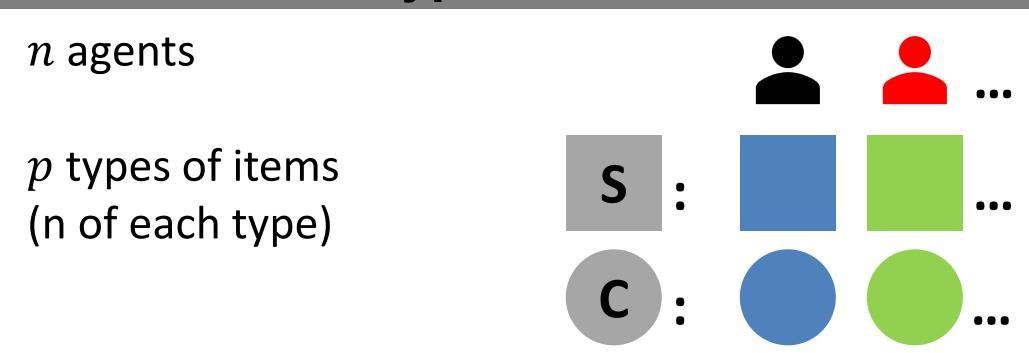
# Multi-type Resource Allocation with Partial Preferences

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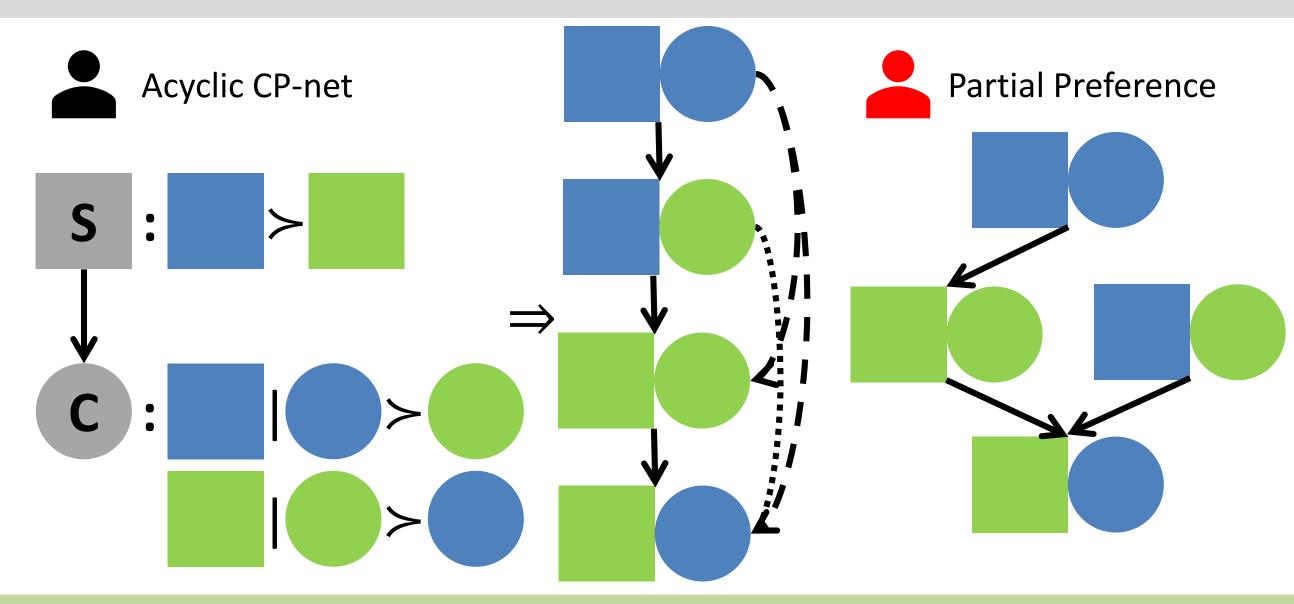
## Multi-type Resource Allocation (MTRA)



Assignments: Each agents' allocation is a collection of fractional bundles



### Partial Preferences



## Compute an assignment that is fair and economically efficient

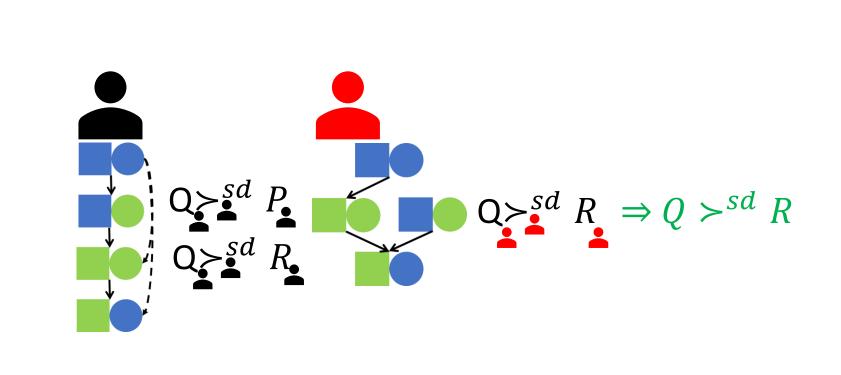
**Upper Contour Set** @ bundle x w.r.t. > is  $U(>,x) = \{y: y > x \text{ or } y = x\}$ 

Allocation p stochastically dominates q w.r.t. >, if @ every bundle x,

$$\sum_{y \in U(>,x)} p_y \ge \sum_{y \in U(>,x)} q_y$$

Assignment *P* stochastically dominates Q if  $p_i >_i^{sd} q_i$ , for every agent j

| P |     |     |      |      |  |
|---|-----|-----|------|------|--|
|   | 0.5 | 0   | 0.25 | 0.25 |  |
|   | 0   | 0.5 | 0.25 | 0.25 |  |
| Q |     |     |      |      |  |
|   | 0.5 | 0   | 0    | 0.5  |  |
|   | 0.5 | 0   | 0    | 0.5  |  |
| R |     |     |      |      |  |
|   | 0   | 0.5 | 0.5  | 0    |  |
|   | 0.5 | 0   | 0    | 0.5  |  |



### Fairness, Efficiency, Strategyproofness, and Indivisibility

- A fractional assignment P satisfies:
- decomposability: if it is a probability distribution over *discrete* assignments
- equal treatment of equals: agents with identical preferences receive identical allocations
- sd-envy-freeness: if for every pair of agents  $j, j', P_j >_j^{sd} P_j$ ,
- sd-efficiency: no assignment Q s.t. for every agent j,  $Q_i >_i^{sd} P_i$
- —ordinal fairness: if for every pair of agents j, j', and every bundle x, s.t.  $P_{j,x} > 0$ , we have  $\sum_{\hat{x} \in U(\succ_j,x)} P_{j,\hat{x}} \leq \sum_{\hat{x} \in U(\succ_{j'},x)} P_{j',\hat{x}}$
- weak-sd-envy-freeness: if for every pair of agents  $j, j', P_j, >_j^{sd} P_j \Rightarrow P_j = P_j$ ,
- ex-post-efficiency: a probability distribution over sd-efficient *discrete* assignments

#### A mechanism f satisfies:

- —sd-strategyproofness: if  $f(\gt) \gt_j^{sd} f(\gt')$ , for every agent j, every misreport
- sd-weak-strategyproofness: if  $f(\succ') \succ_j^{sd} f(\succ) \Rightarrow f(\succ')(j) = f(\succ)(j)$ In general, mechanism f satisfies property X if  $f(\succ)$  satisfies X for every profile  $\succ$

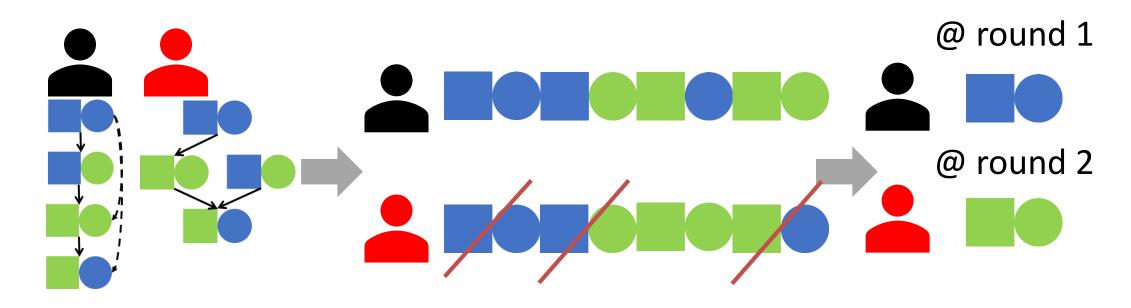
Assignments are NOT guaranteed to be decomposable when there are multiple types of items

NO mechanism is sd-efficient AND sd-envy-free under general partial preferences

# Multi-type Random Priority (MRP)

Extends the Random Priority (RP) mechanism [Abdulkadiroglu and Sonmez, 1998]

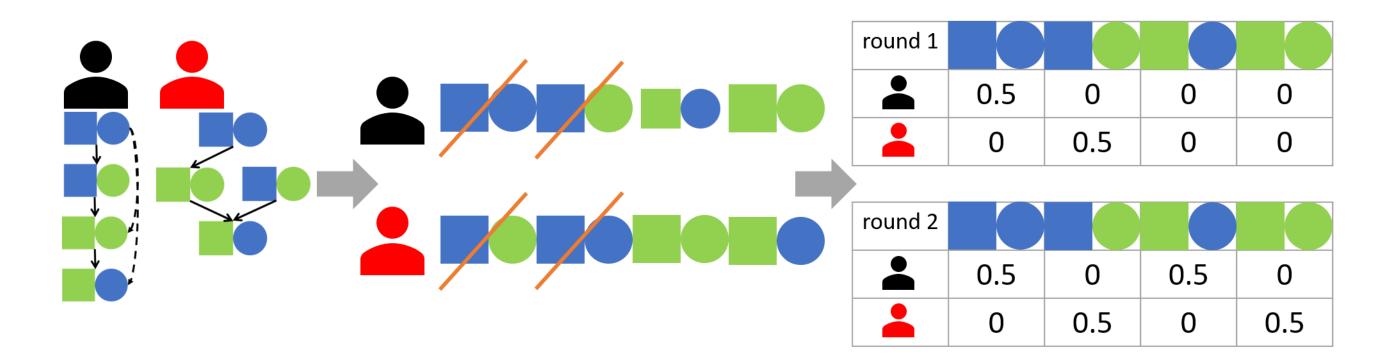
- -Topologically sort partial order  $\succ_i$  to linear order  $\succ_i'$
- -Pick priority ordering  $\sigma$  over agents uniformly at random
- -Agents arrive according to  $\sigma$ , and are allocated their favorite remaining bundle
- -Remove agent and all items in bundle



## Multi-type Probabilistic Serial (MPS)

Extends Probabilistic Serial (PS) mechanism [Bogomolnaia and Moulin, 2001]

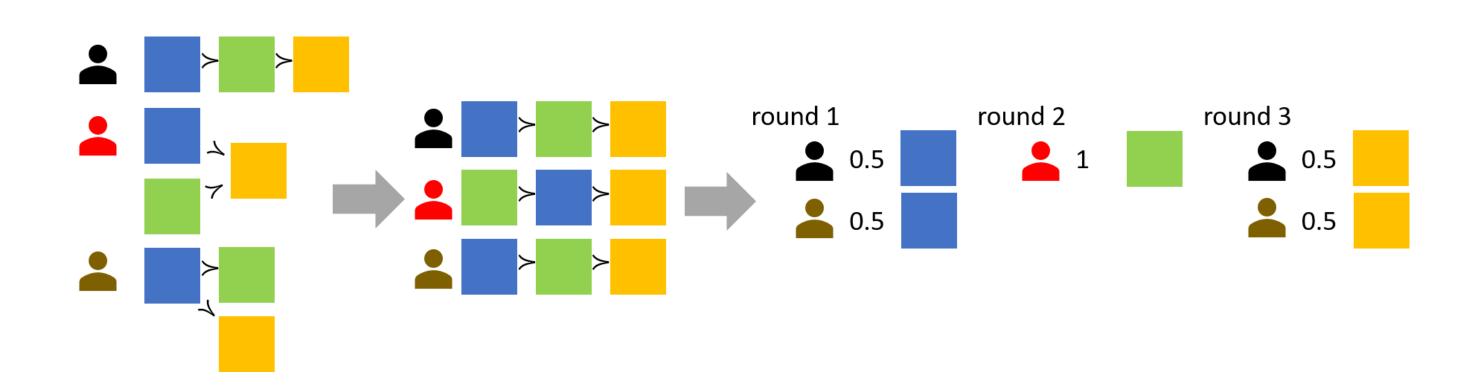
- -Topologically sort partial order  $\succ_j$  to linear order  $\succ_j'$  -While there is a remaining item:
  - -ALL agents simultaneously consume their favorite remaining bundle (per  $\succ_j'$ ) at an equal, uniform rate until supply of any item being consumed is exhausted



## Multi-type General Dictatorship (MGD)

Hybrid of MRP and MPS

- -Topologically sort partial order  $\succ_i$  to linear order  $\succ_i'$
- -For j = 1, ..., n do:
- -Agent j invites all other agents j' s.t.  $\succ'_{j'} = \succ'_j$  to simultaneously consume their favorite remaining bundle until some item being consumed is exhausted



## Fairness, Efficiency, and Non-Manipulability

| Mechanism and Preference Domain |                                      | SE             | EPE | OF             | SEF            | WSEF | ETE | UI | SS             | WSS | DC |  |
|---------------------------------|--------------------------------------|----------------|-----|----------------|----------------|------|-----|----|----------------|-----|----|--|
| MRP                             | General partial preferences          | Ν <sup>†</sup> | Y   | N <sup>‡</sup> | N <sup>†</sup> | Y    | Y   | N  | N              | Y   | Y  |  |
|                                 | CP-nets                              | Ν <sup>†</sup> | Y   | N <sup>‡</sup> | N <sup>†</sup> | Y    | Y   | Y  | Y              | Y   | Y  |  |
|                                 | CP-nets with shared dependency graph | Ν <sup>†</sup> | Y   | N <sup>‡</sup> | N <sup>†</sup> | Y    | Y   | Y  | Y              | Y   | Y  |  |
| MPS                             | General partial preferences          | Y              | N   | N              | N              | Y    | Y   | N  | N <sup>†</sup> | N   | N  |  |
|                                 | CP-nets                              | Y              | N   | Y              | Y              | Y    | Y   | Y  | N <sup>†</sup> | N   | N  |  |
|                                 | CP-nets with shared dependency graph | Y              | N   | Y              | Y              | Y    | Y   | Y  | Ν <sup>†</sup> | Y   | N  |  |
| MGD                             | General partial preferences          | Y              | Y   | N <sup>‡</sup> | N              | N    | Y   | N  | N              | N   | Y  |  |
|                                 | CP-nets                              | Y              | Y   | N <sup>‡</sup> | N              | N    | Y   | N  | N              | N   | Y  |  |
|                                 | CP-nets with shared dependency graph | Y              | Y   | N <sup>‡</sup> | N              | N    | Y   | N  | N              | N   | Y  |  |

SE: *sd-efficiency* 

EPE: *ex-post-efficiency* 

(W)SEF: (weak-)sd-envy-freeness (W)SS: (weak-)sd-strategyproofness

OF: ordinal fairness UI: upper-invariance DC: decomposability ETE: equal treatment of equals

Results annotated with † are due to [Bogomolnaia and Moulin, 2001], and those annotated ‡ are due to [Hashimoto et al., 2014]

## **Future Work**

- Characterizing MRP and MPS
- Stronger properties under natural restrictions on the domain of preferences