# INVARIANT SAFETY FOR DISTRIBUTED APPLICATIONS



Sreeja Nair Gustavo Petri Marc Shapiro

#### WE WANT:

```
ScalabilityReplicatedState
```

Programmability≈ Strong Consistency

#### WE WANT:

Scalability
 Available
 Available
 State
 Strong Consistency

\* Consistency, Availability, Partition Tolerance [Gilbert&Lynch'02]

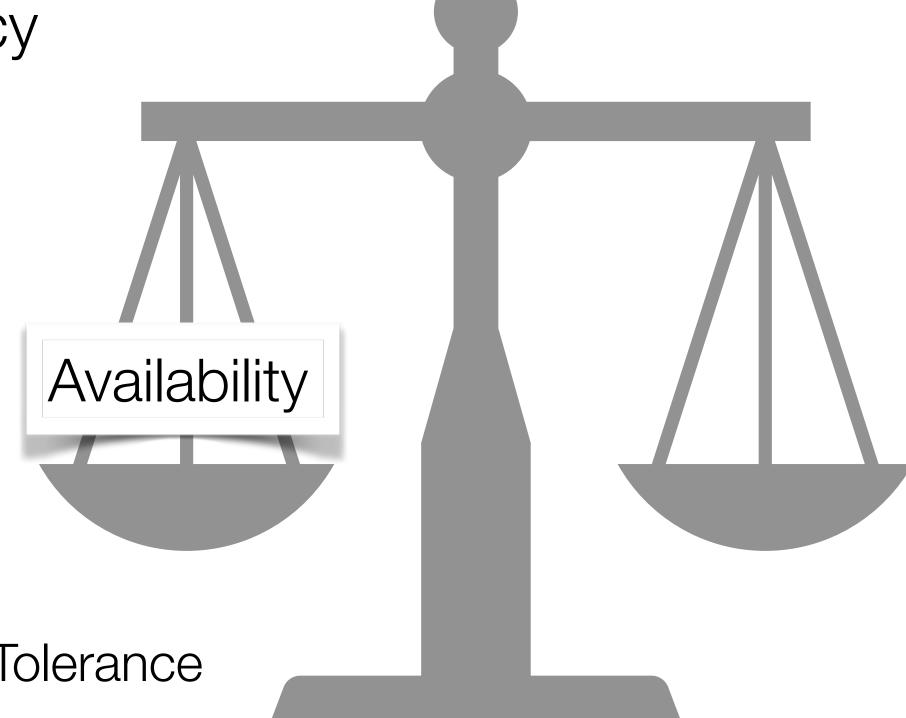
#### WE WANT:

Scalability
Avail

Replicated State

grammability ≈ Strong Consistency WE GET:

Availability



\* Consistency, Availability, Partition Tolerance [Gilbert&Lynch'02]

#### WE WANT:

Scalability

- Avail eorem

grammability ≈ Strong Consistency

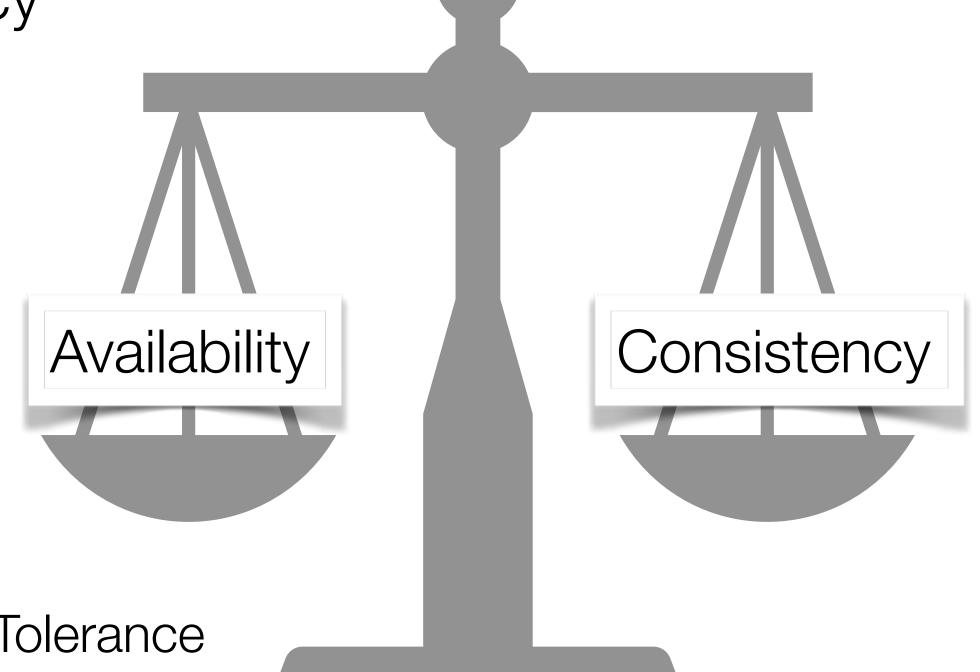
Replicated State

WE GET:

Availability

OR:

Programmability



\* Consistency, Availability, Partition Tolerance [Gilbert&Lynch'02]

## DISTRIBUTED STATE (CRDTs)



INSTITUT NATIONAL DE RECHERCHE EN INFORMATIQUE ET EN AUTOMATIQUE

# A comprehensive study of Convergent and Commutative Replicated Data Types

Marc Shapiro, INRIA & LIP6, Paris, France
Nuno Preguiça, CITI, Universidade Nova de Lisboa, Portugal
Carlos Baquero, Universidade do Minho, Postugal
Marek Zawirski, INRIA & UPMC, Paris, France

N° 7506

Janvier 2011 — Thème COM

## DISTRIBUTED STATE (CRDTs)

#### CONFLICT-FREE REPLICATED DATA TYPES

- Availability
  - Network Partition Tolerance
- (Strong) Eventual Consistency
- Distributed Data Type Abstractions
  - ▶ Deterministic Conflict Resolution
     ⇒ Eventual Convergence



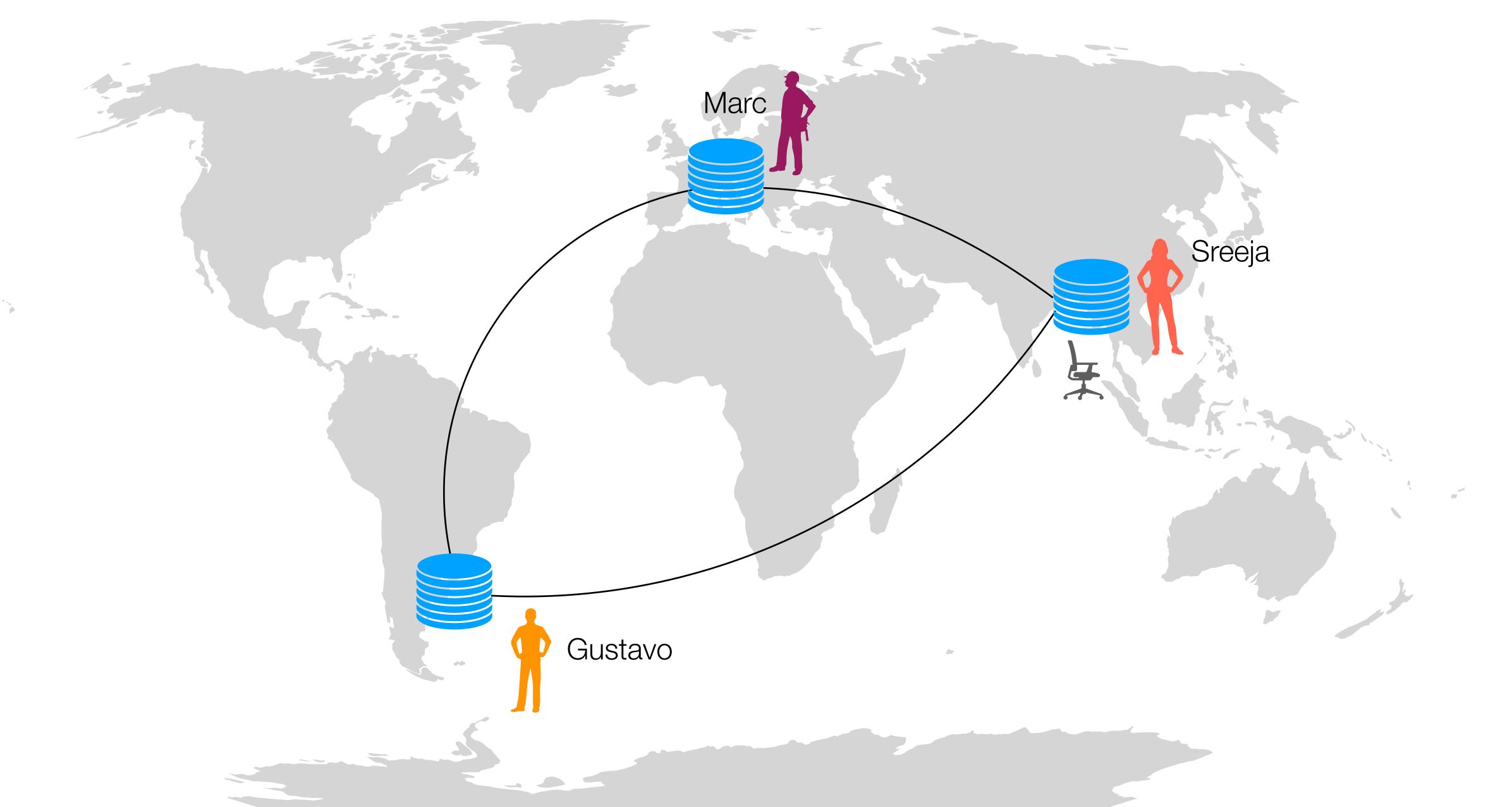
INSTITUT NATIONAL DE RECHERCHE EN INFORMATIQUE ET EN AUTOMATIQUE

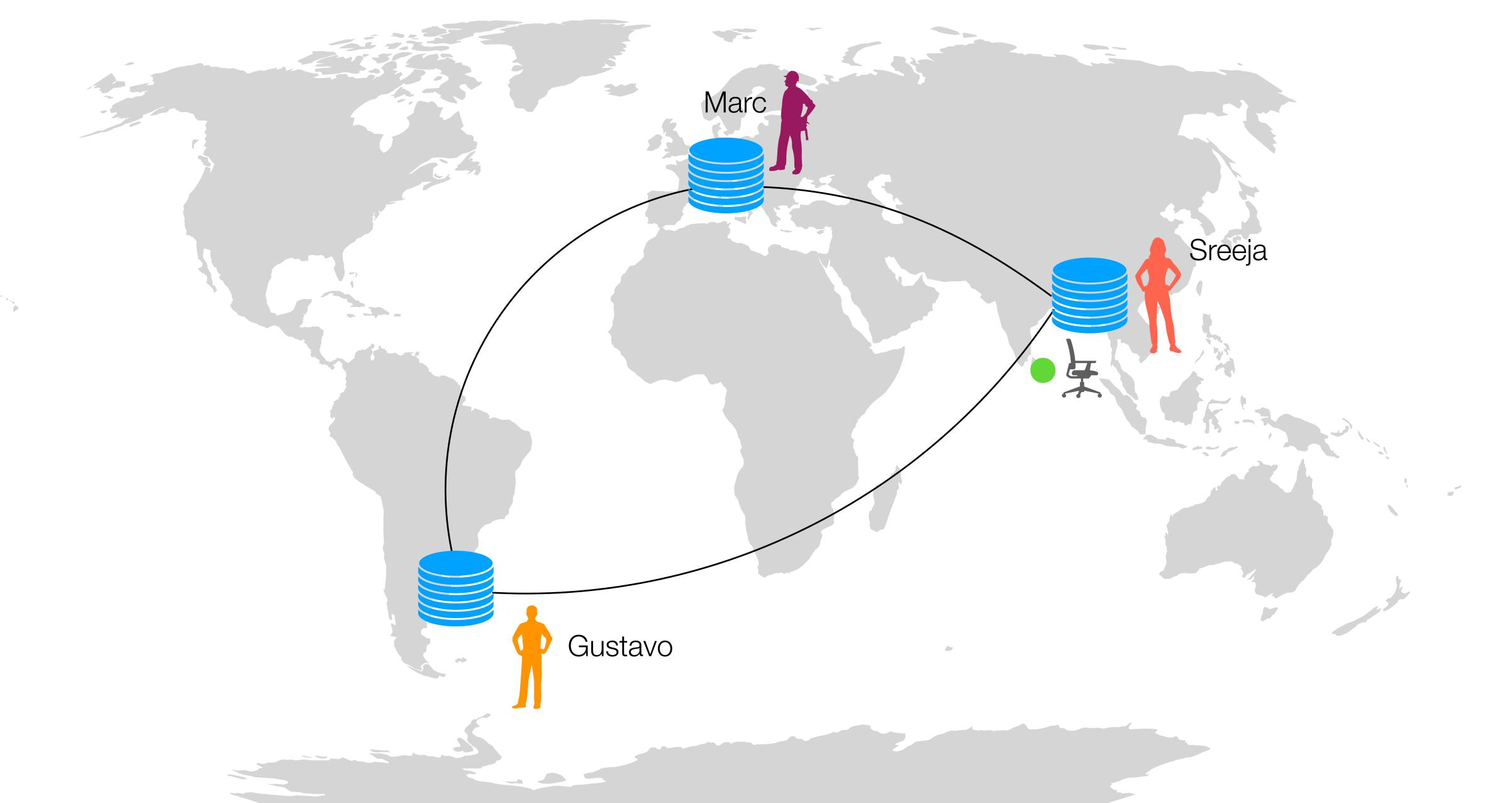
## A comprehensive study of Convergent and Commutative Replicated Data Types

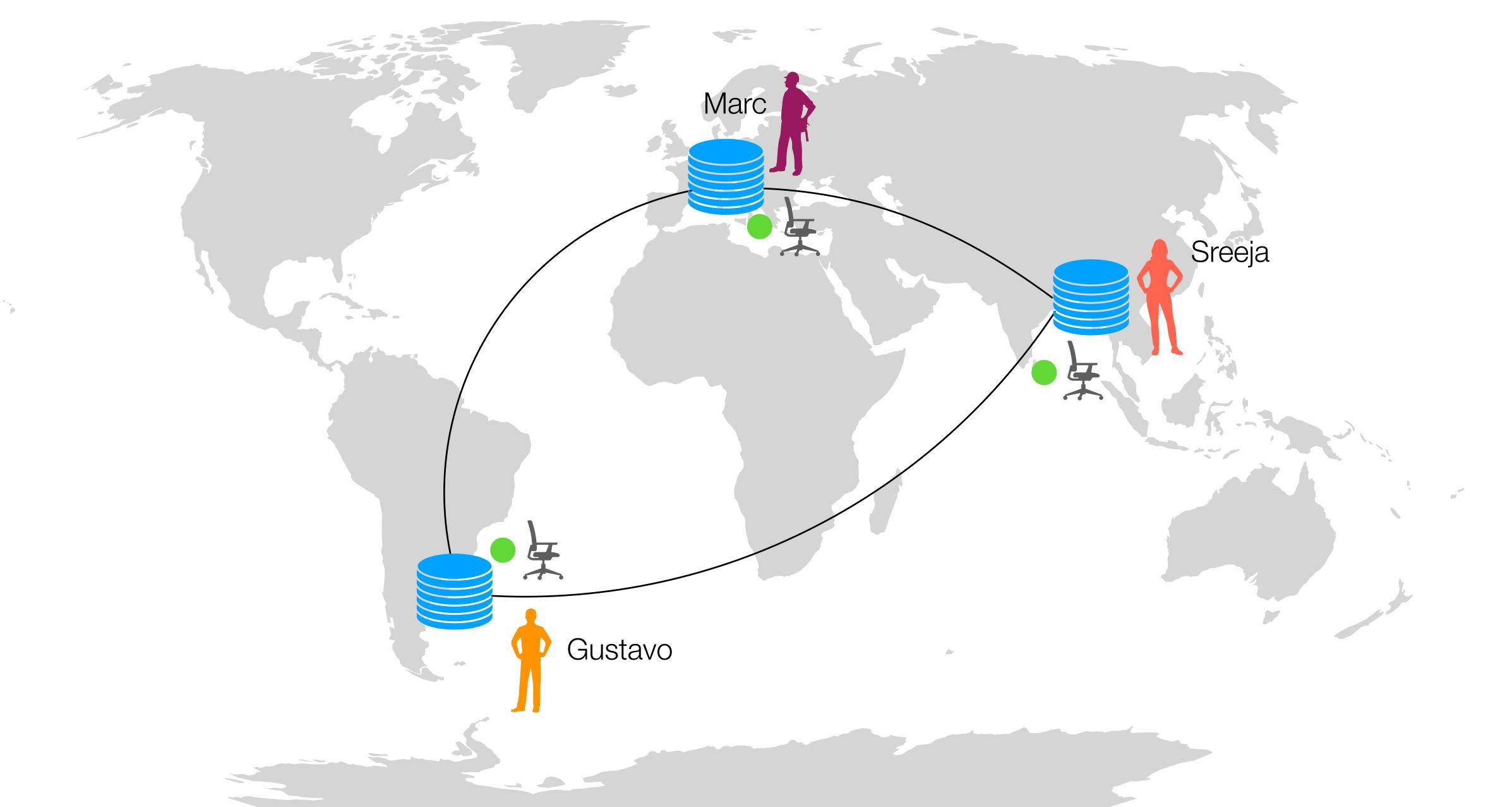
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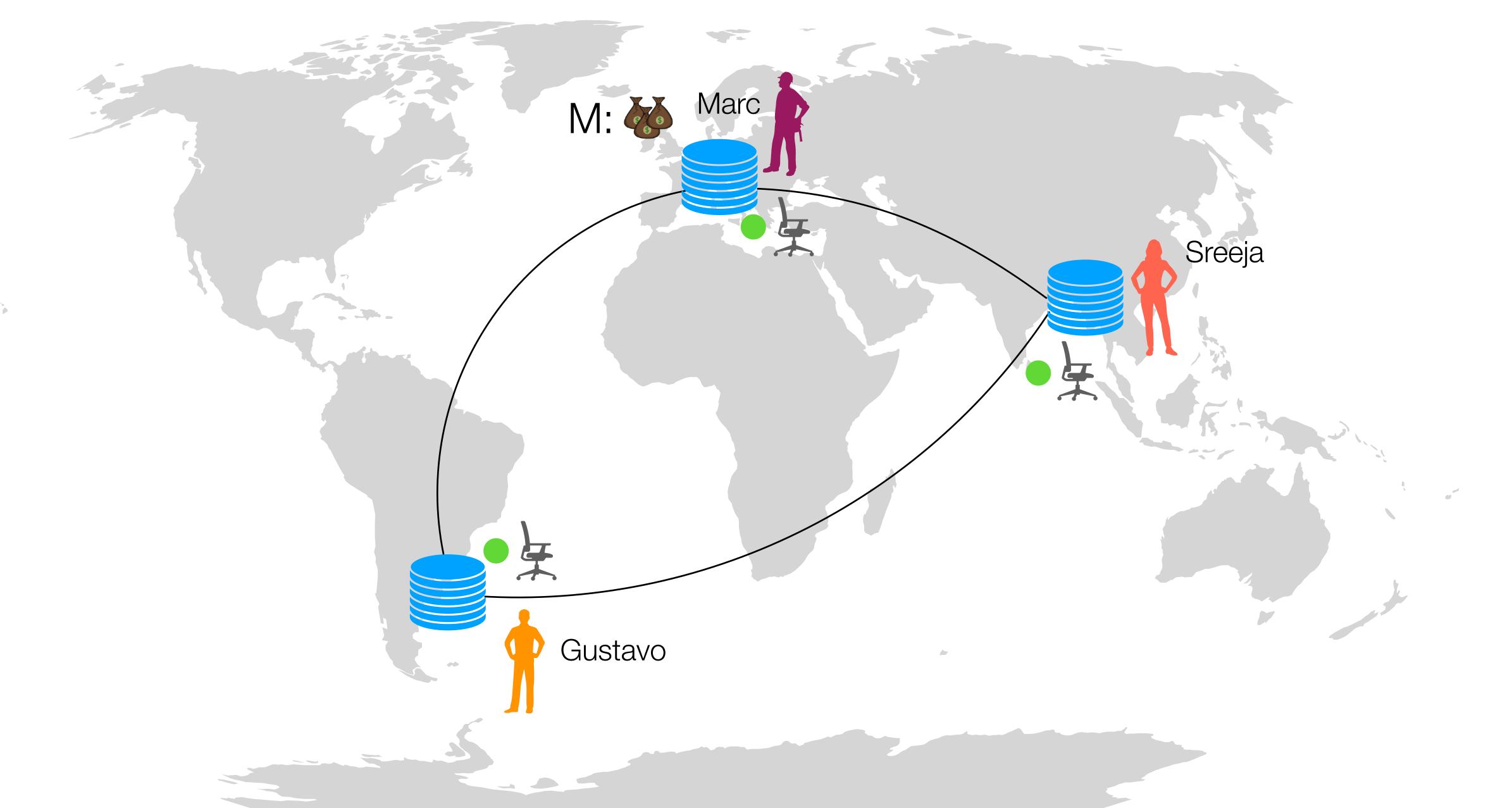
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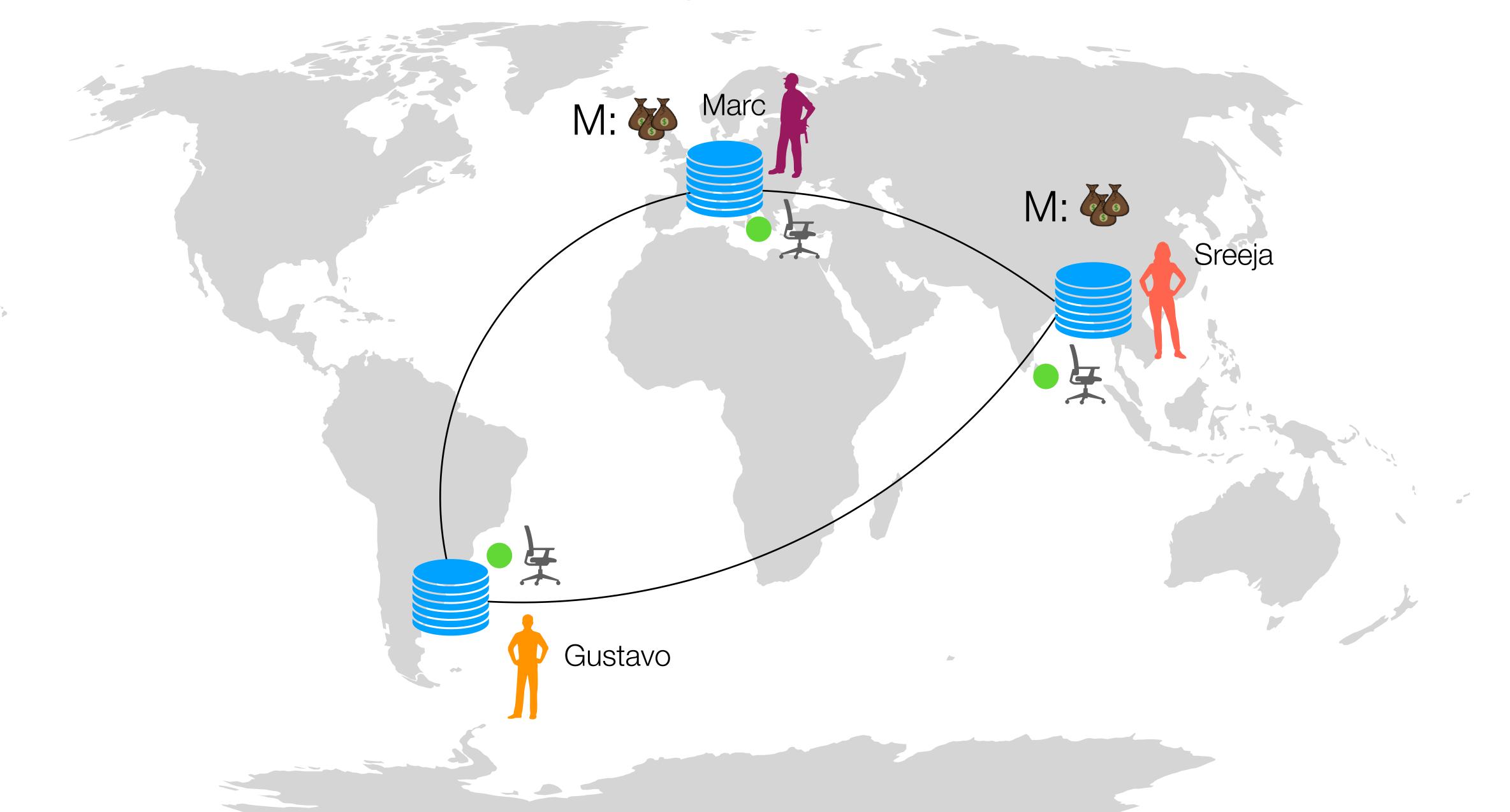
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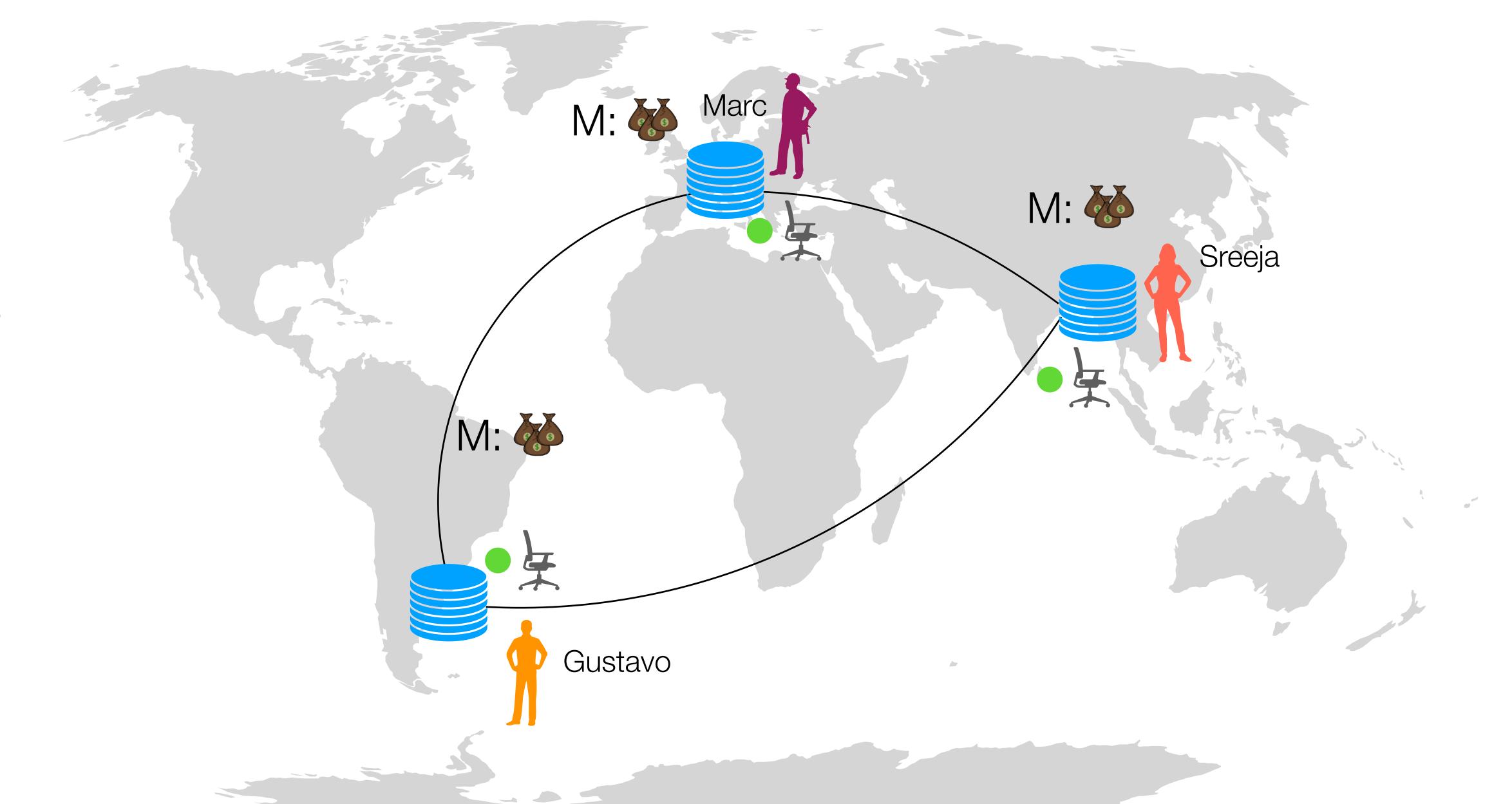


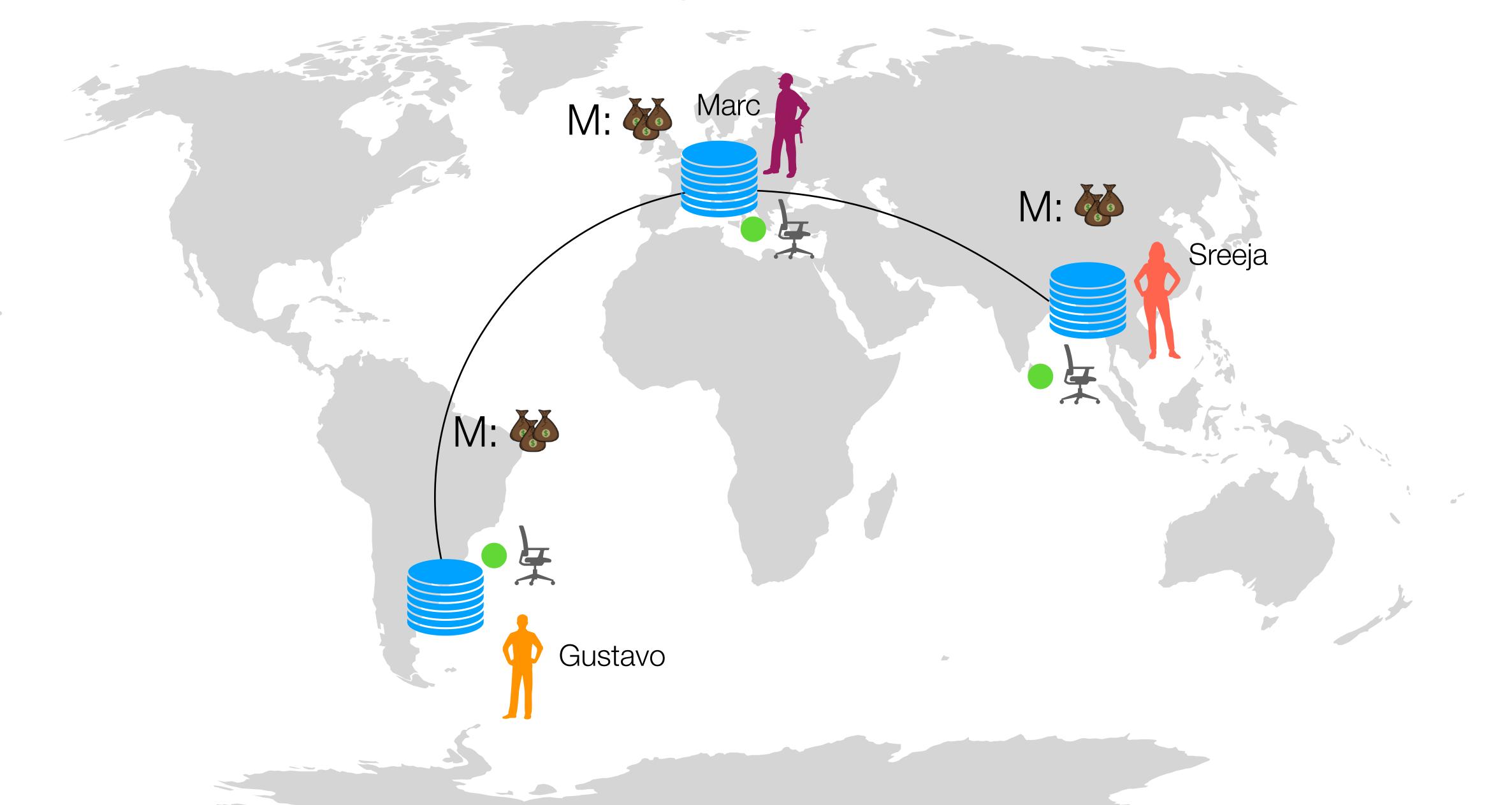


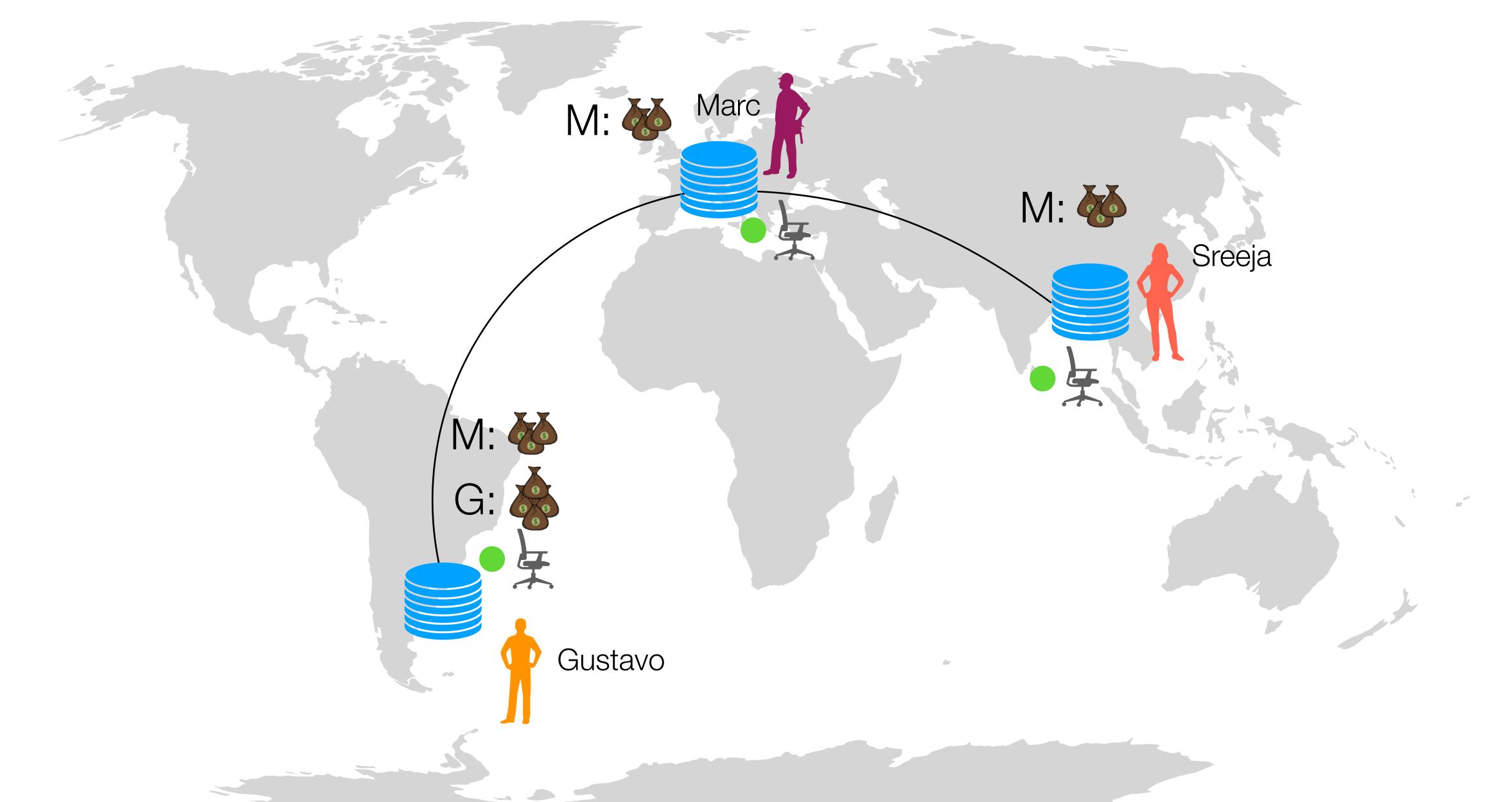


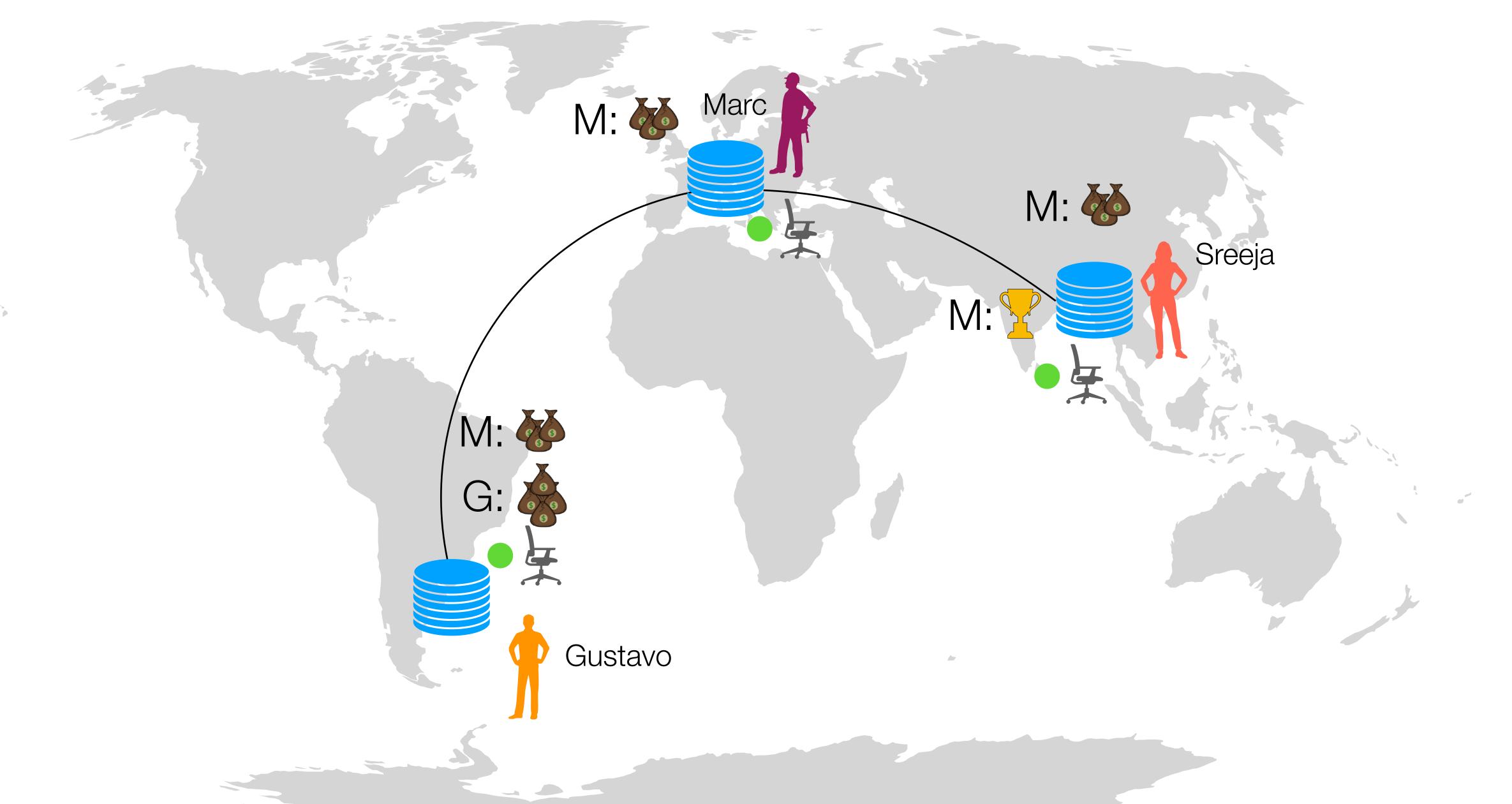


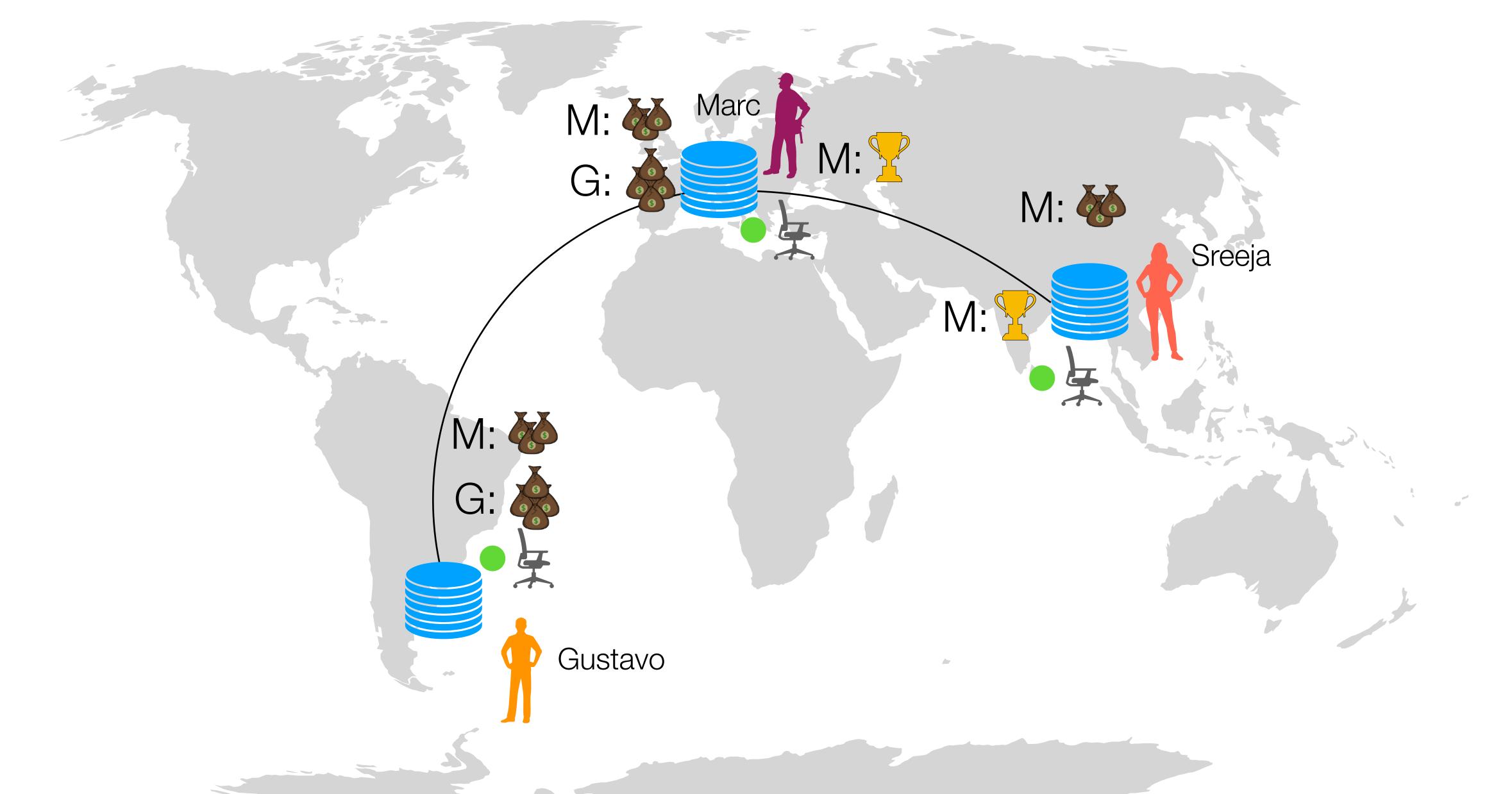


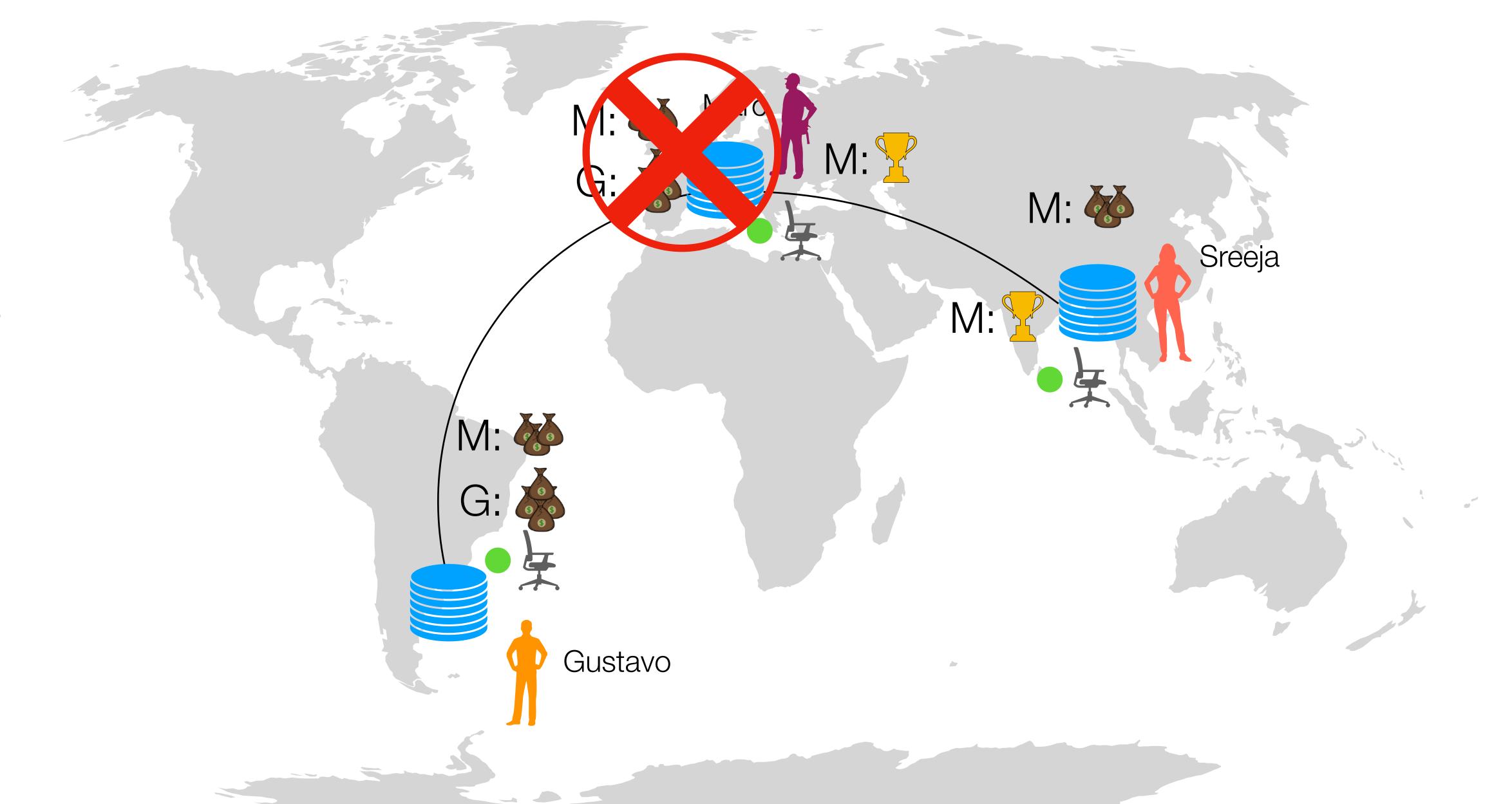










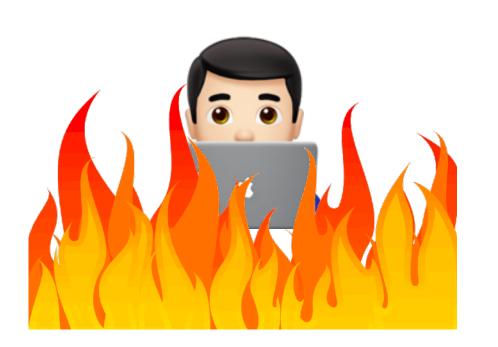




- High Availability
- Strong Consistency



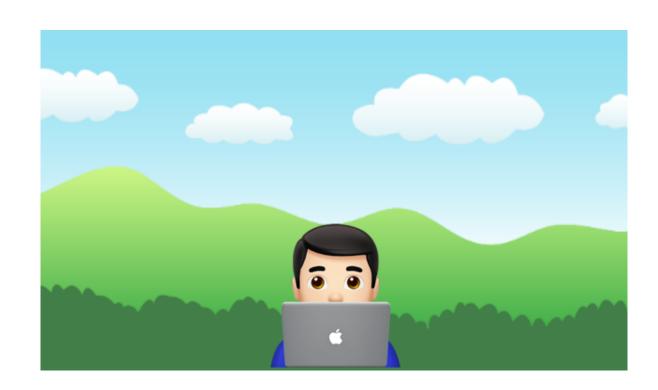
- High Availability
- Strong Consistency



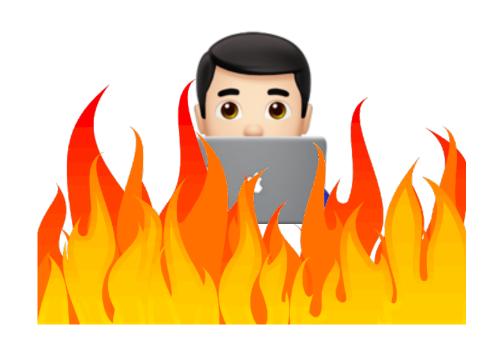
- High Availability
- Eventual Consistency



- High Availability
- Strong Consistency



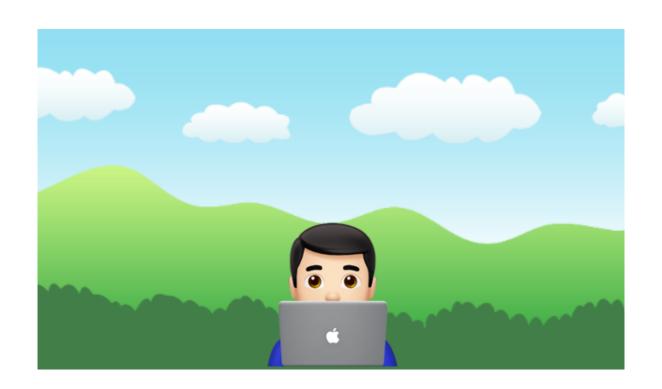
- High Availability
- Eventual Consistency
- Data Safety



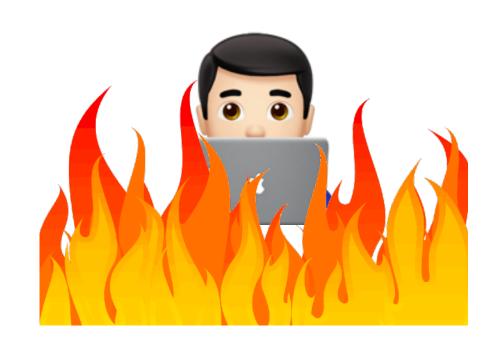
- High Availability
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- High Availability
- Strong Consistency



- High Availability
- Eventual Consistency
- Data Safety



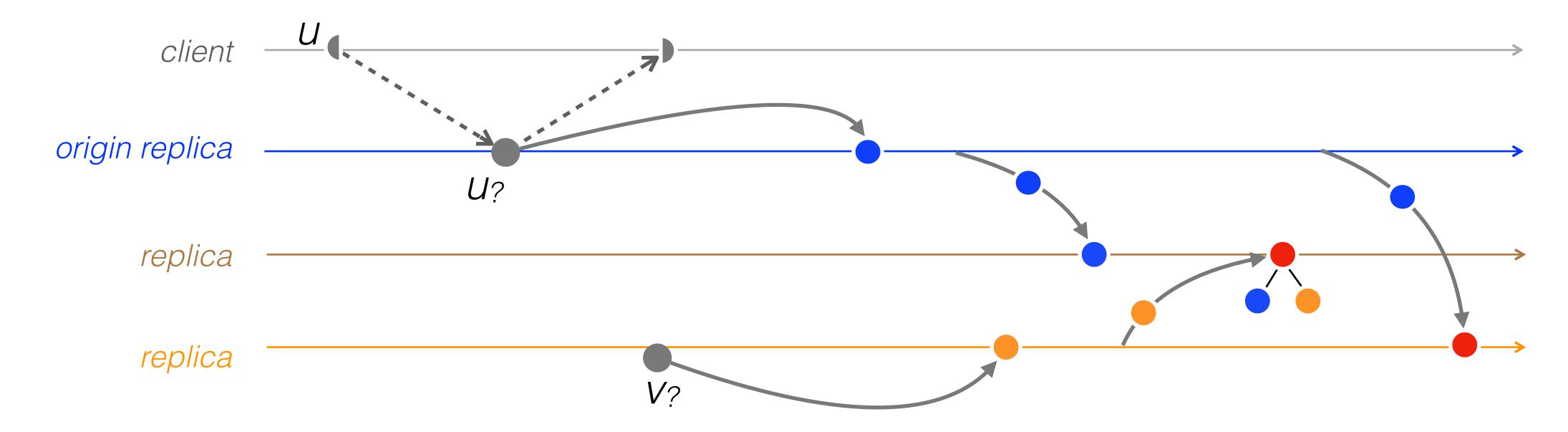
- High Availability
- Eventual Consistency

PROOF RULE FOR STATEFUL DISTRIBUTED APPLICATION SAFETY

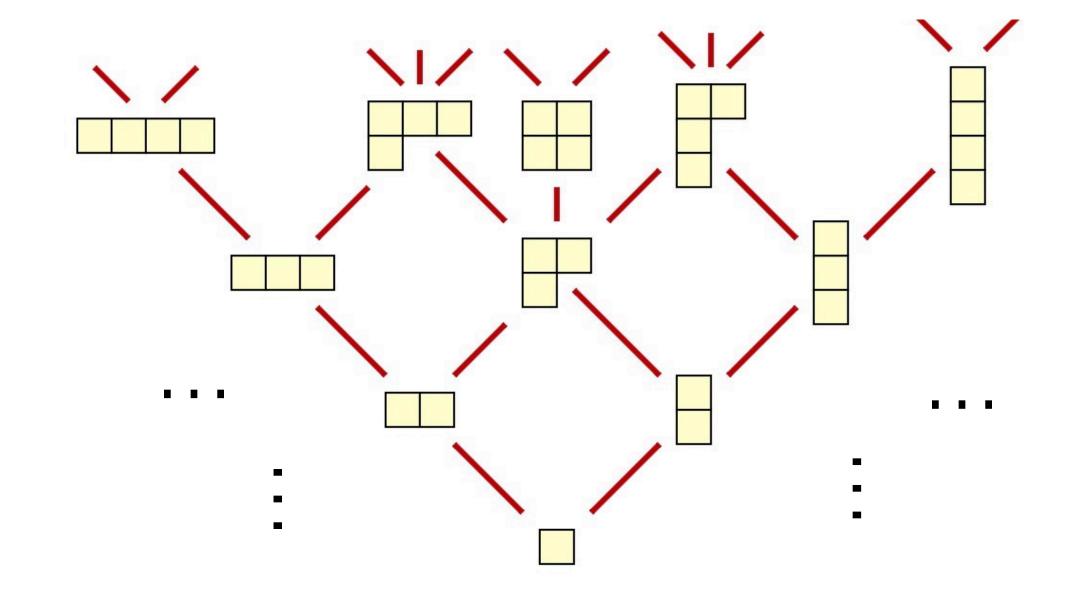
- Modular
- Automated verification

- State-based CRDTs
  - Propagation of states (instead of operations)

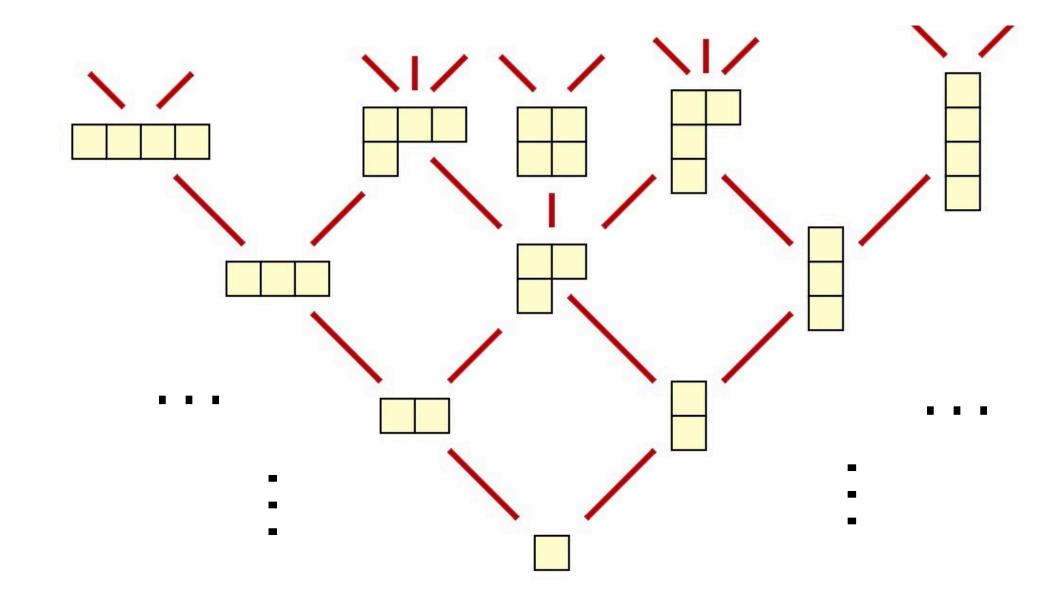
- State-based CRDTs
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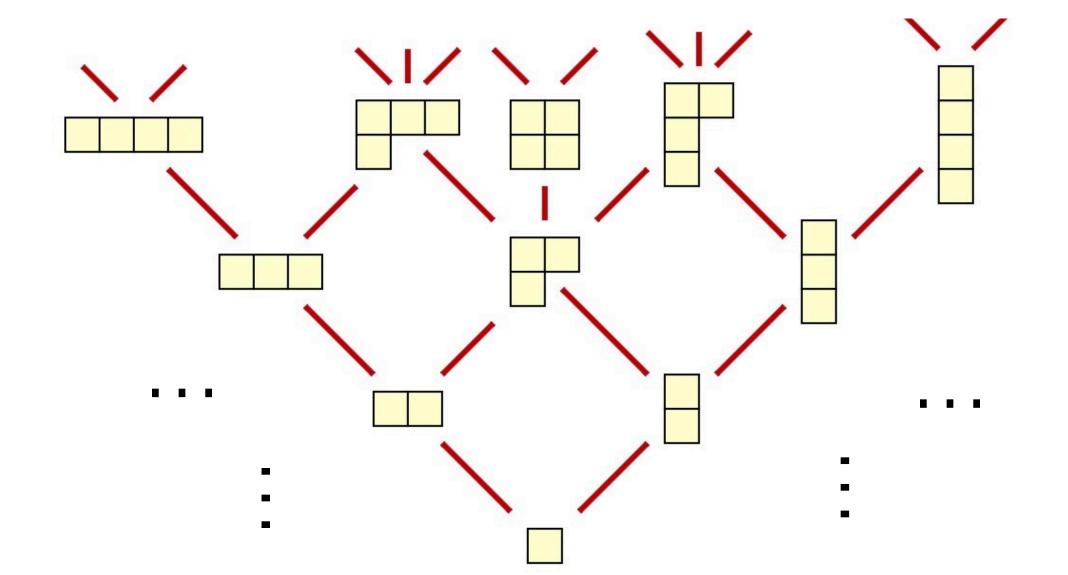
- State-based CRDTs
  - Propagation of states (instead of operations)
- States are merged on receive
  - ► Convergence: *concurrent conflicting* operations result *deterministically* on a unique state
  - No delivery assumptions



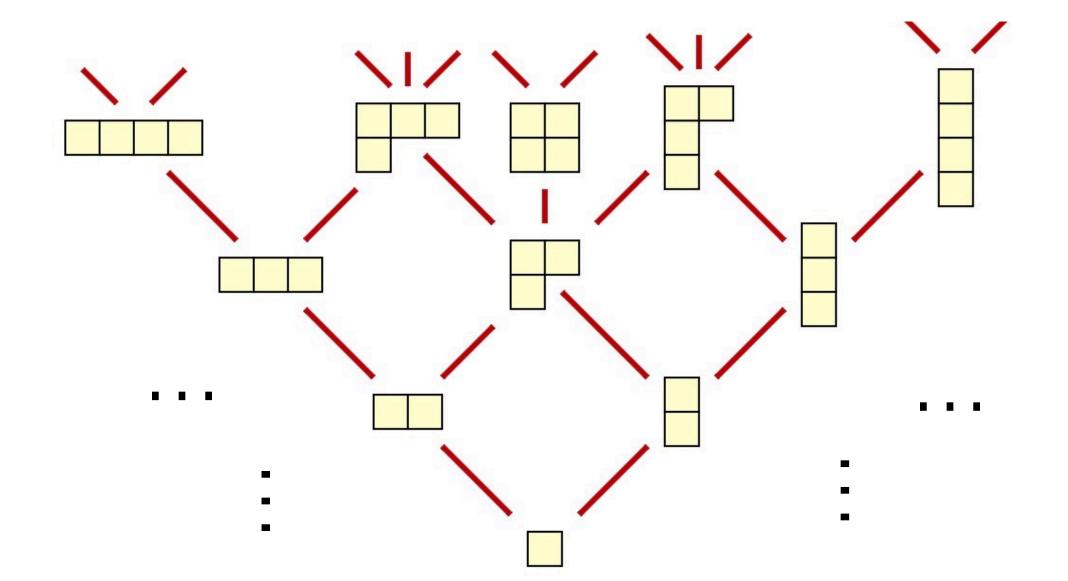
▶ State is a (join semi-)Lattice



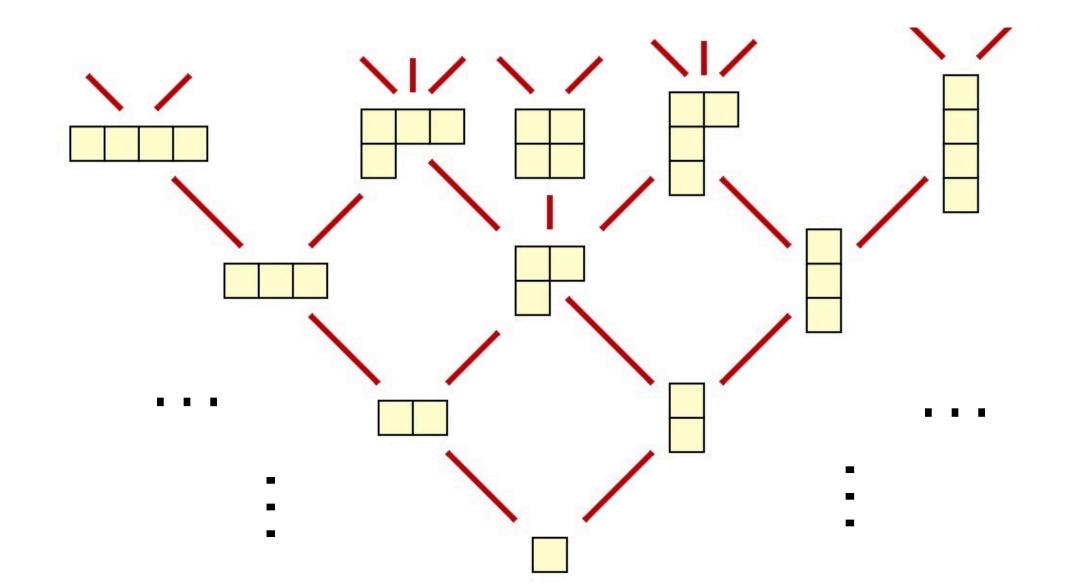
- ▶ State is a (join semi-)Lattice
- ▶ Effectors send the state at the origin
  - Lazy update propagation



- State is a (join semi-)Lattice
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  - Lazy update propagation
- Each operation is an inflation in the lattice

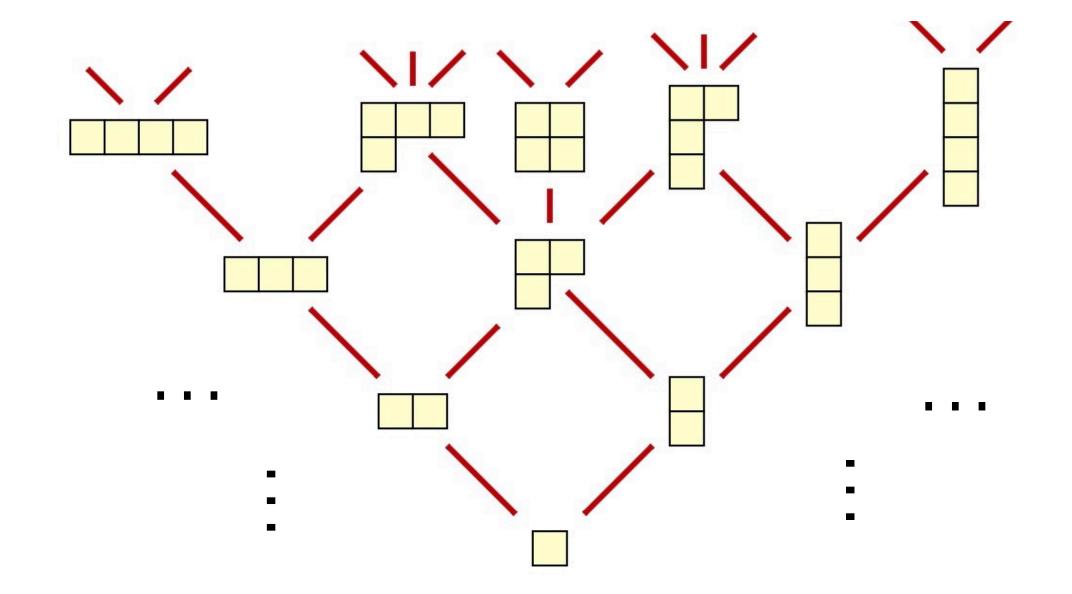


- State is a (join semi-)Lattice
- ▶ Effectors send the state at the origin
  - Lazy update propagation
- Each operation is an inflation in the lattice
- ▶ merge function joins the state of two replicas
  - Join of the lattice



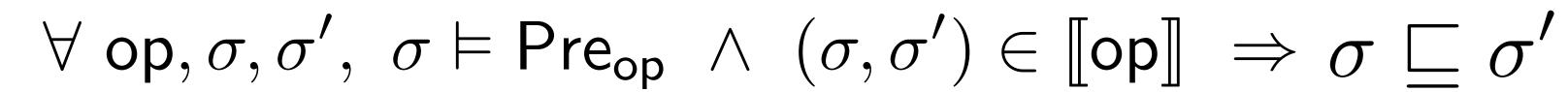
### INVARIANTS FOR SB-CRDTS

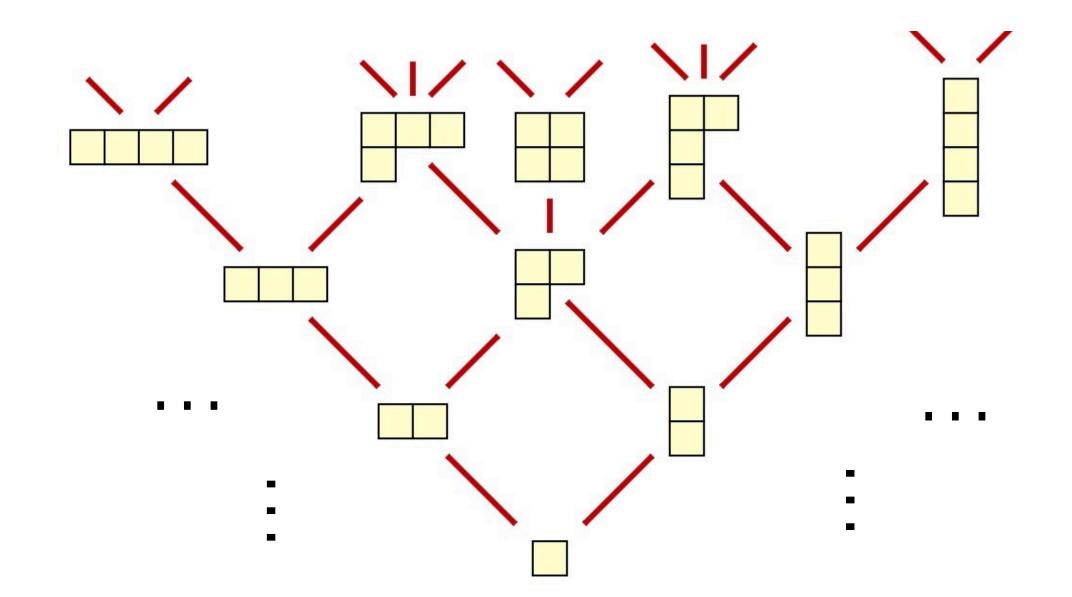
► CRDT (lattice) constraints



#### INVARIANTS FOR SB-CRDTs

- CRDT (lattice) constraints
  - Operations are inflations





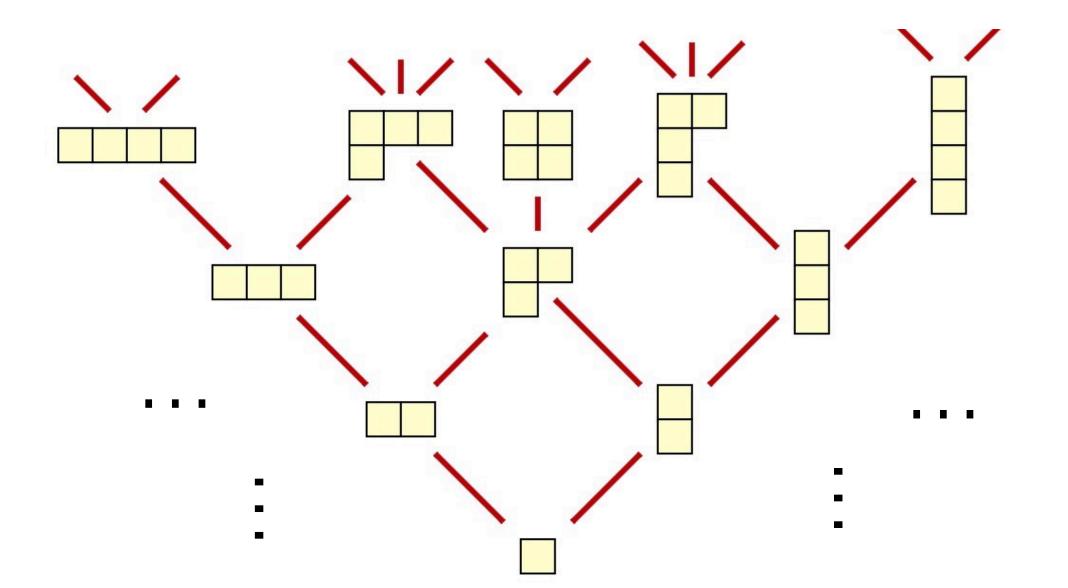
#### INVARIANTS FOR SB-CRDTs

- ► CRDT (lattice) constraints
  - Operations are inflations

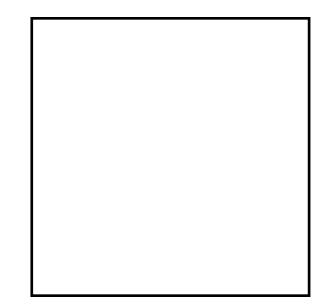
$$\forall \mathsf{op}, \sigma, \sigma', \ \sigma \vDash \mathsf{Pre}_{\mathsf{op}} \ \land \ (\sigma, \sigma') \in \llbracket \mathsf{op} \rrbracket \ \Rightarrow \ \sigma \sqsubseteq \sigma'$$

merge is join (LUB)

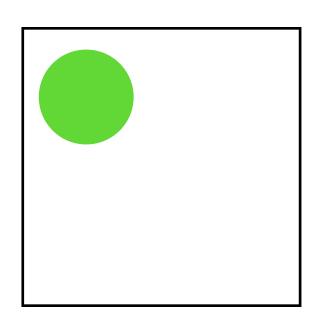
$$\forall \sigma, \sigma', \ \mathtt{merge}(\sigma, \sigma') = \sigma'' \Rightarrow \sigma'' = \mathtt{LUB}_{\sqsubseteq}(\sigma, \sigma')$$



## AUCTION STATE EVOLUTION

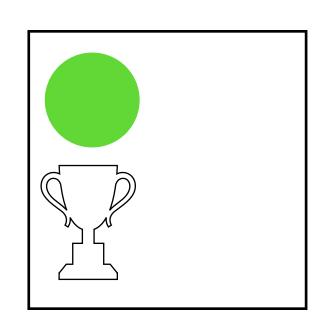


#### AUCTION STATE EVOLUTION



AUCTION STATUS: OPEN

Closed

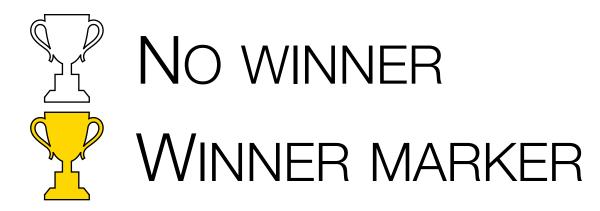


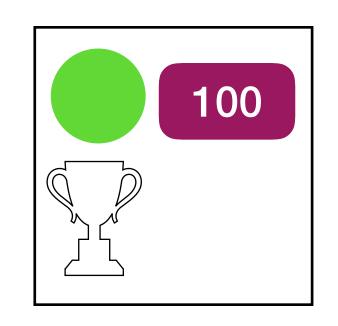
AUCTION STATUS:





AUCTION RESULT:





AUCTION STATUS:



Closed

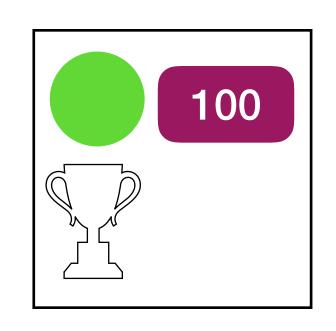
AUCTION BIDDERS:

AUCTION RESULT:





WINNER MARKER



**AUCTION STATUS:** 

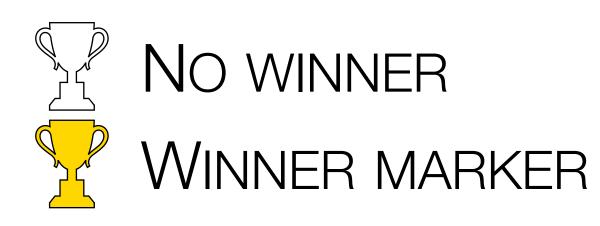
OPEN

Closed

AUCTION BIDDERS:



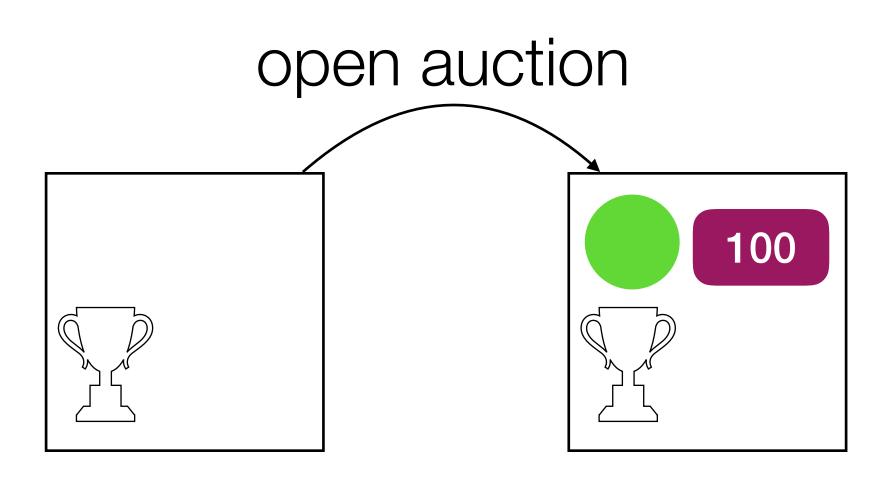
AUCTION RESULT:



AUCTION OPERATIONS:

- ▶ Open auction
  ▶ Close auction

Place bid



AUCTION STATUS:

**OPEN** 

Closed

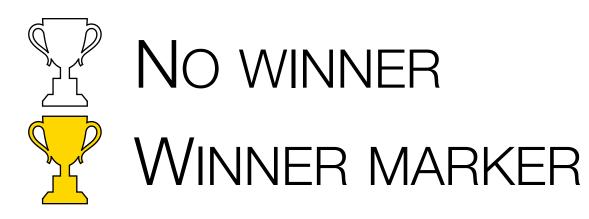
AUCTION BIDDERS:

100



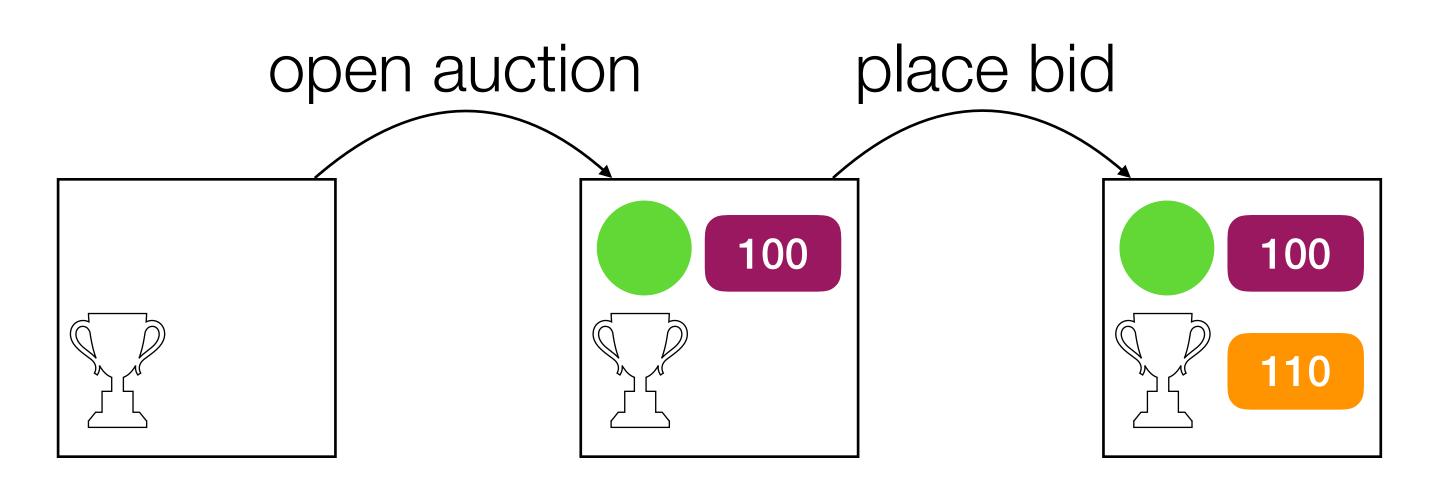
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AUCTION RESULT:



AUCTION OPERATIONS:

- ▶ Open auction
  ▶ Close auction
- Place bid



**AUCTION STATUS:** 

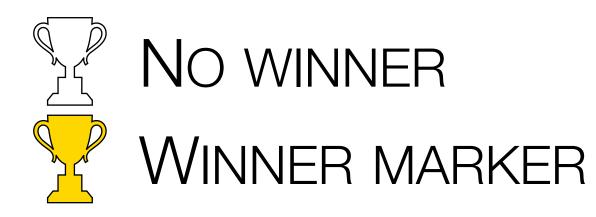
**OPEN** 

Closed

AUCTION BIDDERS:

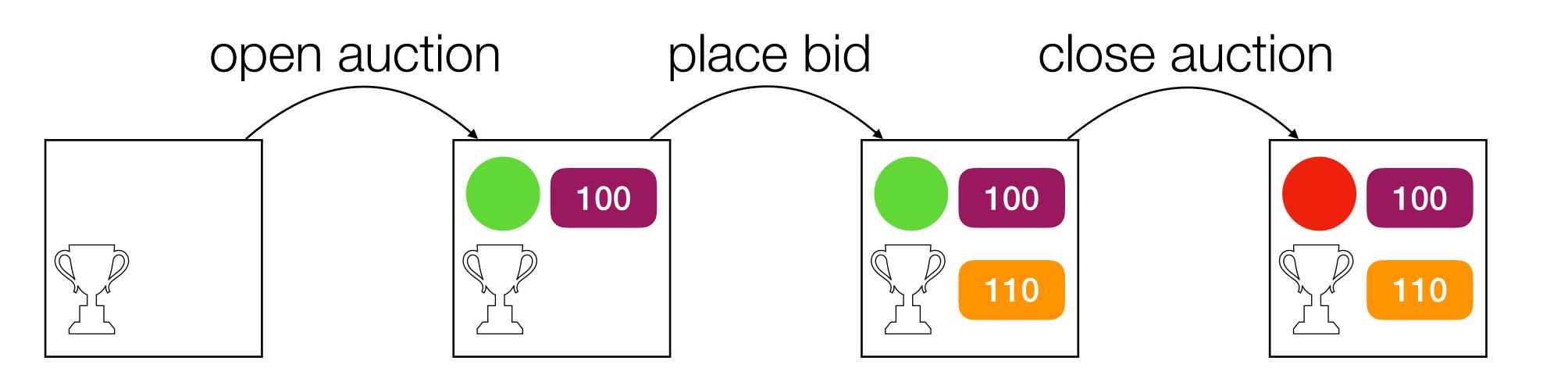
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AUCTION RESULT:



AUCTION OPERATIONS:

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**AUCTION STATUS:** 



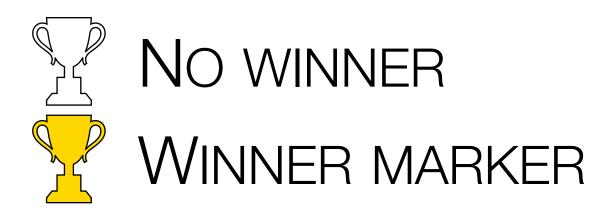
Closed

AUCTION BIDDERS:





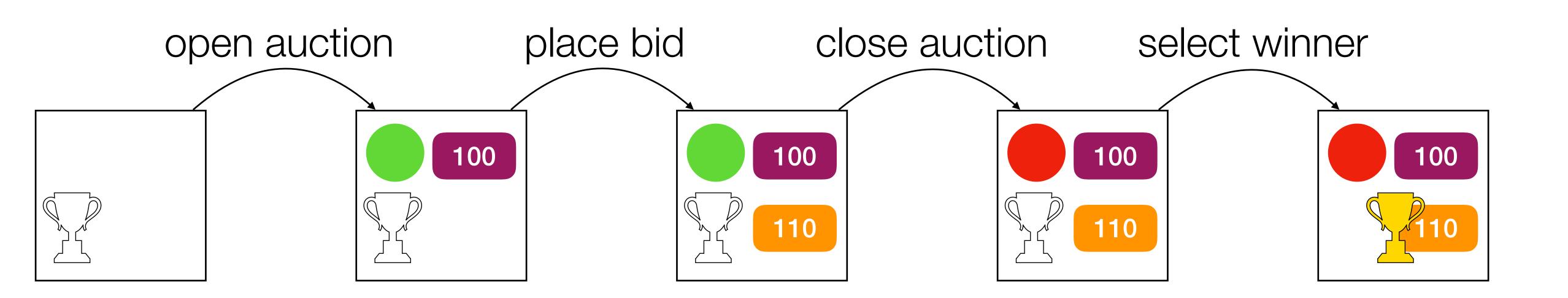
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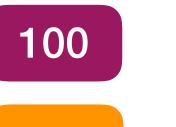


**AUCTION STATUS:** 



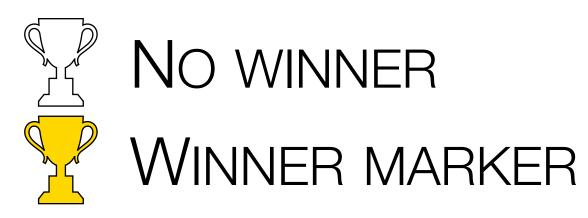


AUCTION BIDDERS:





AUCTION RESULT:

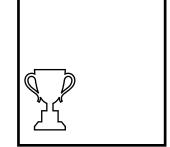


AUCTION OPERATIONS:

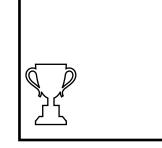
- ▶ Open auction
  ▶ Close auction

Place bid

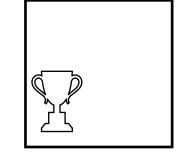




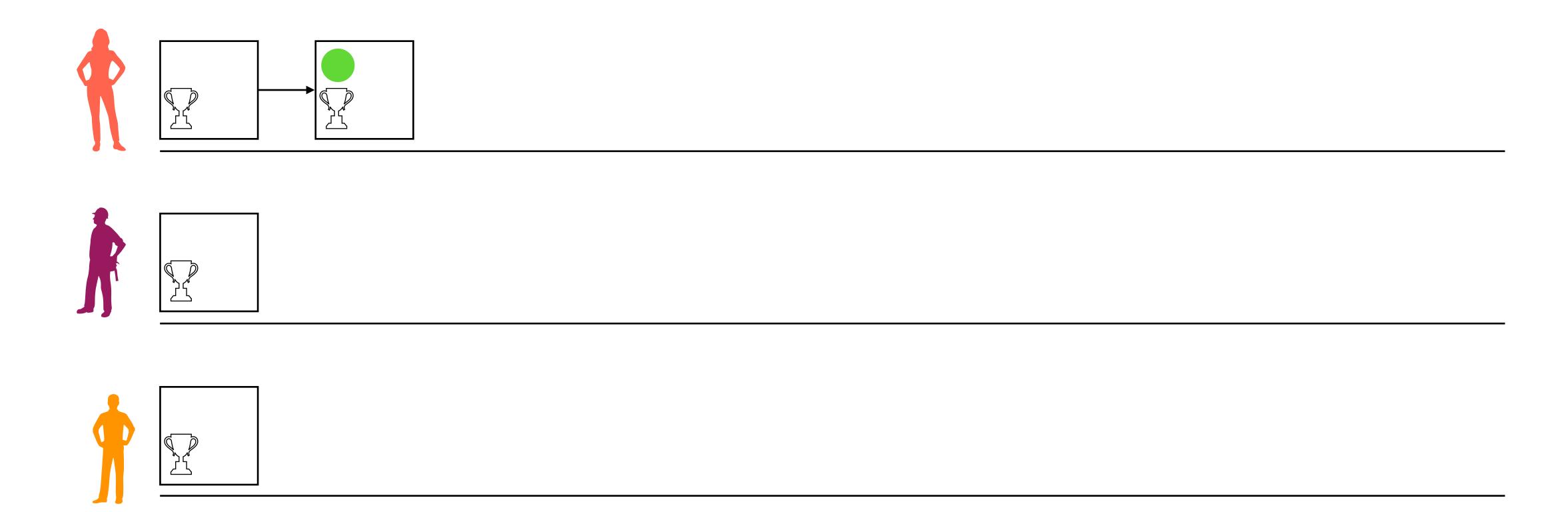




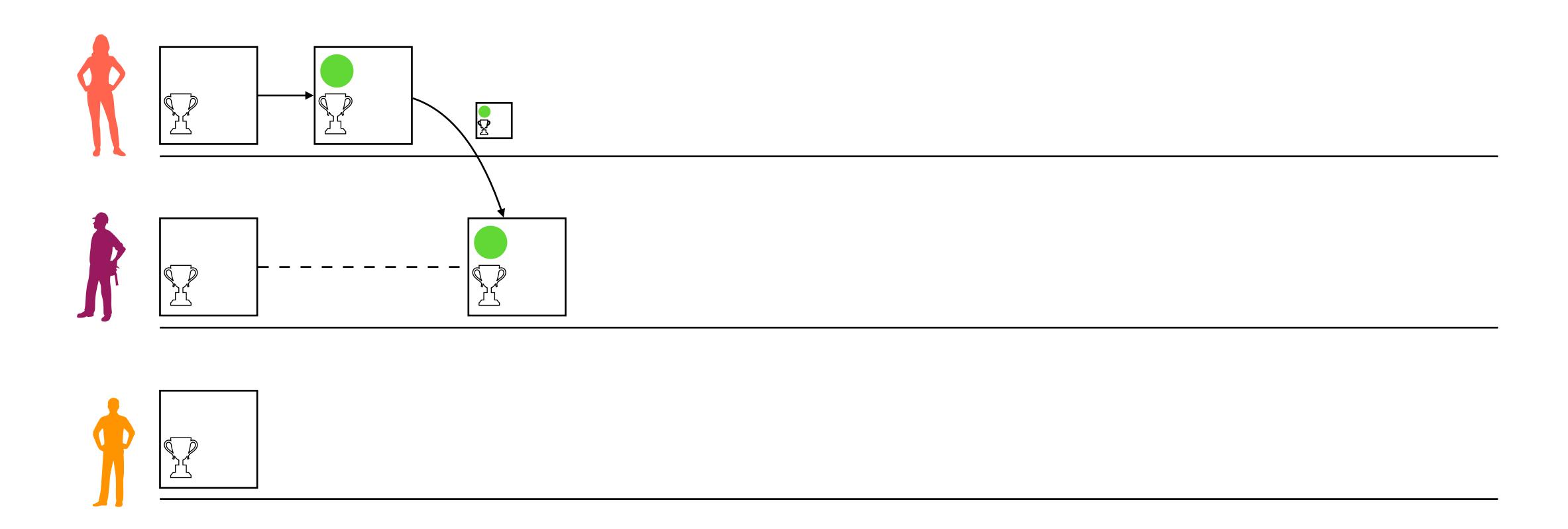






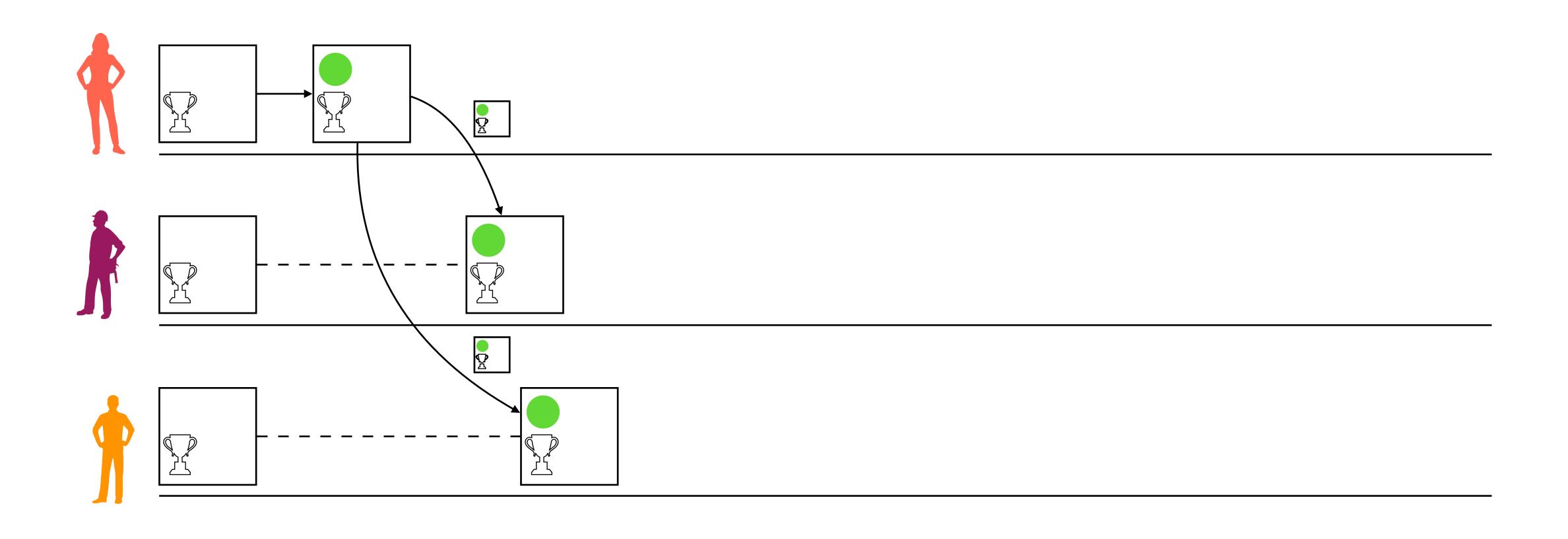




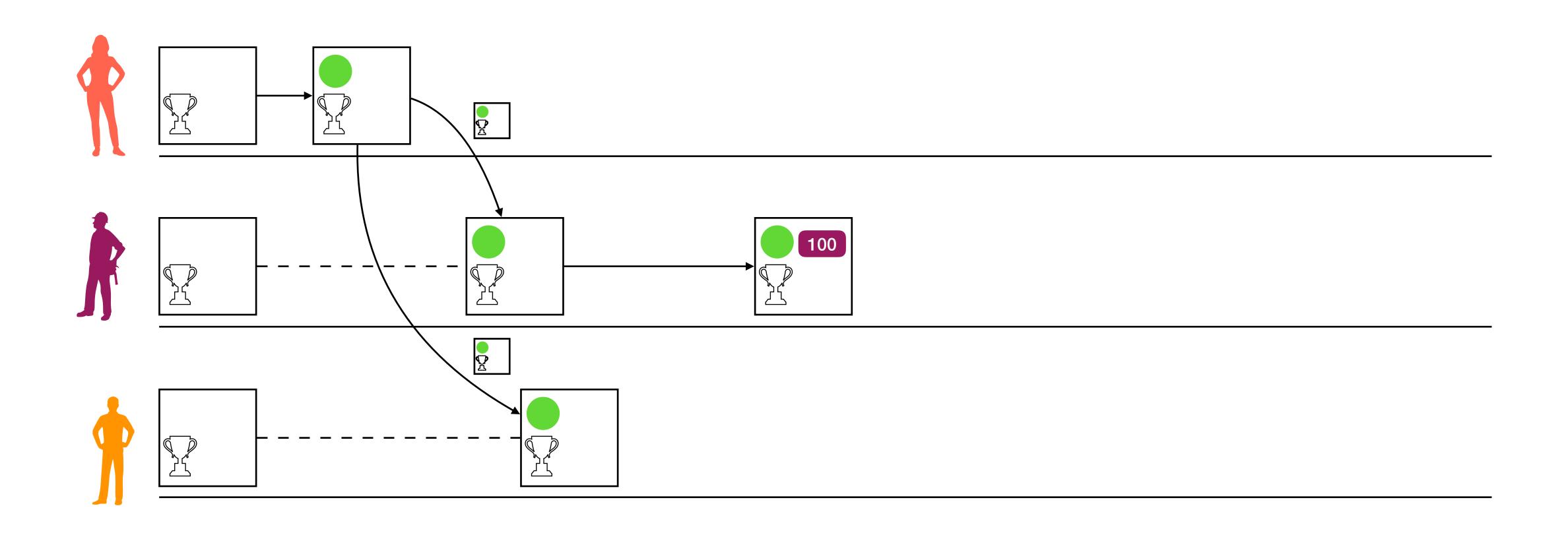


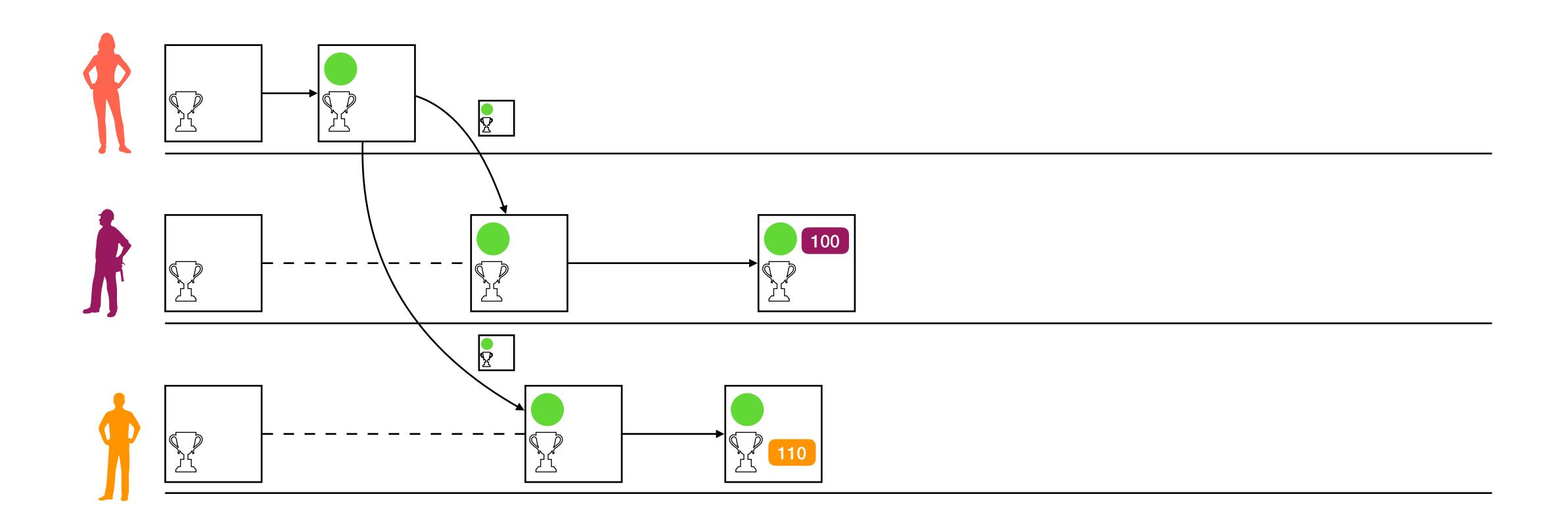




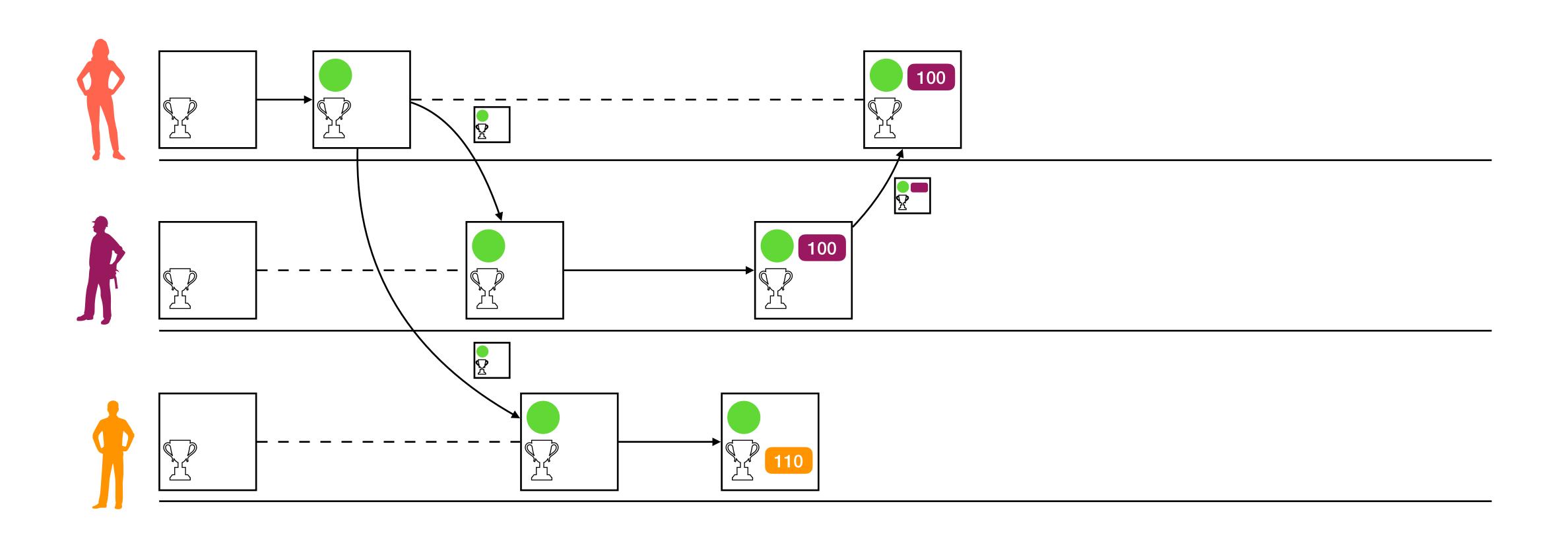




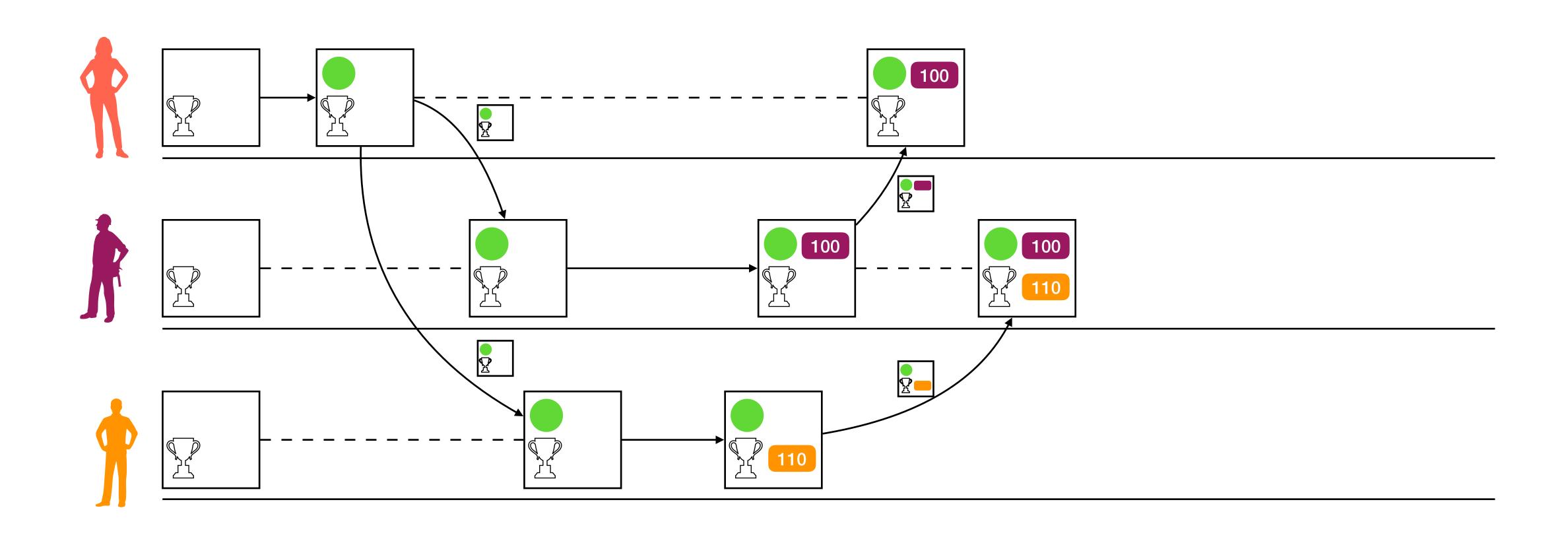




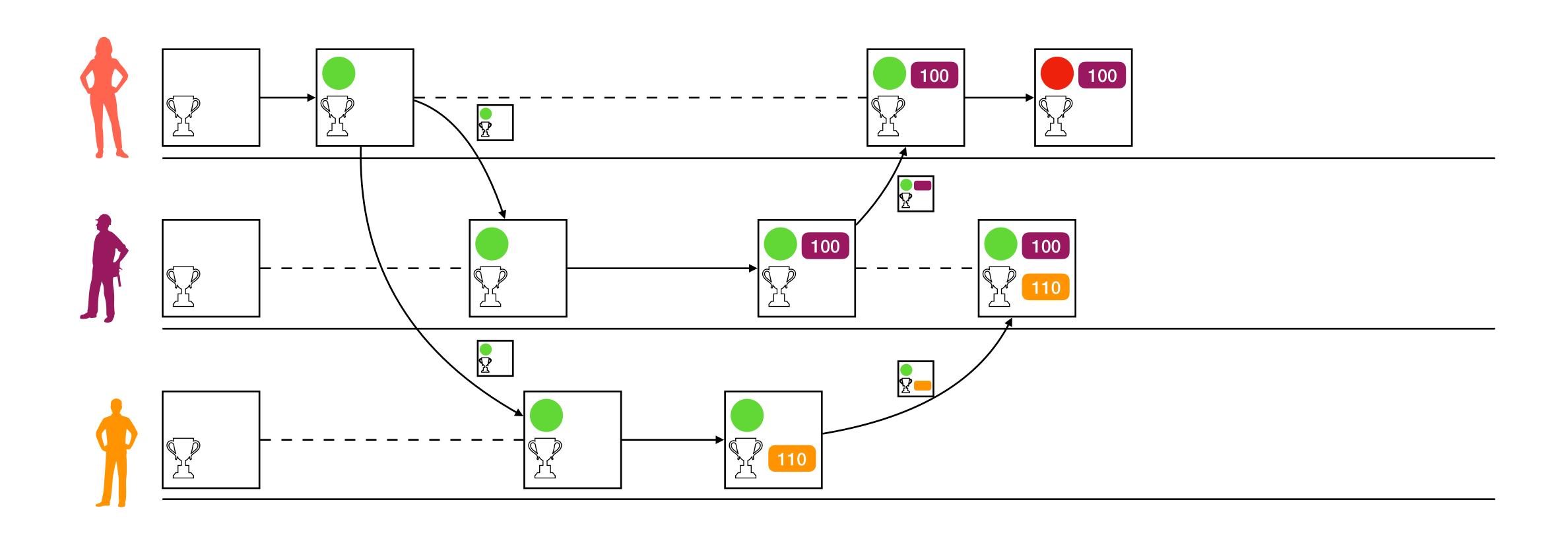






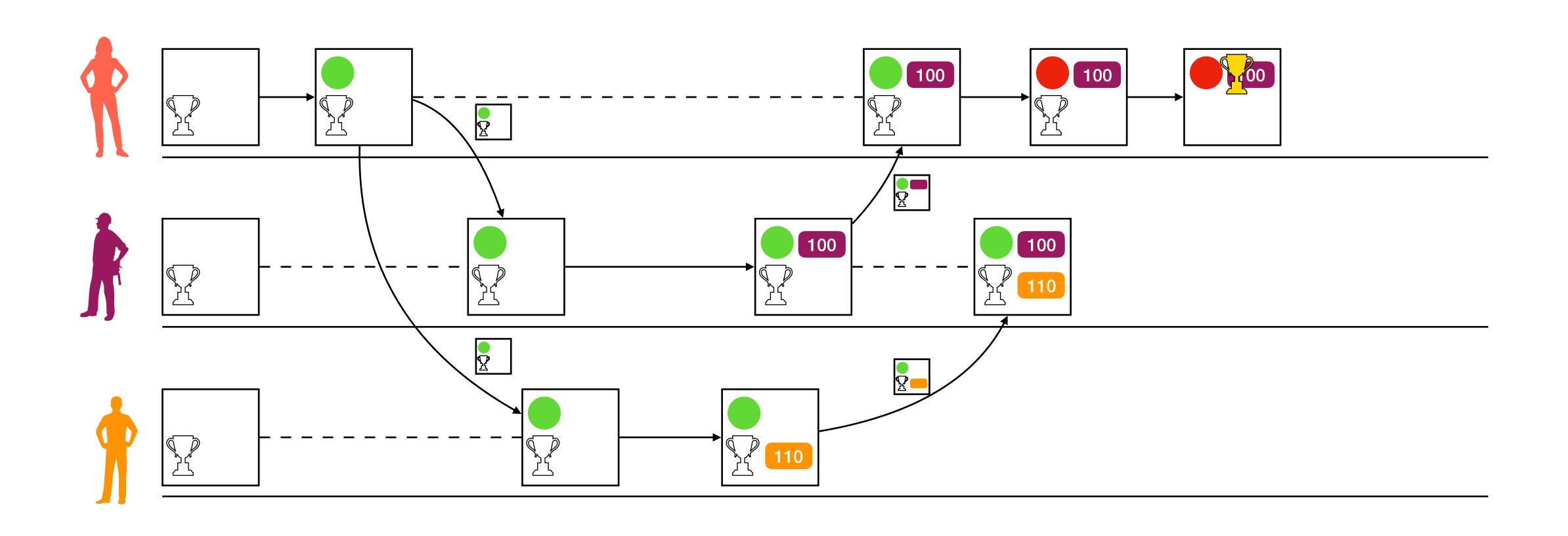




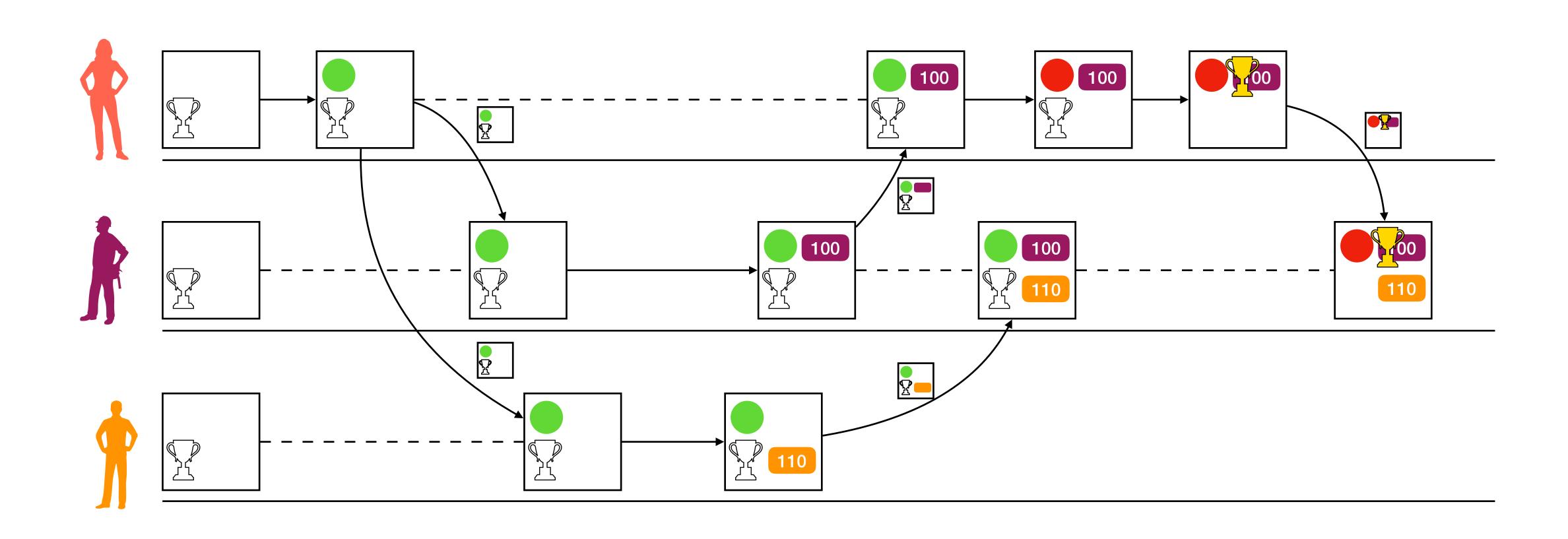




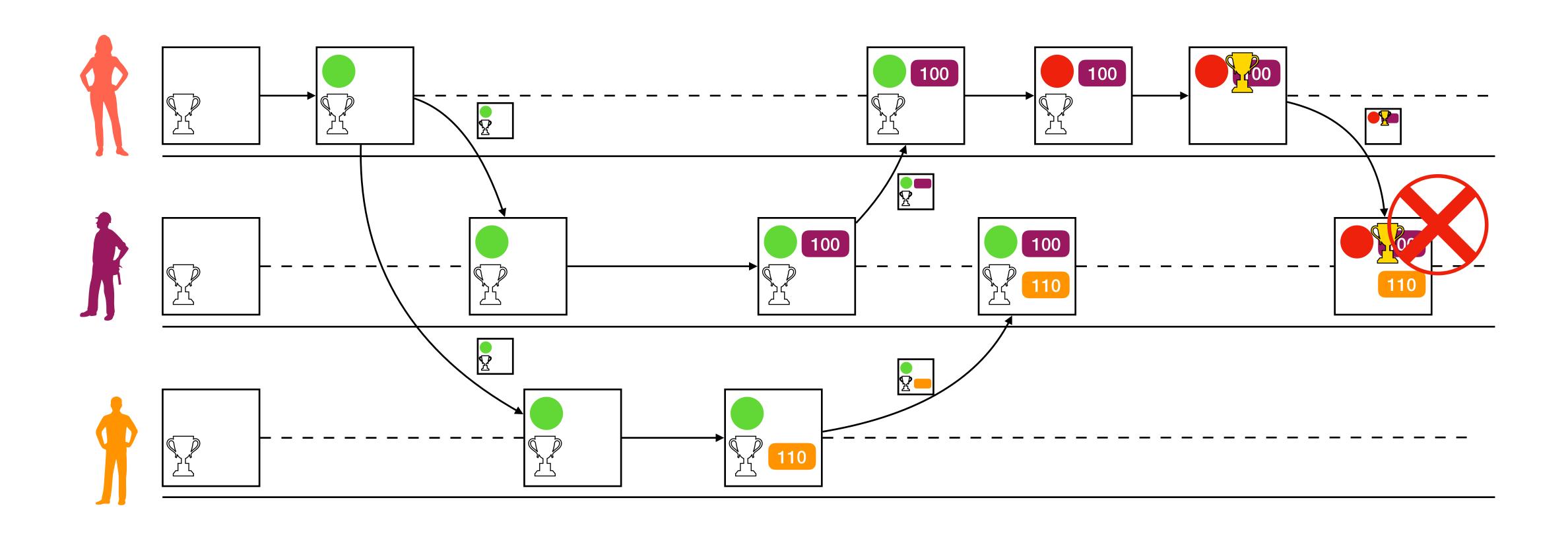




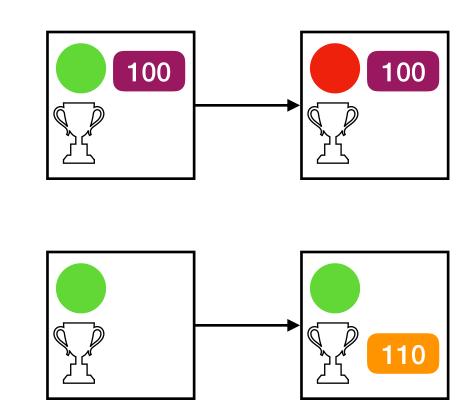


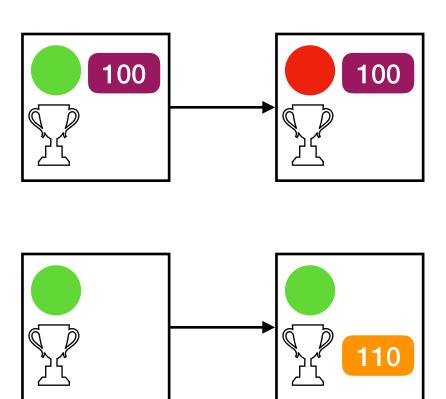






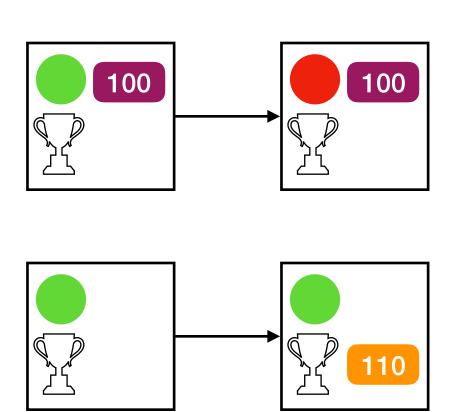




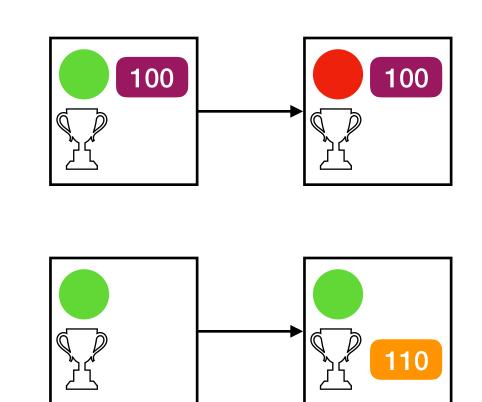


#### INVARIANTS UNDER CONCURRENCY

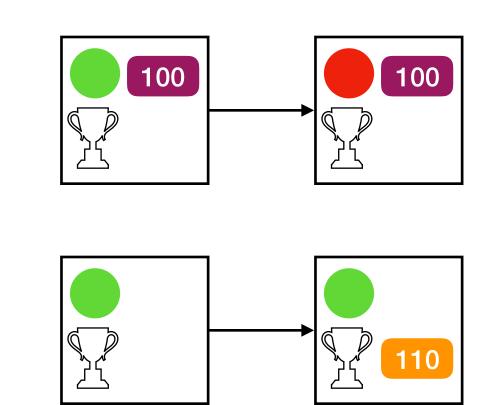
Auction cannot be closed while bids are being placed



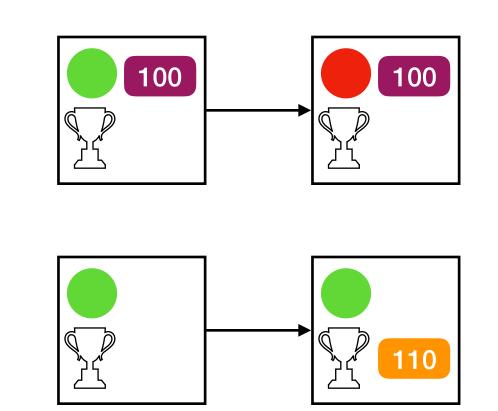
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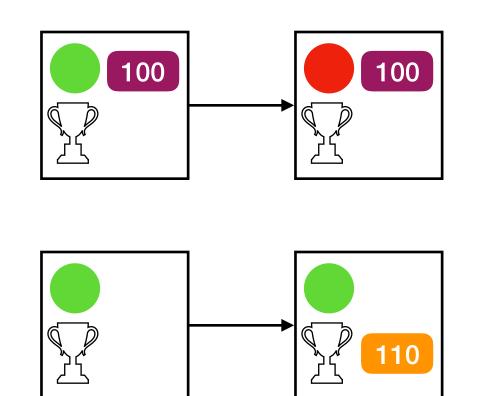
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How do we enforce invariants?



#### INVARIANTS UNDER CONCURRENCY

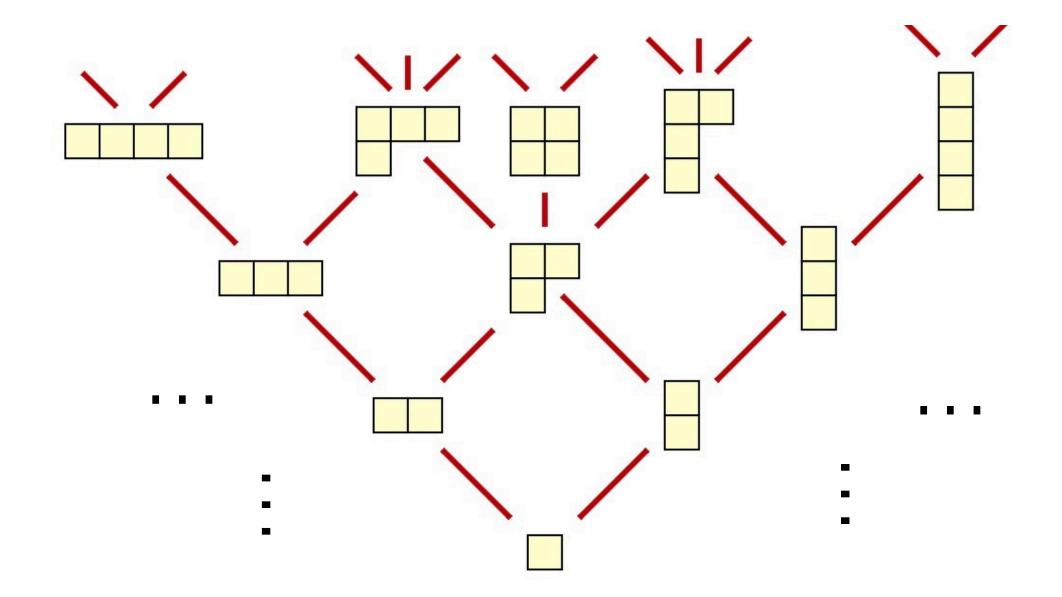
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- 110

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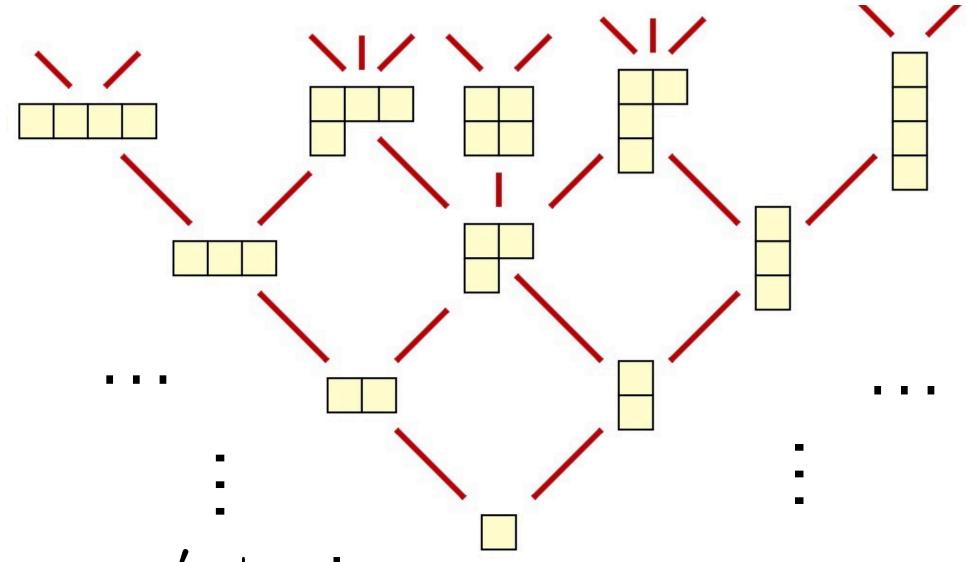
How do we verify these invariants?

Invariant constraints



- Invariant constraints
  - Operations preserve the invariant

$$\forall \text{ op}, \sigma, \sigma', \ \sigma \vDash \mathsf{Pre}_{\mathsf{op}} \ \land \ (\sigma, \sigma') \in \llbracket \mathsf{op} \rrbracket \ \Rightarrow \sigma' \ \vDash \ \mathsf{Inv}$$



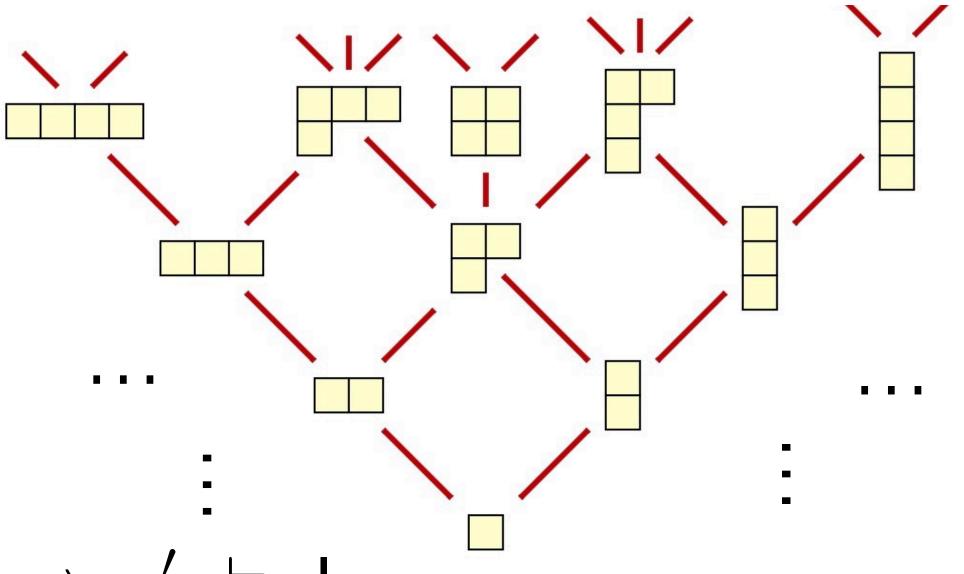
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merge preserves the invariant

$$\forall \sigma, \sigma', \sigma'', \sigma \vDash \operatorname{Inv} \land \sigma'' \vDash \operatorname{Inv} \land$$

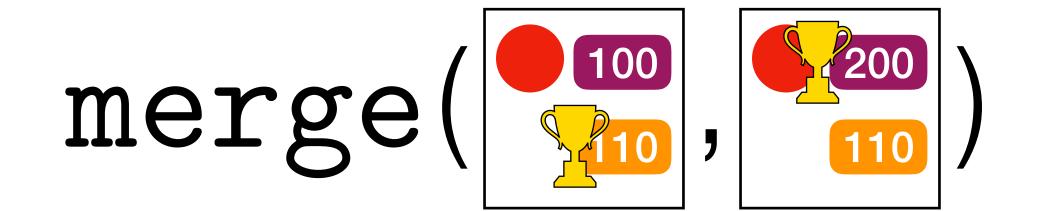
$$\operatorname{merge}(\sigma, \sigma'') = \sigma' \Rightarrow \sigma' \vDash \operatorname{Inv}$$

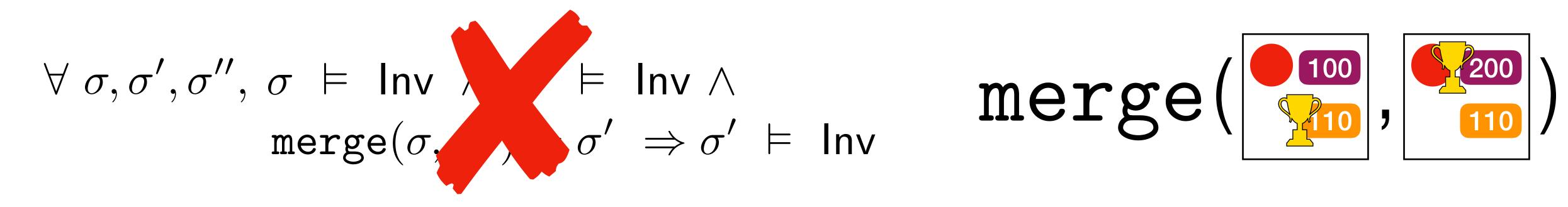


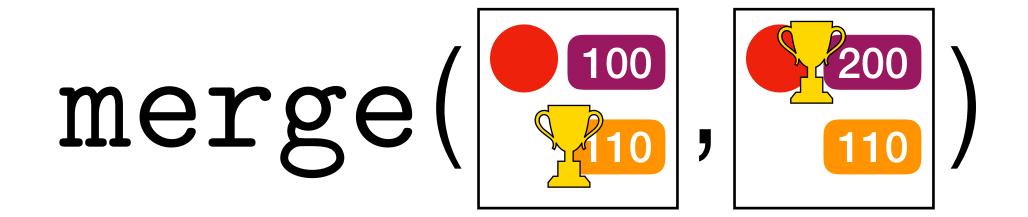
$$\forall \sigma, \sigma', \sigma'', \sigma \vDash \text{Inv} \land \sigma'' \vDash \text{Inv} \land$$

$$\text{merge}(\sigma, \sigma'') = \sigma' \Rightarrow \sigma' \vDash \text{Inv}$$

$$\forall \ \sigma, \sigma', \sigma'', \ \sigma \models \mathsf{Inv} \ \land \sigma'' \models \mathsf{Inv} \ \land \\ \mathsf{merge}(\sigma, \sigma'') = \sigma' \ \Rightarrow \sigma' \models \mathsf{Inv}$$







$$\forall \ \sigma, \sigma', \sigma'', \ \sigma \ \models \ \mathsf{Inv} \ \\ \mathsf{merge}(\sigma, \ \sigma') \Rightarrow \sigma' \ \models \ \mathsf{Inv}$$

$$\forall \sigma, \sigma', \sigma'', \sigma \vDash \mathsf{Inv} \land \sigma'' \vDash \mathsf{Inv} \land \mathsf{reachable}_{\sigma_i}(\sigma) \land \mathsf{reachable}_{\sigma_i}(\sigma'') \land \mathsf{merge}(\sigma, \sigma'') = \sigma' \Rightarrow \sigma' \vDash \mathsf{Inv}$$

$$\forall \ \sigma, \sigma', \sigma'', \ \sigma \ \models \ \mathsf{Inv} \qquad \models \ \mathsf{Inv} \ \land \\ \mathsf{merge}(\sigma, \ \sigma' \ \Rightarrow \sigma' \ \models \ \mathsf{Inv}$$

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# INVARIANTS FOR SB-CRDTS

$$\forall \ \sigma, \sigma', \sigma'', \ \sigma \ \models \ \mathsf{Inv} \ ) \qquad \models \ \mathsf{Inv} \ \land \\ \mathsf{merge}(\sigma, \ ) \qquad \sigma' \ \Rightarrow \sigma' \ \models \ \mathsf{Inv}$$

$$\forall \ \sigma, \sigma', \sigma'', \ \sigma \ \vDash \ \mathsf{Inv} \ \land \ \mathsf{reachable}_{\sigma_i}(\sigma) \ \land \ \mathsf{reachable}_{\sigma_i}(\sigma'') \ \land \ \mathsf{merge}(\sigma, \sigma') \Rightarrow \sigma' \ \vDash \ \mathsf{Inv}$$

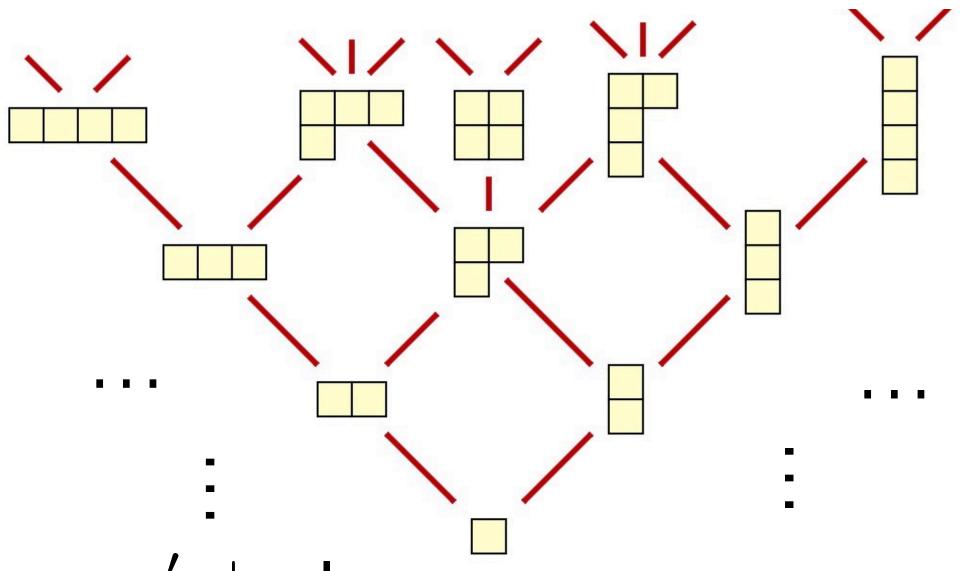
$$\forall \sigma, \sigma', \sigma'', \ (\sigma, \sigma'') \models \mathsf{Pre}_{\mathtt{merge}} \land \mathtt{merge}(\sigma, \sigma'') = \sigma' \Rightarrow \sigma' \models \mathsf{Inv}$$

$$\mathsf{Pre}_{\mathtt{merge}} = \mathsf{wp}(\mathtt{merge}(\sigma, \sigma''), \mathsf{Inv})$$

## INVARIANTS FOR SB-CRDTs

- Invariant constraints
  - Operations preserve the invariant

$$\forall \mathsf{op}, \sigma, \sigma', \ \sigma \vDash \mathsf{Pre}_\mathsf{op} \ \land \ (\sigma, \sigma') \in \llbracket \mathsf{op} \rrbracket \ \Rightarrow \sigma' \ \vDash \ \mathsf{Inv}$$



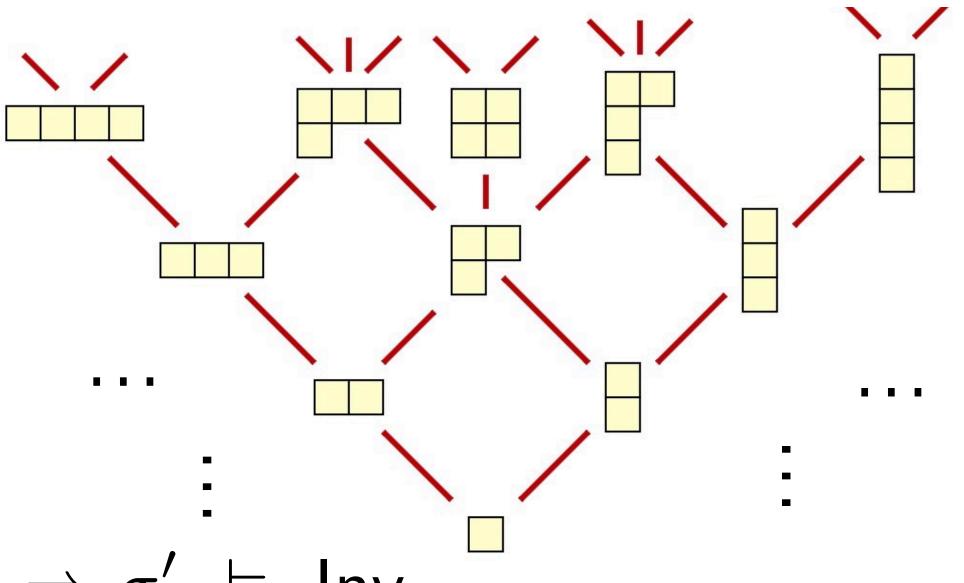
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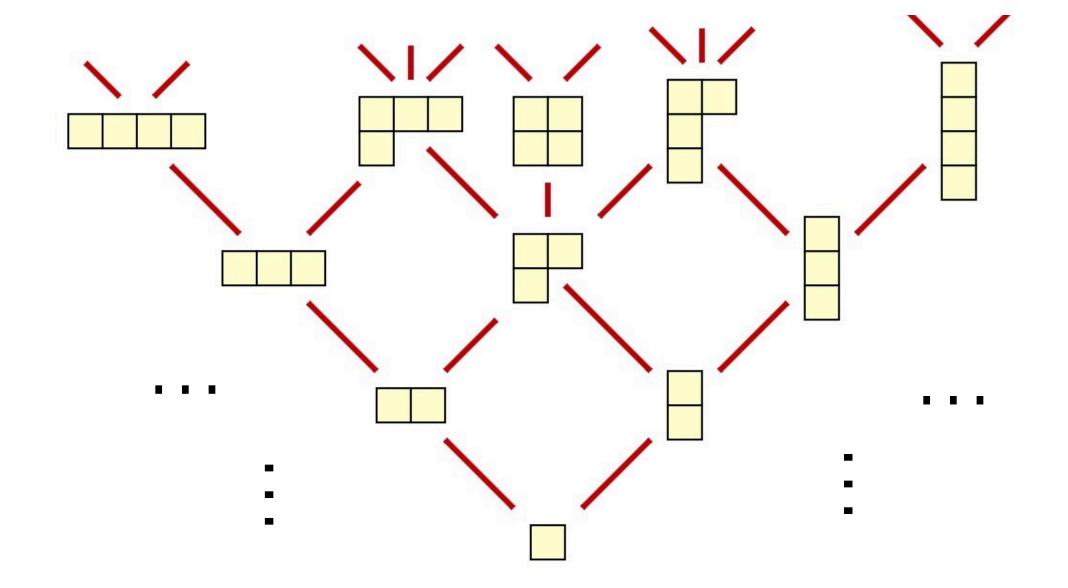
merge preserves the invariant

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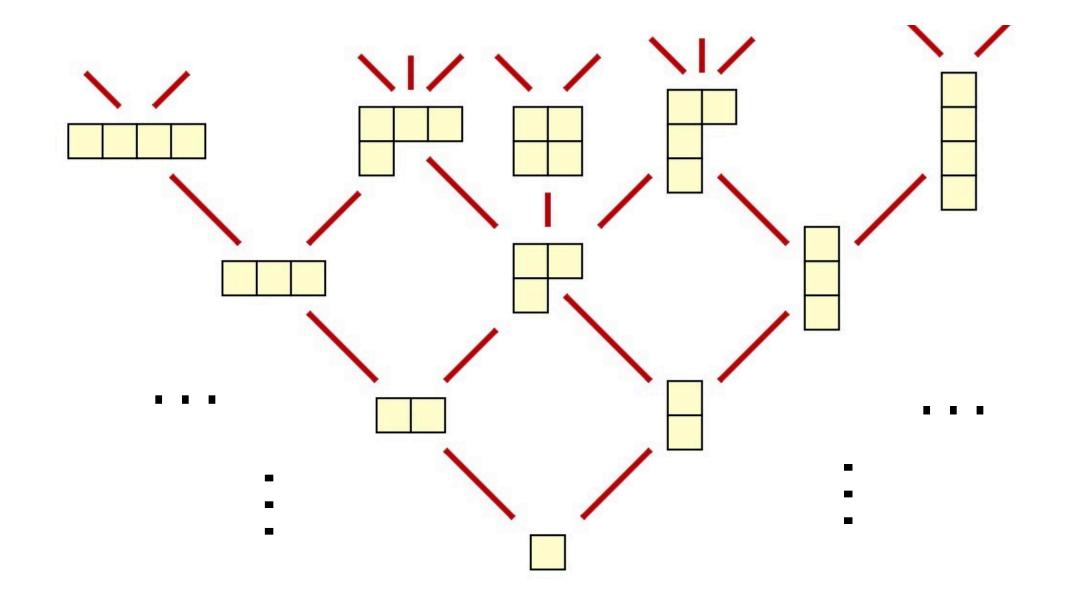
# INVARIANTS FOR SB-CRDTS

- merge Pre constraints
  - Initial state satisfies **merge** Pre  $Pre_{merge}(\sigma_i, \sigma_i)$



#### INVARIANTS FOR SB-CRDTS

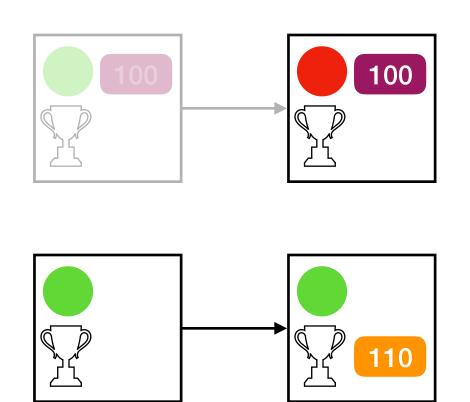
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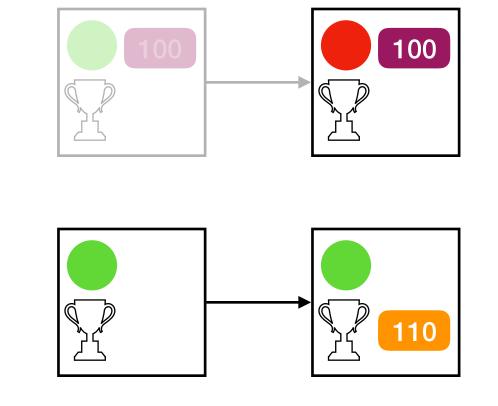
▶ Operations preserve the **merge** Pre

$$\forall \ \mathsf{op}, \sigma, \sigma', \sigma'', \ \left( \begin{array}{l} \sigma \vDash \mathsf{Pre}_{\mathsf{op}} \ \land \\ (\sigma, \sigma'') \vDash \mathsf{Pre}_{\mathsf{merge}} \ \land \\ (\sigma, \sigma') \in \llbracket \mathsf{op} \rrbracket \end{array} \right) \Rightarrow (\sigma', \sigma'') \ \vDash \ \mathsf{Pre}_{\mathsf{merge}}$$

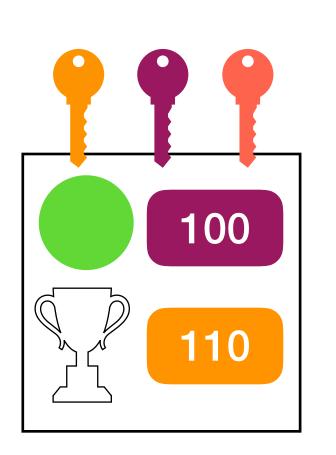
- Auction cannot be closed while bids are being placed
- $\blacktriangleright$  Status can only go from: inital  $\longmapsto$  open  $\longmapsto$  closed
- Winner is highest bid when auction is closed
- Bids are strictly incremental



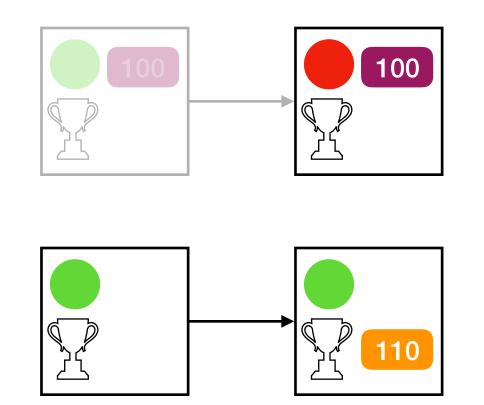
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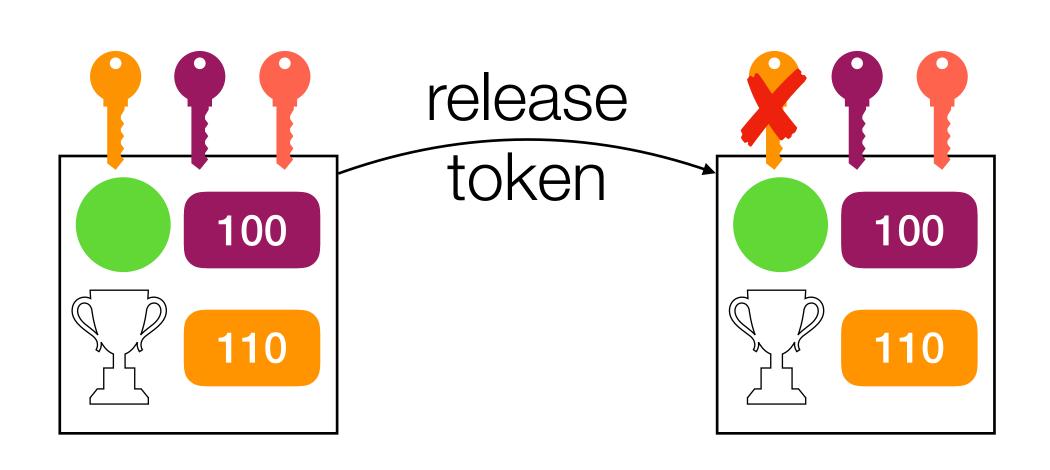




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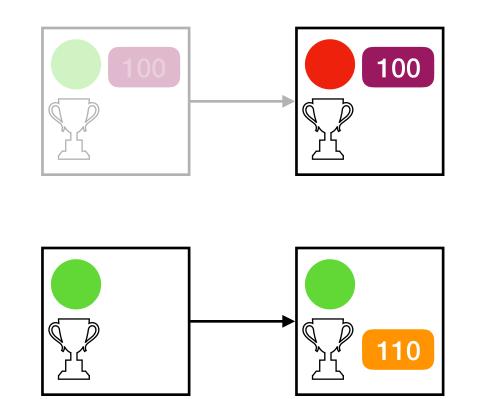


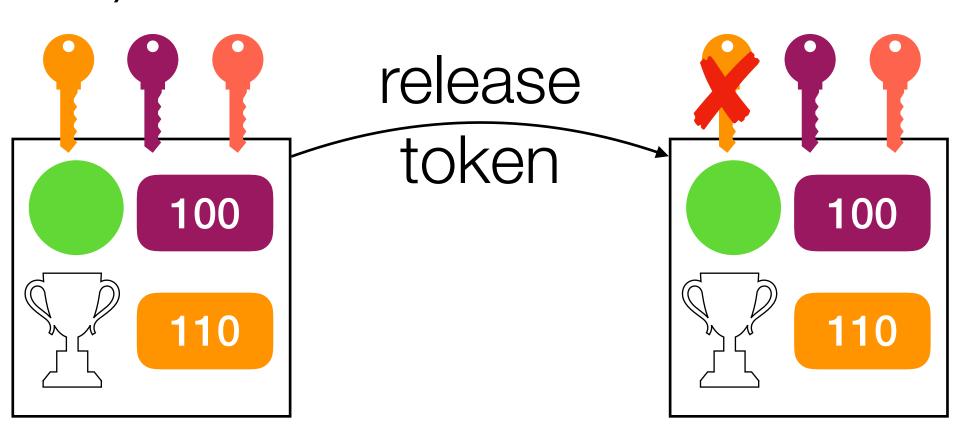




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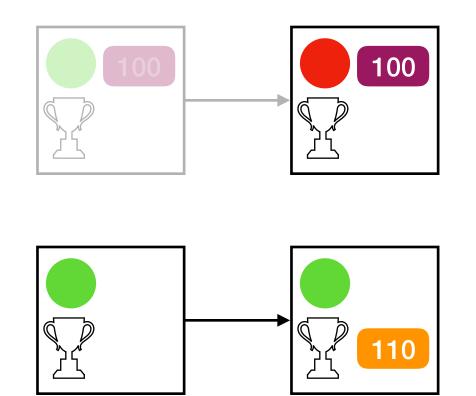


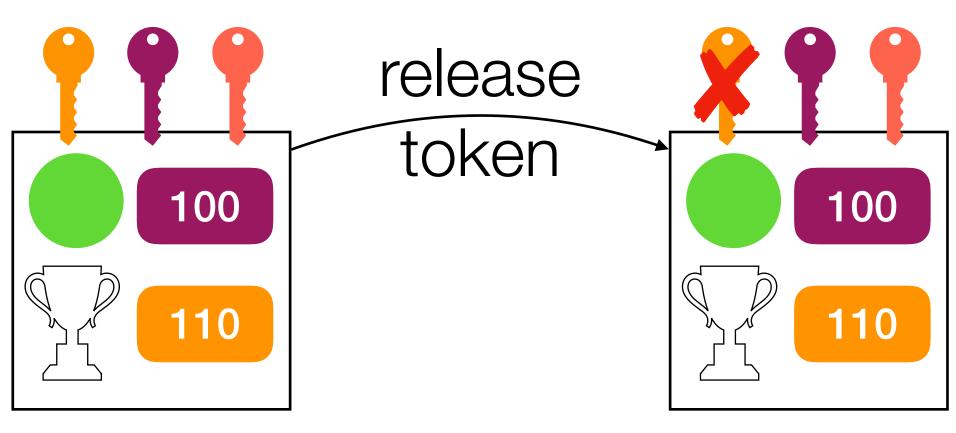


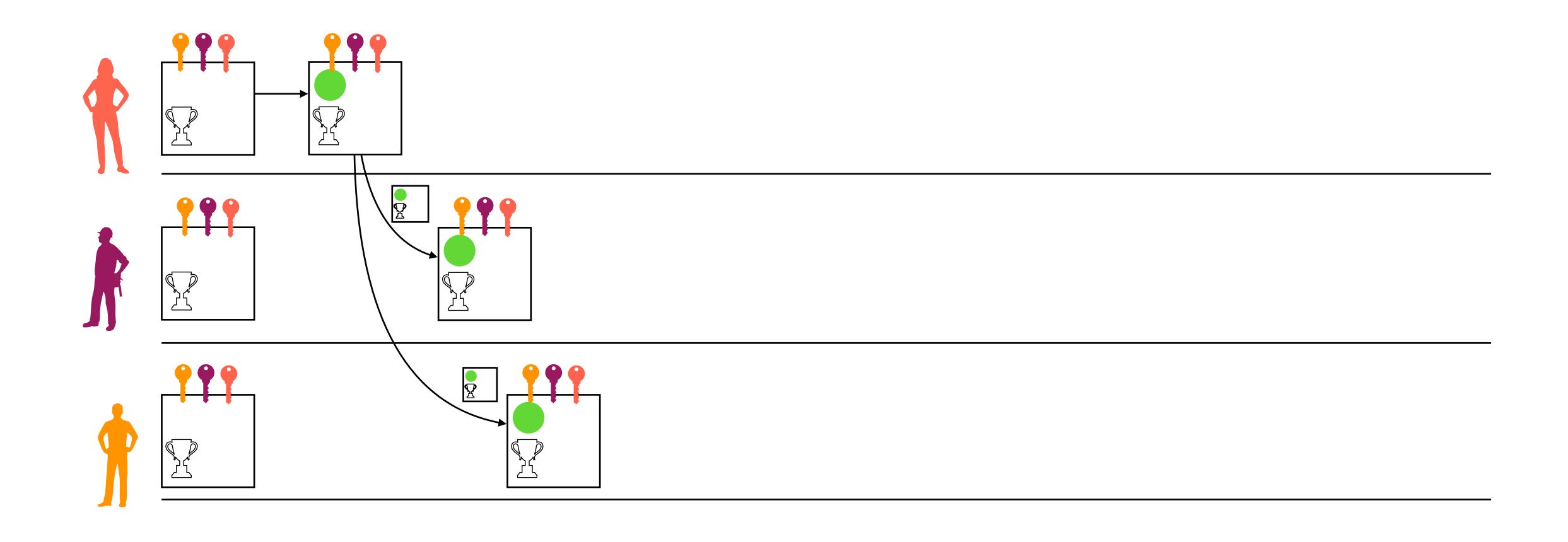


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- Winner is highest bid when auction is closed
- Bids are strictly incremental
- $\blacktriangleright$  Tokes go from taken  $\longmapsto$  released (by owner)
- Close when all tokens are released



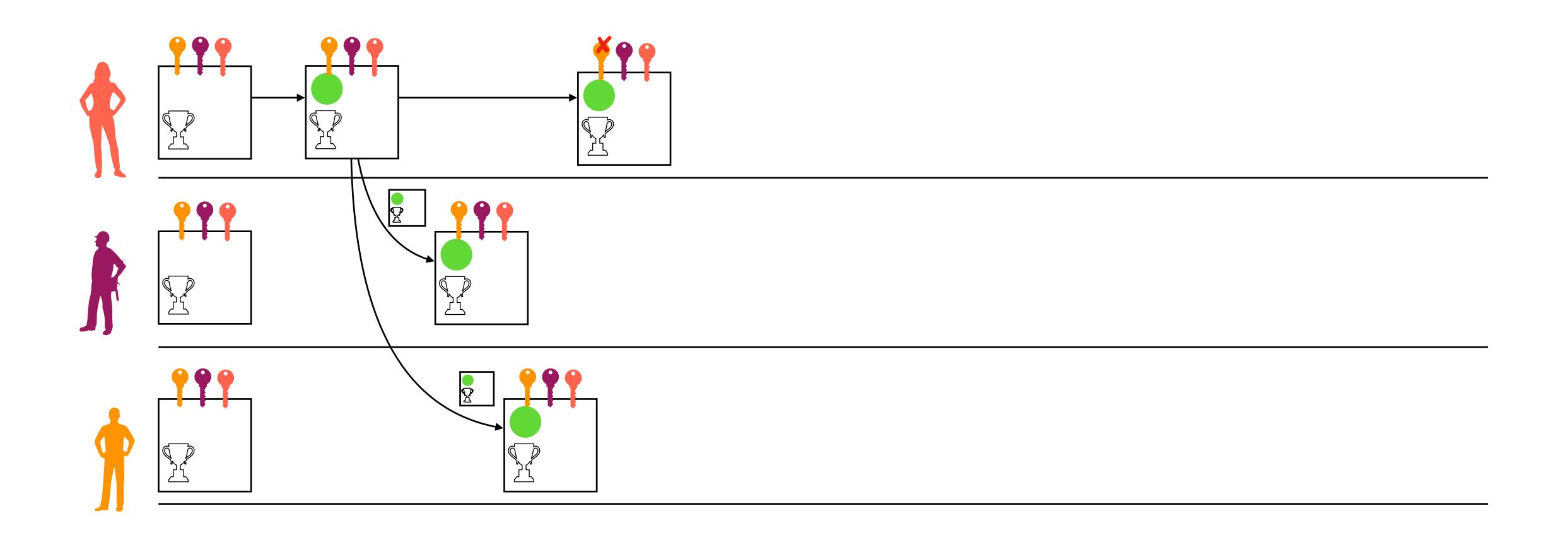






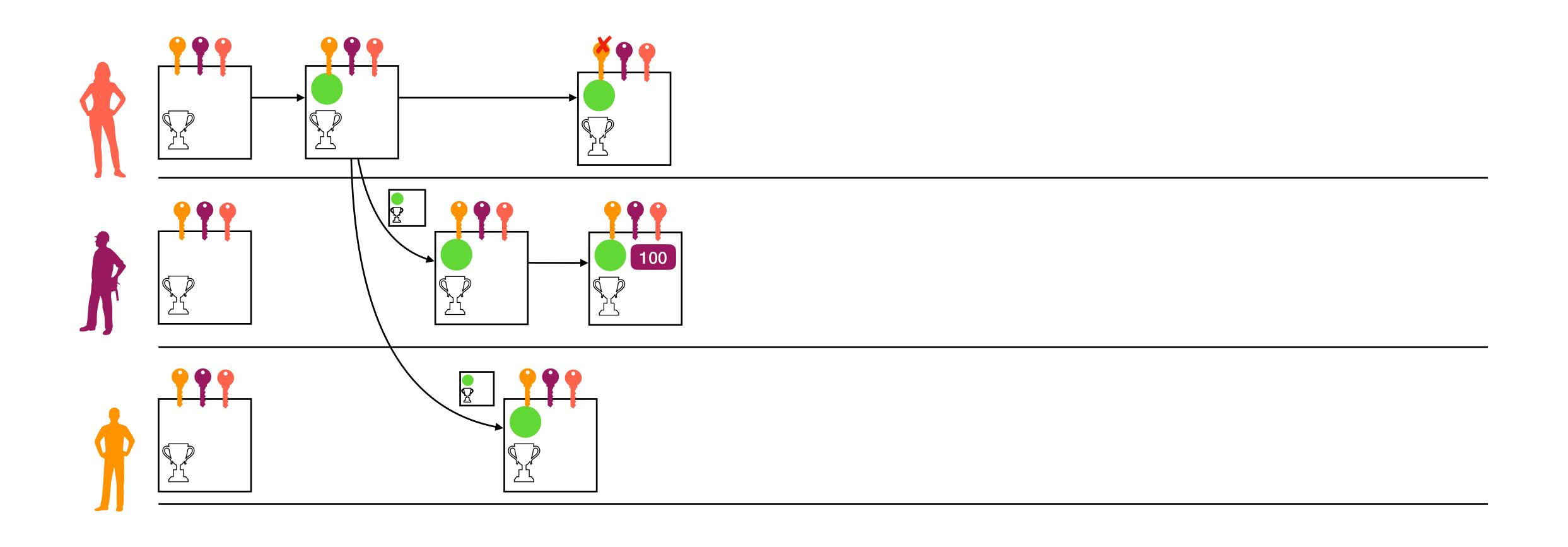






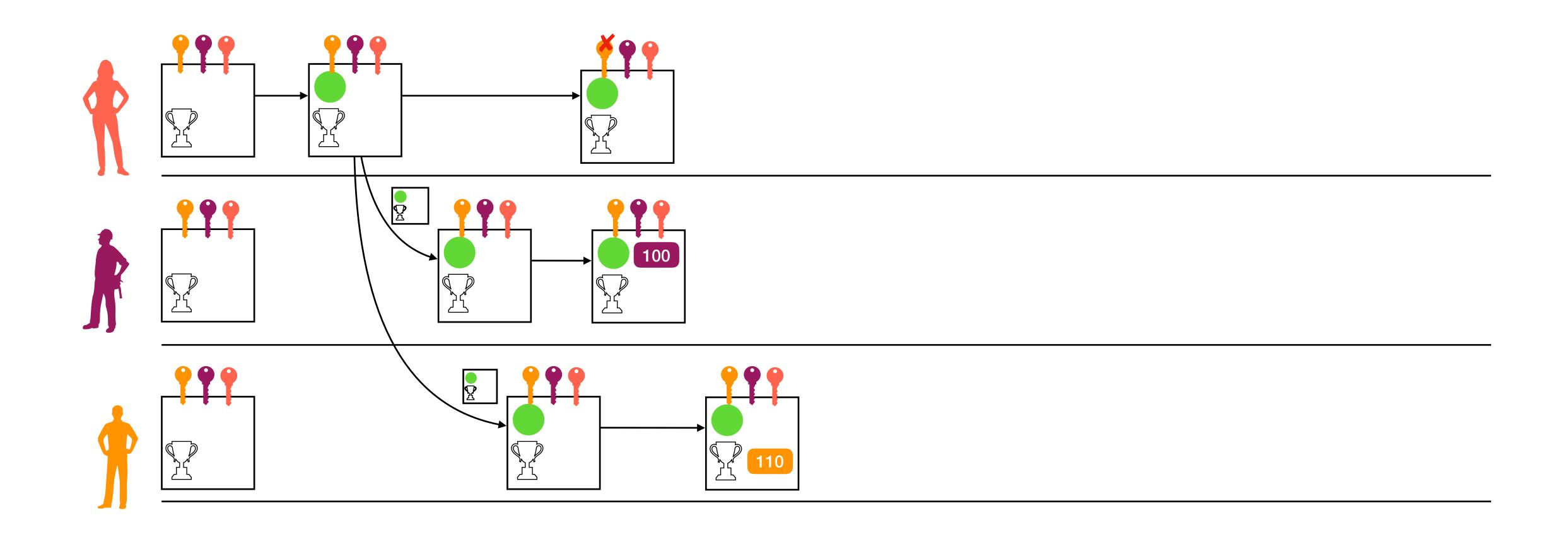






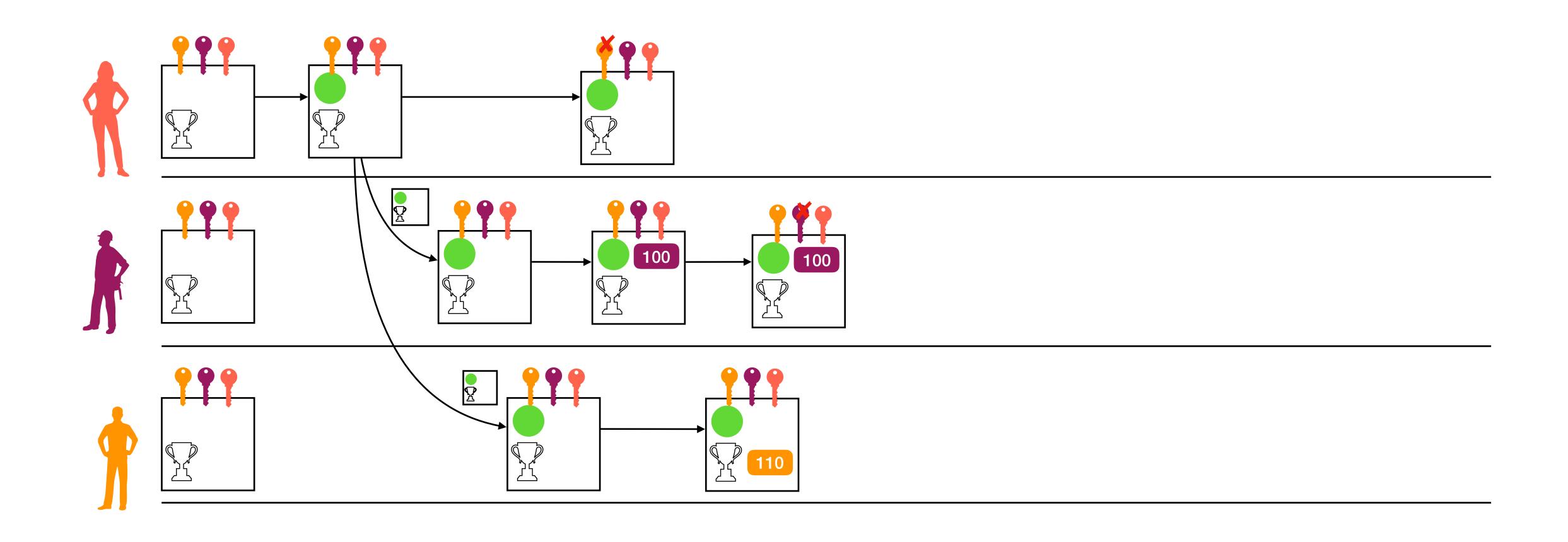




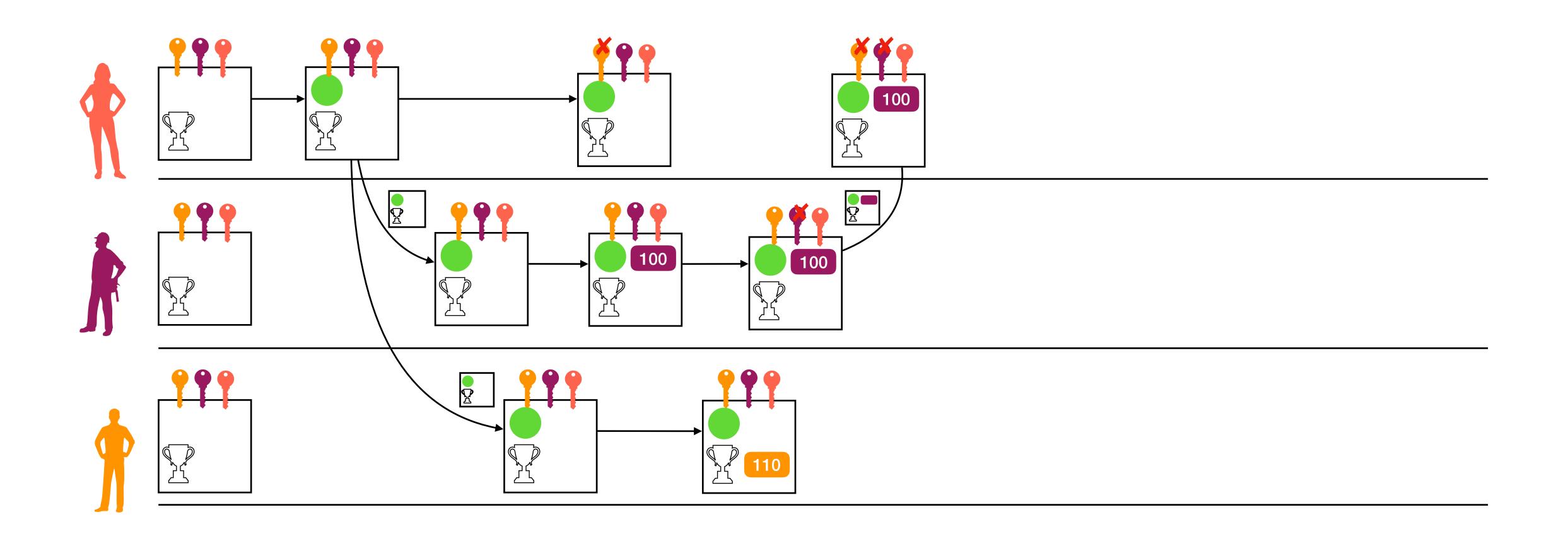






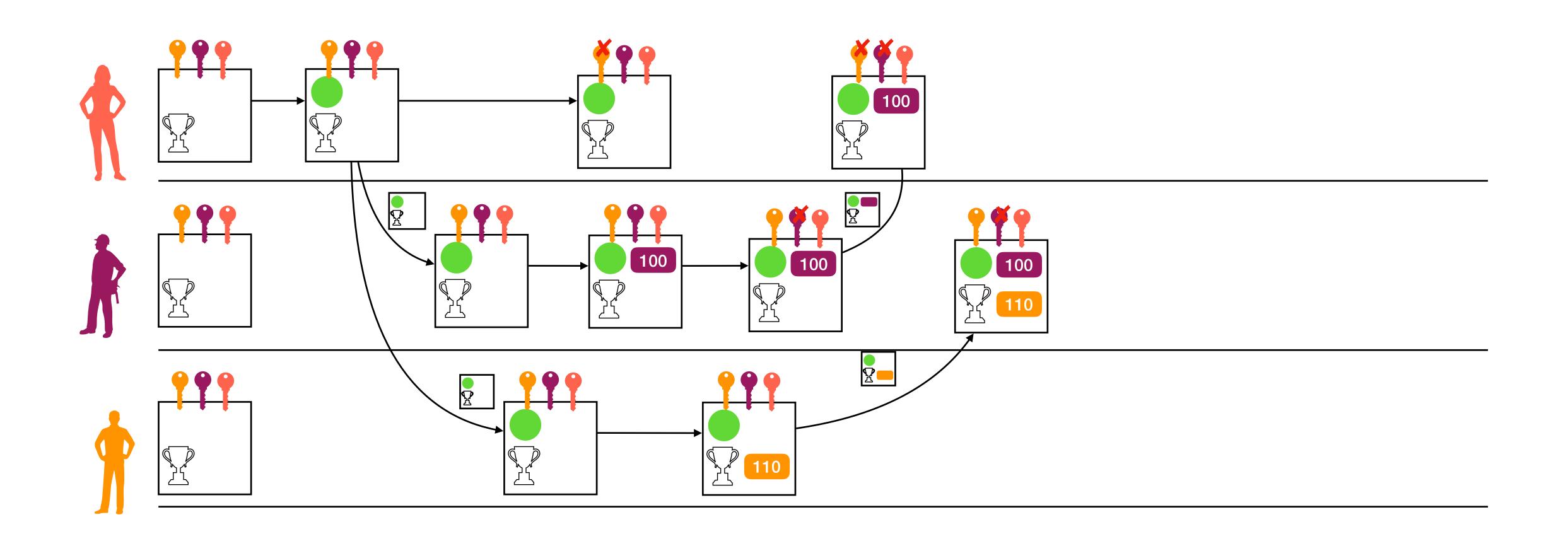






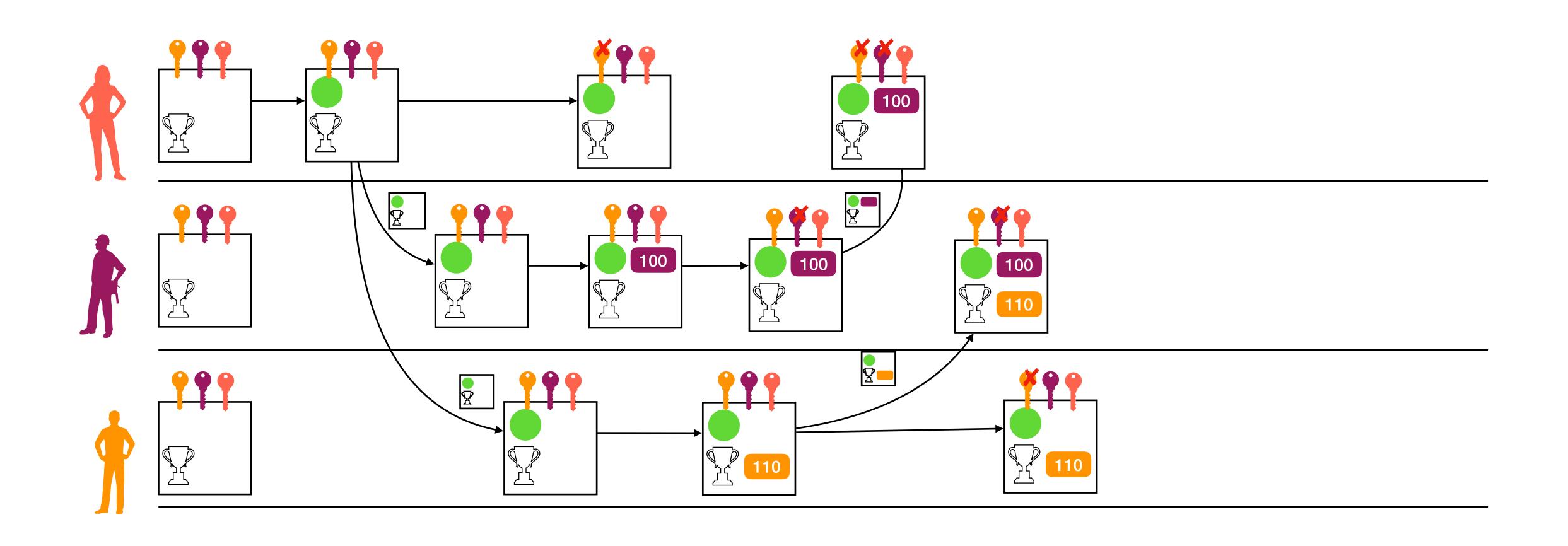






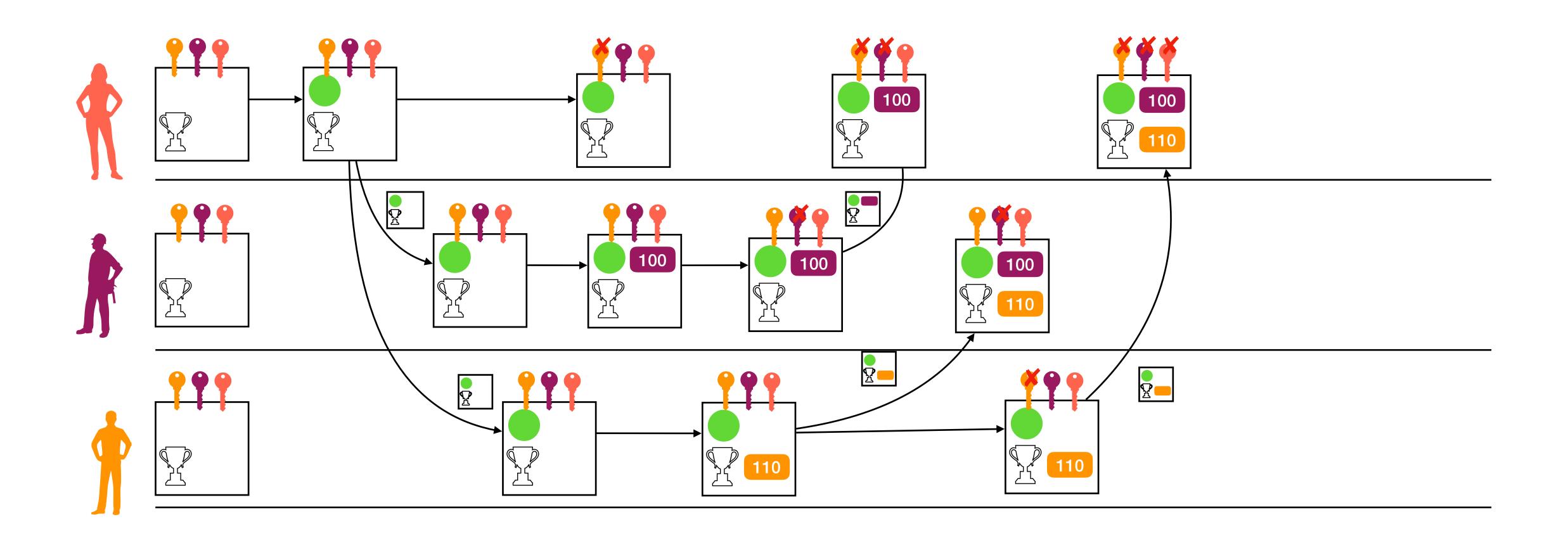






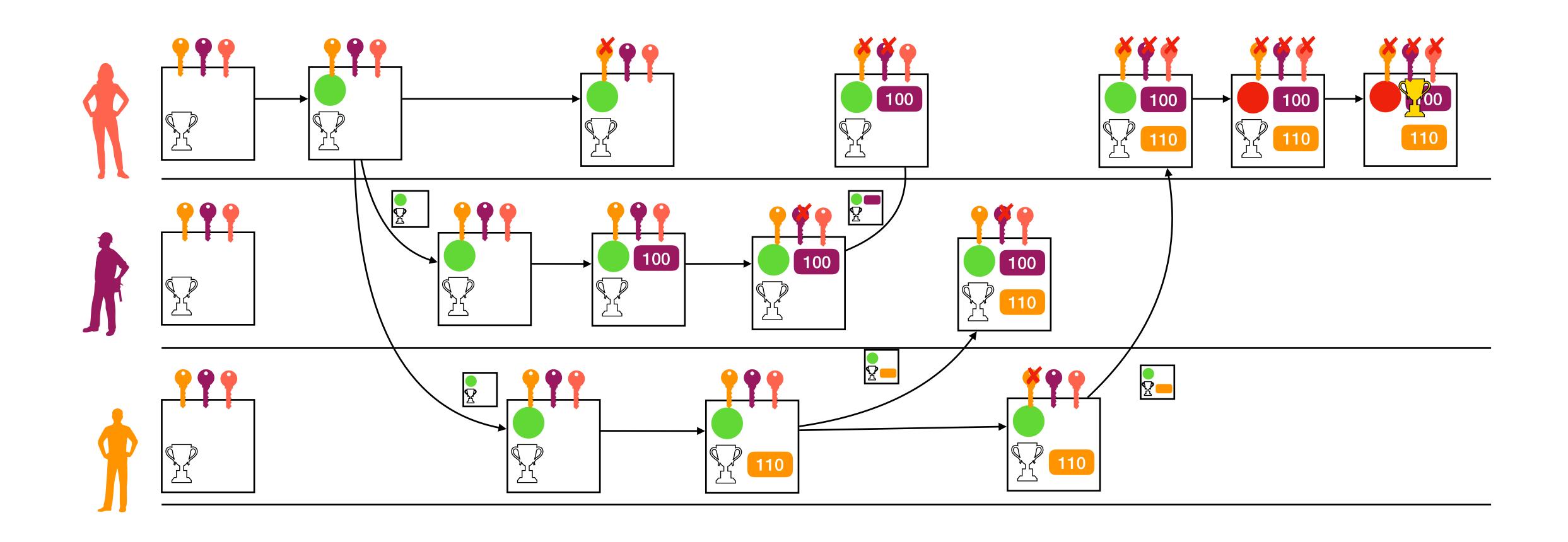
















# AUCTION IN BOOGIE

```
Invariant:
   Initial state:
      status = INVALID
                                     B.placed \Longrightarrow status \geq ACTIVE \land B.amount >0
      \land winner = \bot status \le ACTIVE \Longrightarrow winner = \bot
      ∧ ∄ b∈B, b.placed
                                     status=CLOSED \implies winner.placed \land is_highest(B, winner)
      \land \forall t \in T, t
                                     status=CLOSED ⇒ ¬T
{Premerge:
  winner=winner_0 \lor winner=\bot \lor winner_0=\bot
  \wedge B.amount = B<sub>0</sub>.amount
  \land status=CLOSED \Longrightarrow is_highest(B, winner) \land is_highest(B<sub>0</sub>, winner)
  \land status<sub>0</sub>=CLOSED \Longrightarrow is_highest(B, winner<sub>0</sub>) \land is_highest(B<sub>0</sub>, winner<sub>0</sub>)
  \wedge t.me \Longrightarrow t<sub>0</sub>.me
  \land (\neg T \land \neg b.placed) \implies \neg b_0.placed
  \land ((\forall r, r\neqme \land \negt.r) \land \negb.placed) \Longrightarrow \negb<sub>0</sub>.placed
  \wedge \neg T \implies winner_0 = winner \lor winner_0 = \bot
  \wedge T \Longrightarrow winner=\bot \wedge winner<sub>0</sub>=\bot}
merge((status, winner, B, T), (status<sub>0</sub>, winner<sub>0</sub>, B<sub>0</sub>, T<sub>0</sub>)):
   status := max(status, status_0)
   winner := if winner_0 \neq \perp then winner_0 else winner
   B.placed := B.placed \lor B_0.placed
   B.amount := B.amount
   T := T \wedge T_0
```

# TOOL SUPPORT

- Inputs:
  - Operations
  - ▶ Ordering relation ≤ for semi-lattice
  - Invariant Inv
- Derive Premerge from Inv
- ▶ Global invariants: Inv and Premerge
- Check semi-lattice: convergence
- Proofs are local to each operation
  - Boogie for (sequential) verification
- https://github.com/sreeja/soteria\_tool

```
soteria specs/auction_simple_token.spec
INFO Checking the syntax
INFO Parsing the specification
INFO Checking the well-formedness of the specification
INFO Checking convergence
INFO Checking monotonicity for procedure createAuction
INFO Checking monotonicity for procedure placeBid
INFO Checking monotonicity for procedure closeAuction
INFO Checking LUB properties of mergeprocedure
INFO Checking safety
INFO Checking whether createAuction upholds the invariant
INFO Checking whether placeBid upholds the invariant
INFO Checking whether closeAuction upholds the invariant
INFO Checking whether merge upholds the invariant
INFO Checking whether createAuction upholds the precondition of merge
INFO Checking whether placeBid upholds the precondition of merge
INFO Checking whether closeAuction upholds the precondition of merge
INFO Checking whether merge upholds the precondition of itself
INFO The specification is safe!!!
```

#### CONCLUSION

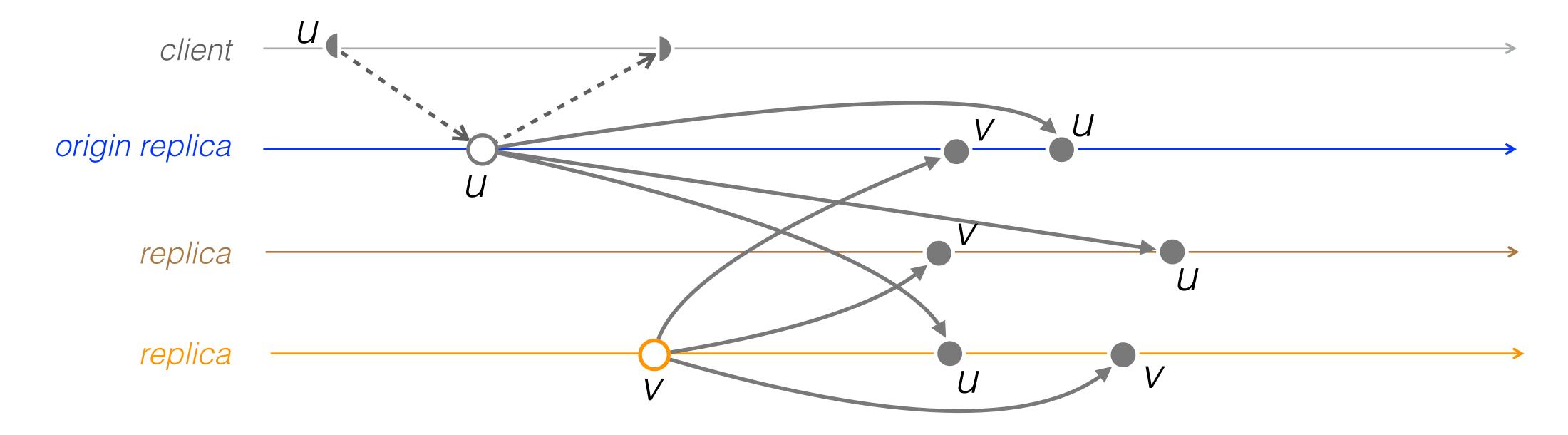
- Modular verification of State-based CRDT applications
- Soteria: Tool support based on Boogie
- WIP: Concurrency Control synthesis (recommendations)

#### OPERATION-BASED CRDTs

- Operation-based CRDTs
  - Each operation is delivered to each replica

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- Operation-based CRDTs
  - Each operation is delivered to each replica
- Invariant Checking (CISE)
  - Requires causal delivery

