

# Specification And Implementation Of Replicated Data Types

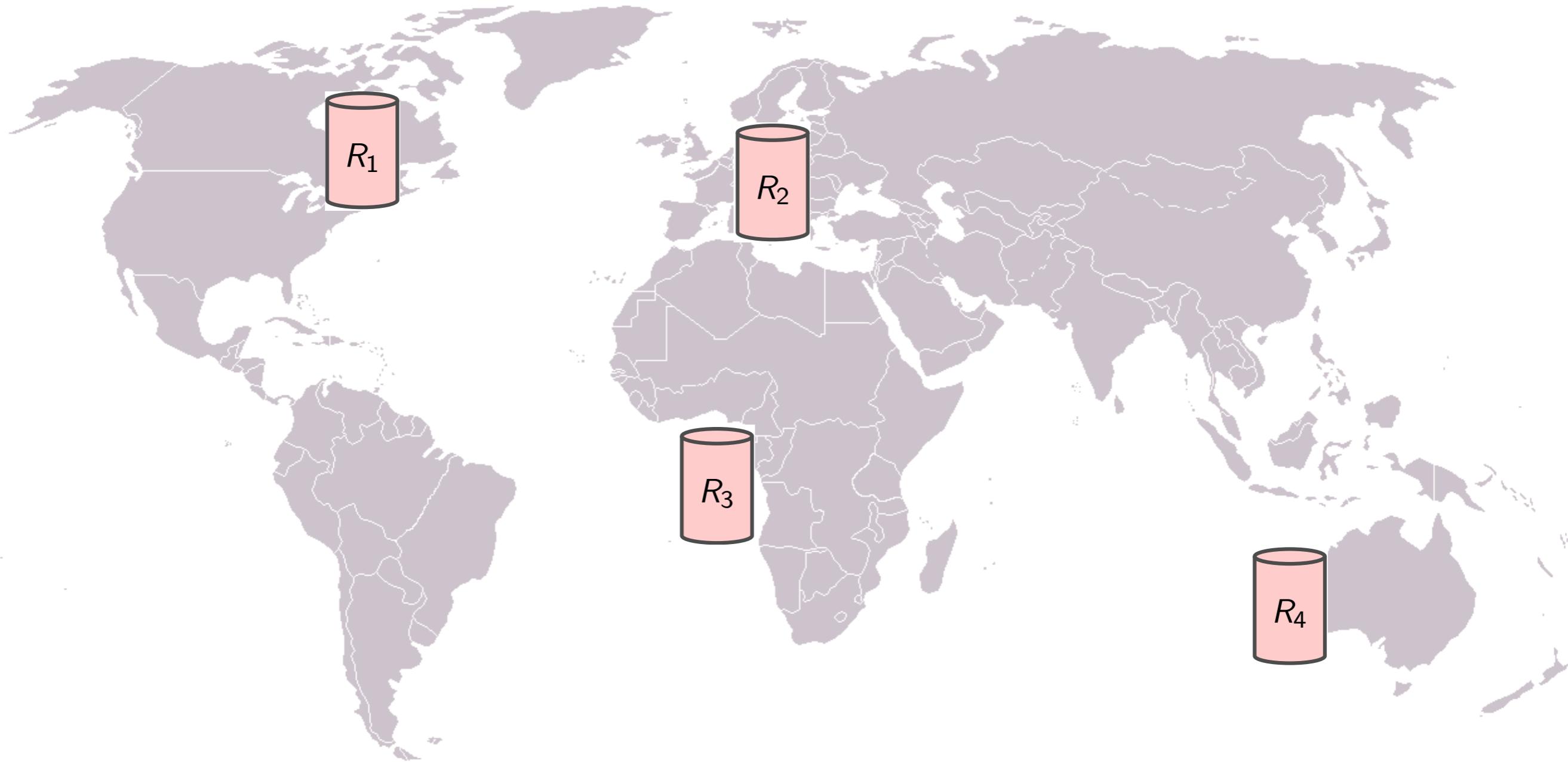
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Fabio Gadducci

joint work with Hernán Melgratti, Christian Roldán, and Matteo Sammartino

# The setting: replicated data stores

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# Quickest background, 1

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- Distributed systems replicate their state over different nodes in order to satisfy non-functional requirements.
- *Strong consistency* (every request receives the most recent update) of replicated data is in conflict with *availability* (every request is eventually executed) and tolerance to network *partitions* (the system operates even in the presence of failures that prevent communication among components).
- CAP theorem: it is impossible to simultaneously achieve strong Consistency, Availability and Partition tolerance.

# CAP Theorem [Gilbert&Lynch,2002]

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- It is impossible to simultaneously achieve
  - Consistency (read the latest written value):
    - Single system image (SSI)/linearizability
    - Availability (always-accessible)
      - Low latency
    - Partition-tolerance (partial failures)

*We should cope with weaker notions of consistency*

# Quickest background, 2

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- Weak consistency: replicas may (temporarily) exhibit discrepancies (every request receives a correct update).
- How are the data specified? States, state transitions and returned values should account for the different views that a data item may simultaneously have.
- In the end, consistency has to be *eventually* guaranteed (if no new updates are made to a data item, eventually all accesses to that item will return the most recent update).

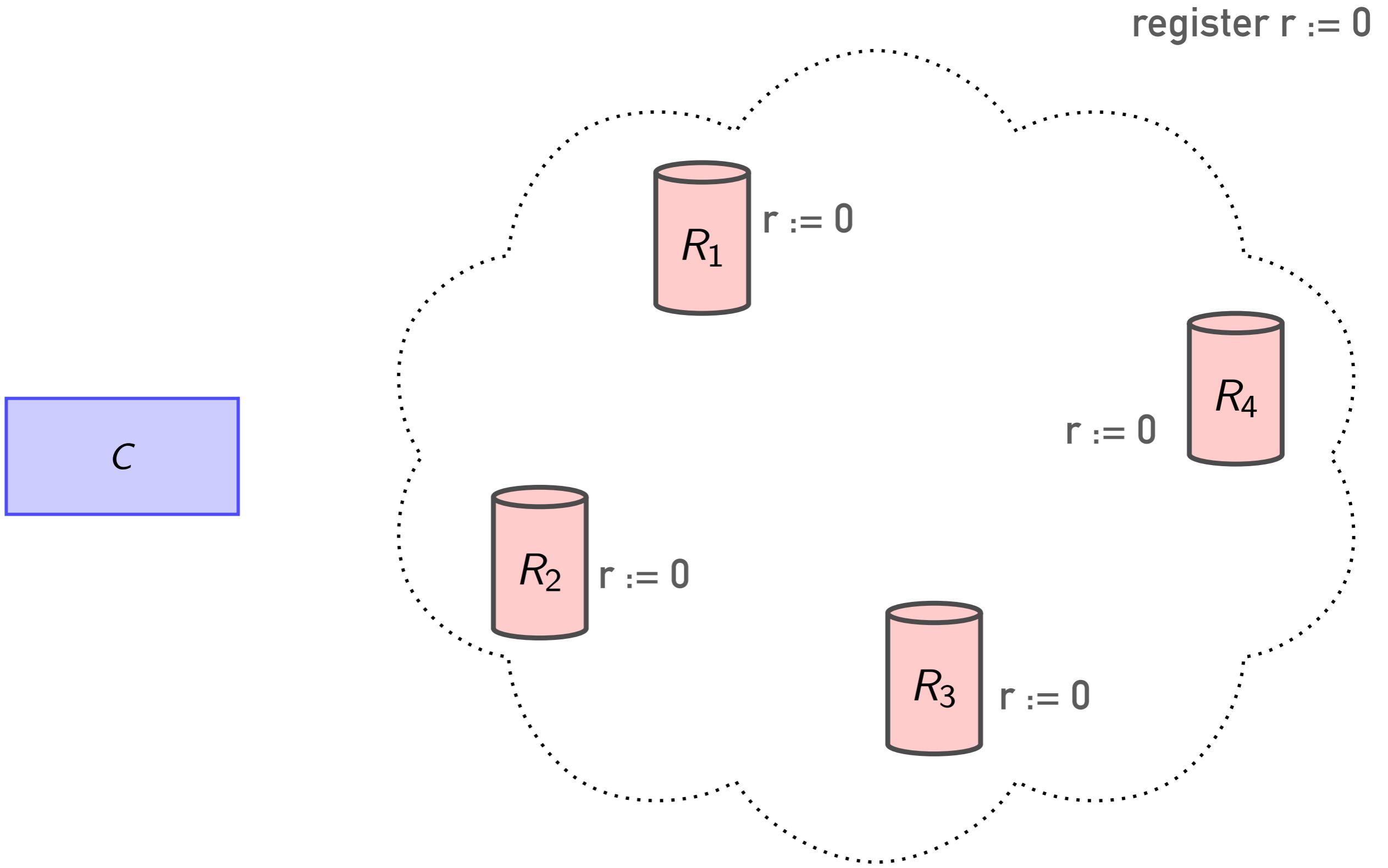
# Replicated Data Types (RDTs)

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- Suitable abstractions to deal with replication
- As customary, we are interested in the
  - *specification*,
  - *implementation*, and
  - *checking of implementation correctness*
- Goal: to frame these notions in an algebraic setting

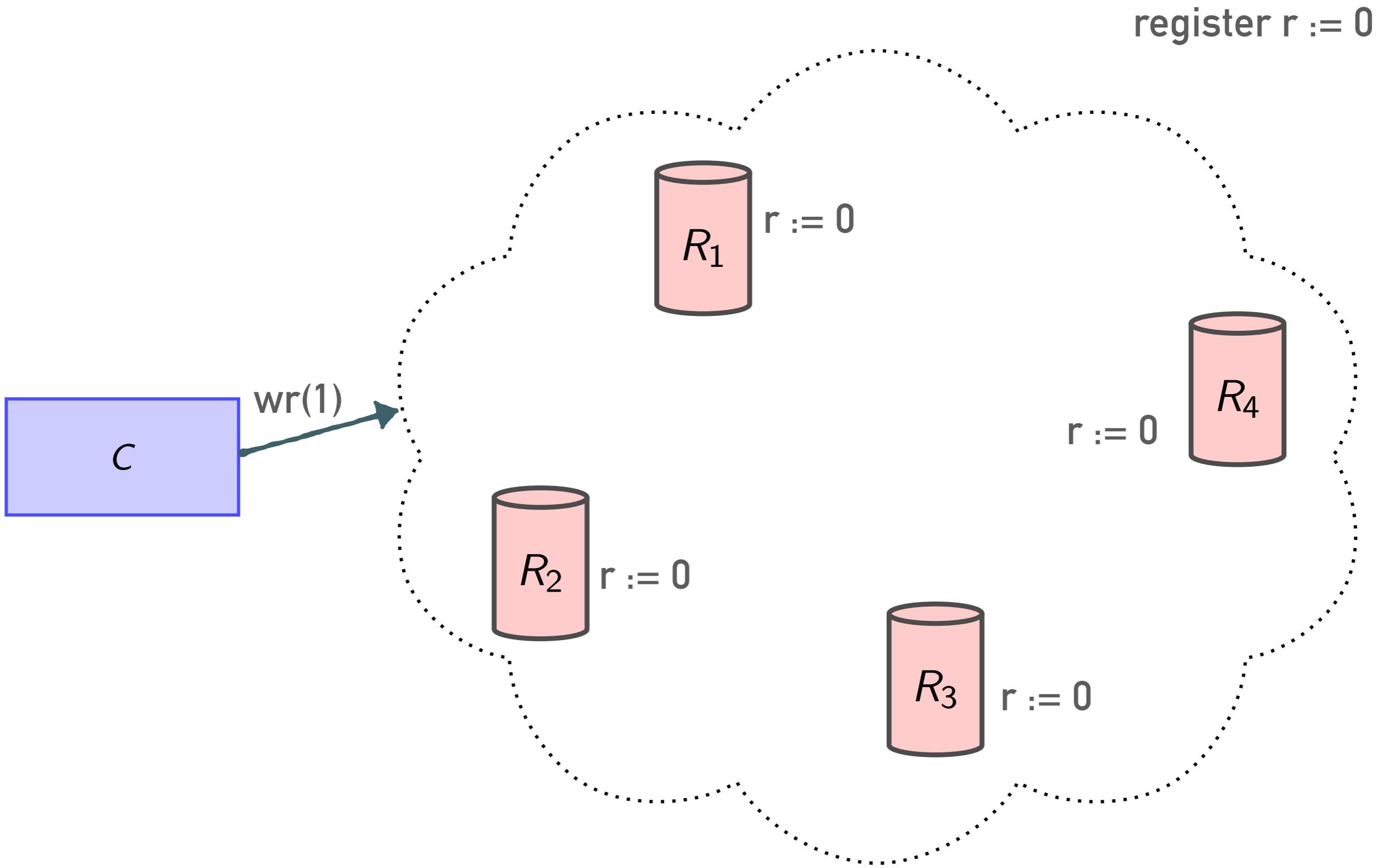
# A Replicated Register

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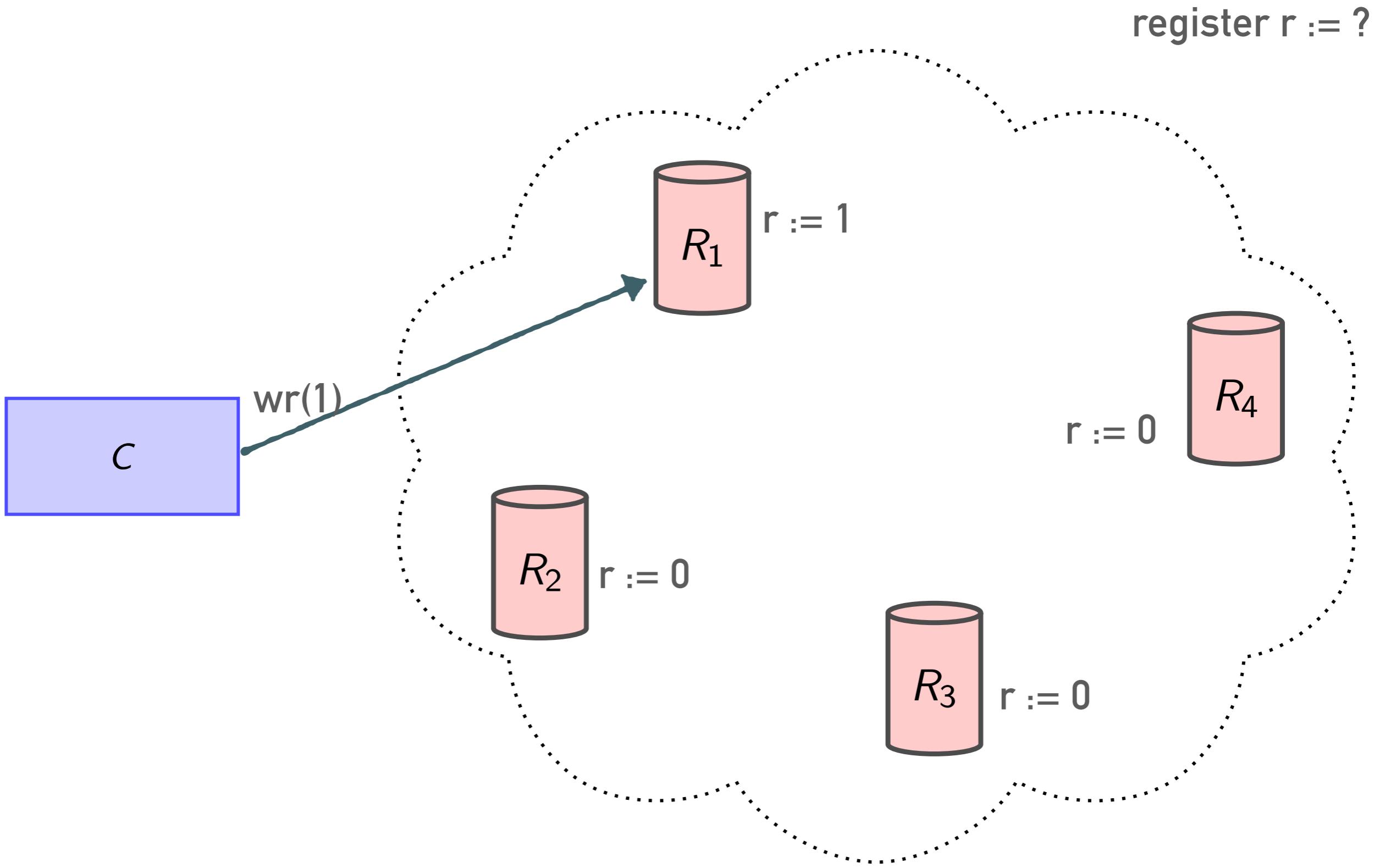
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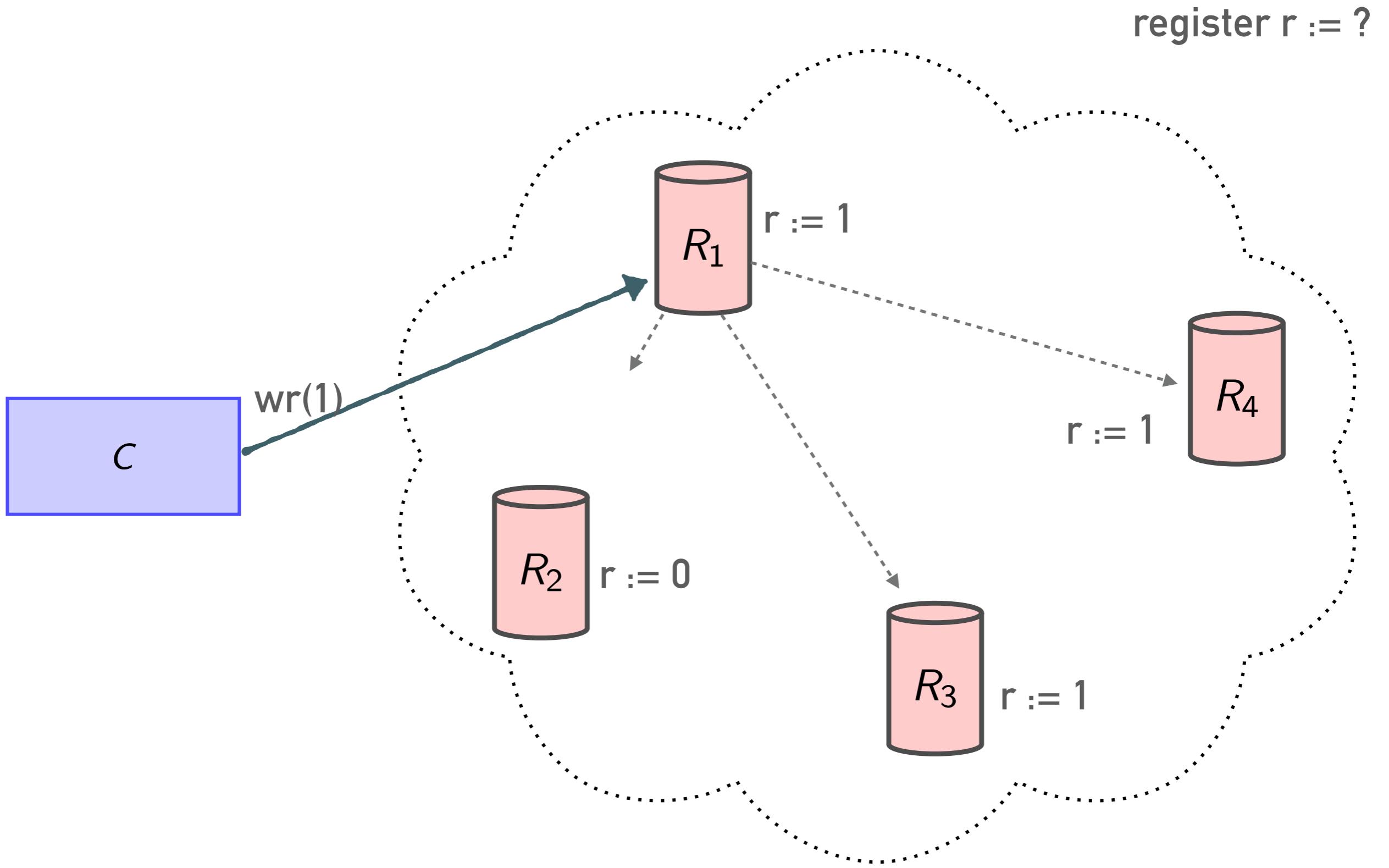


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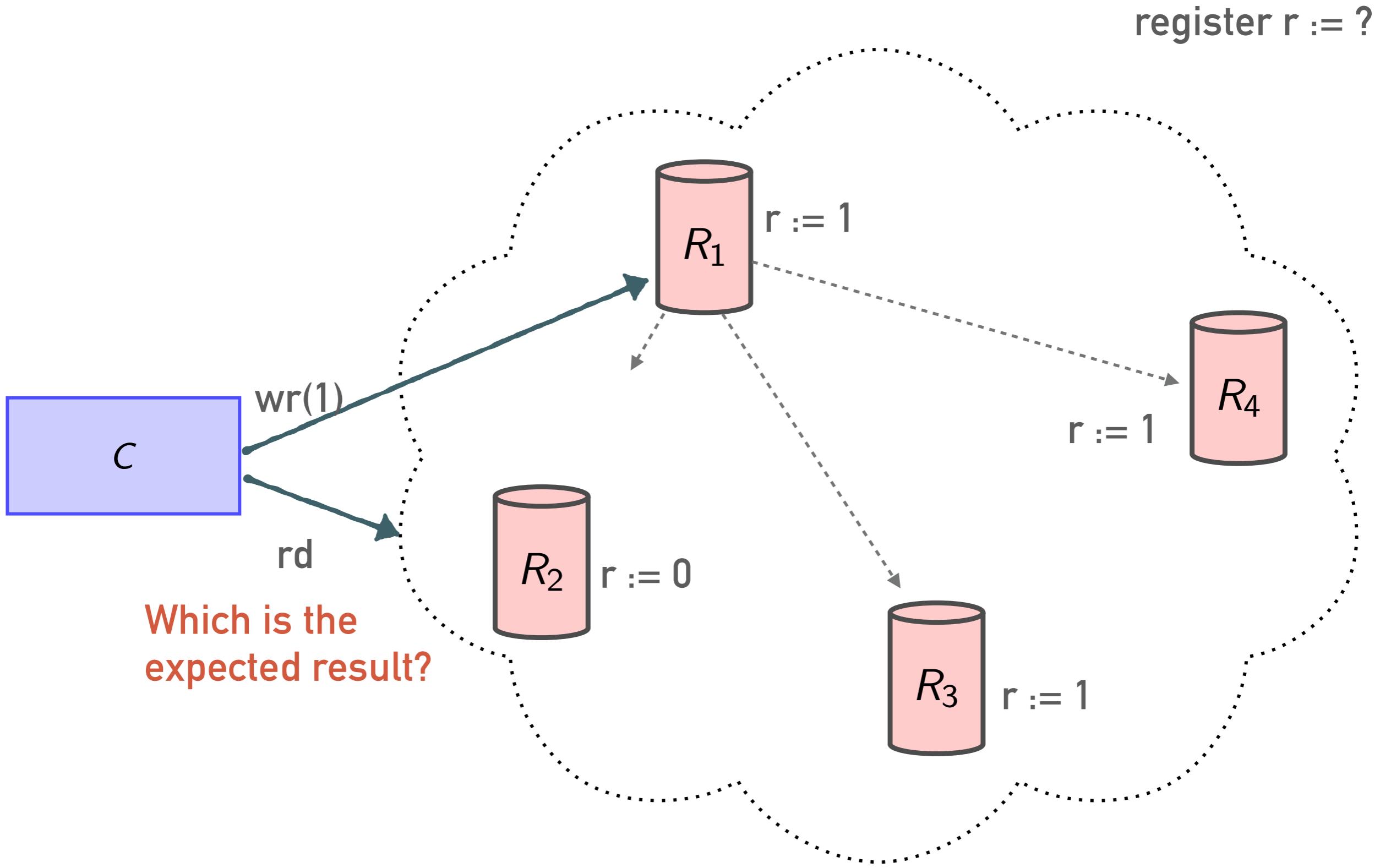
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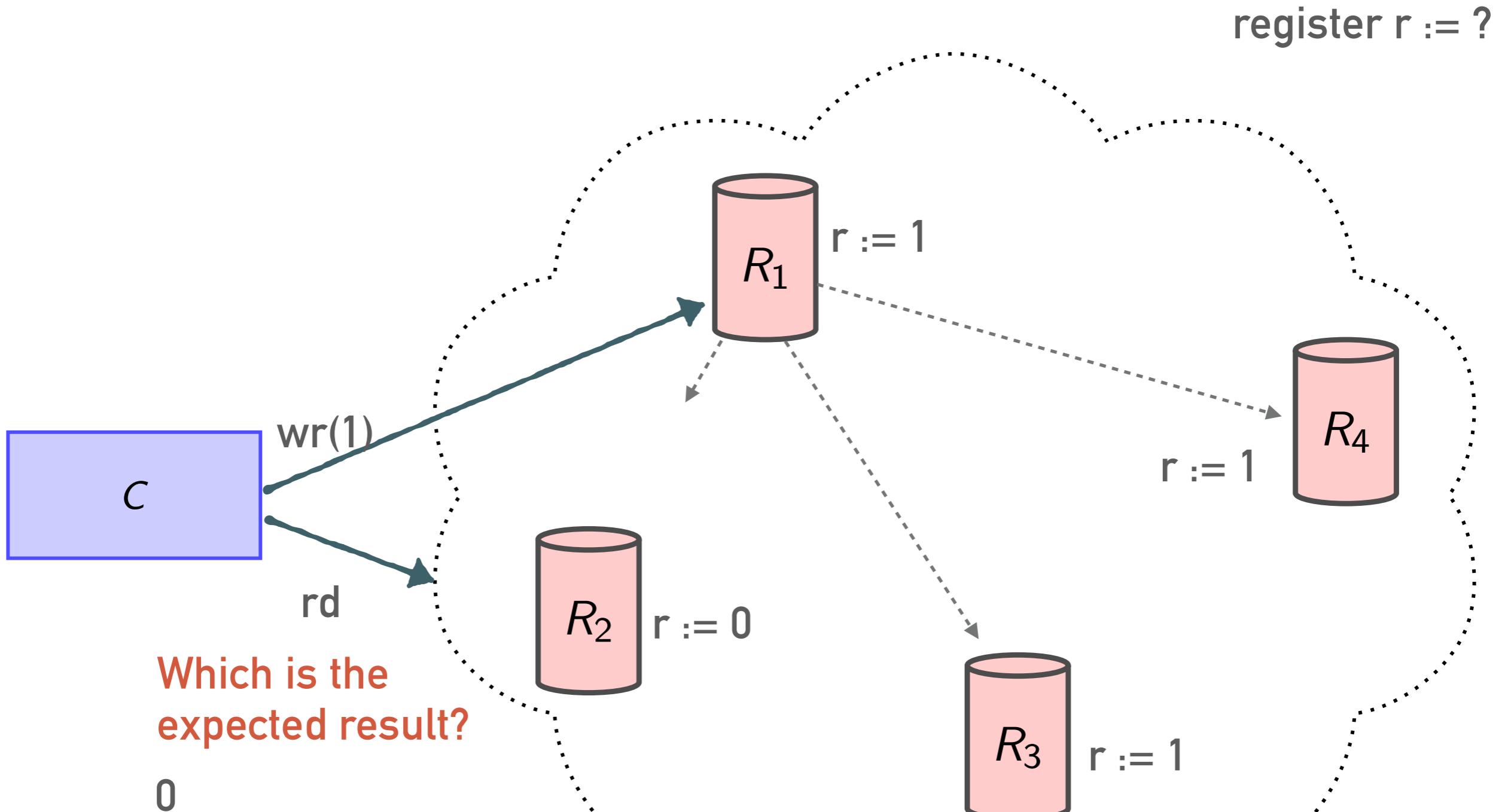
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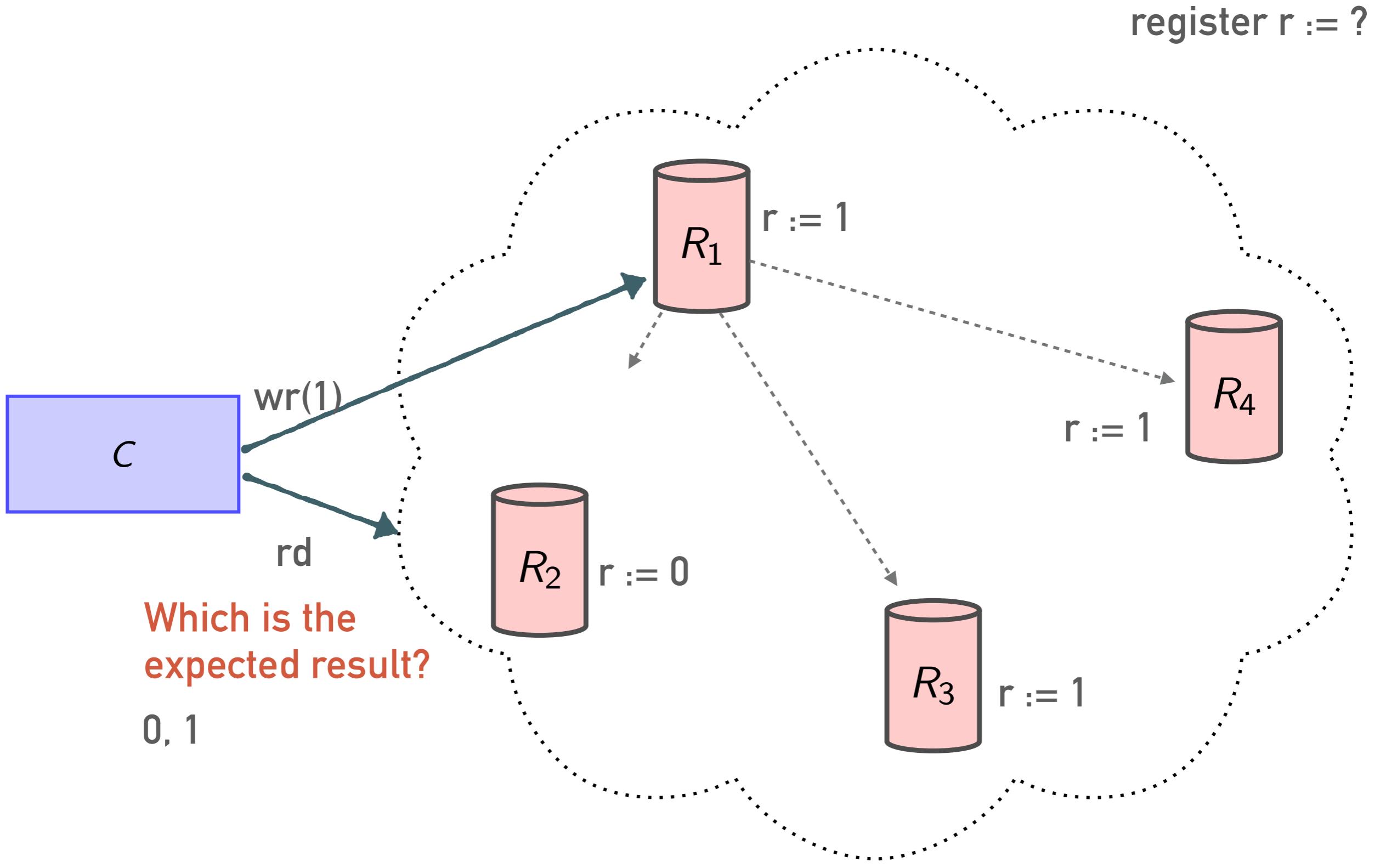
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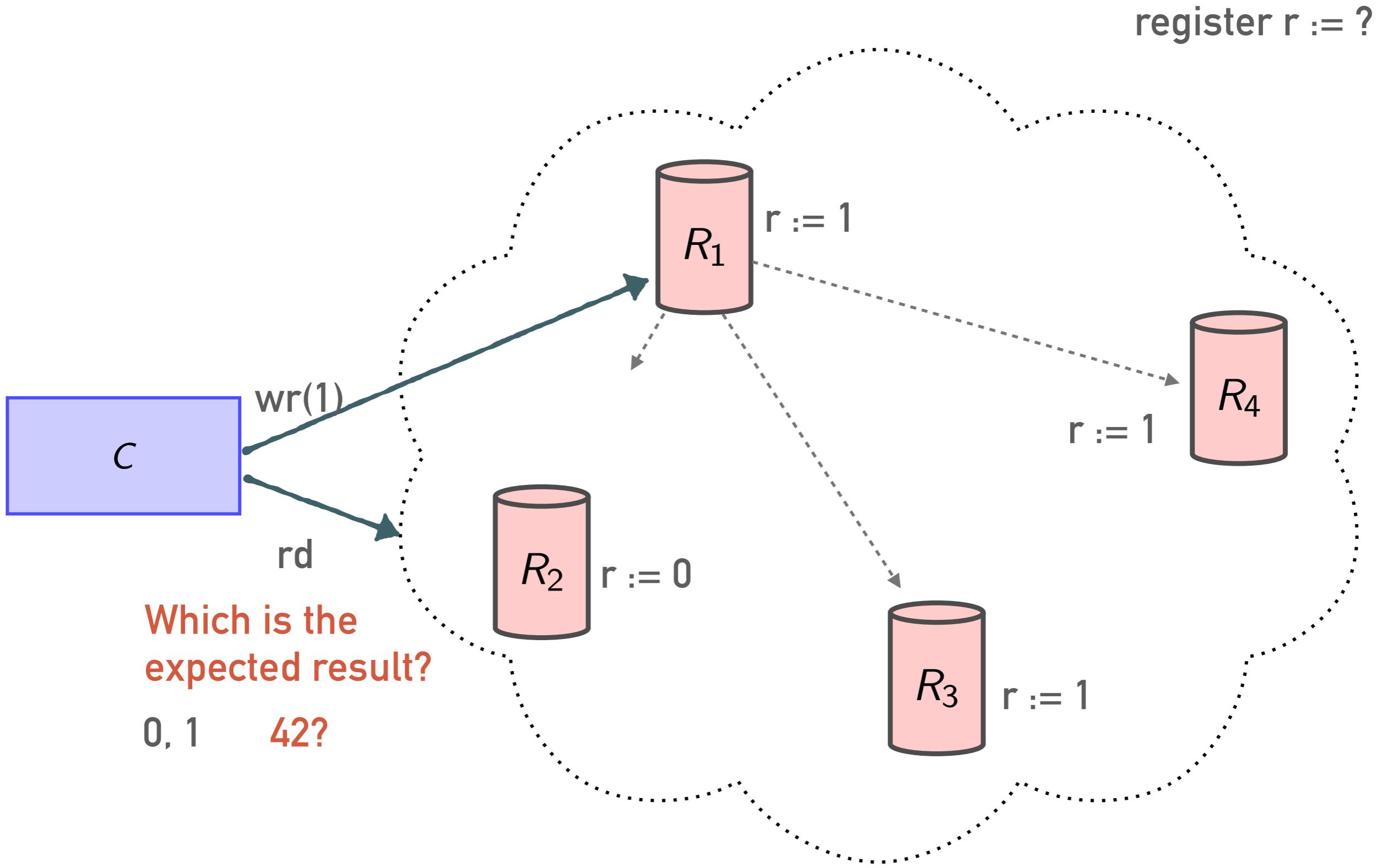
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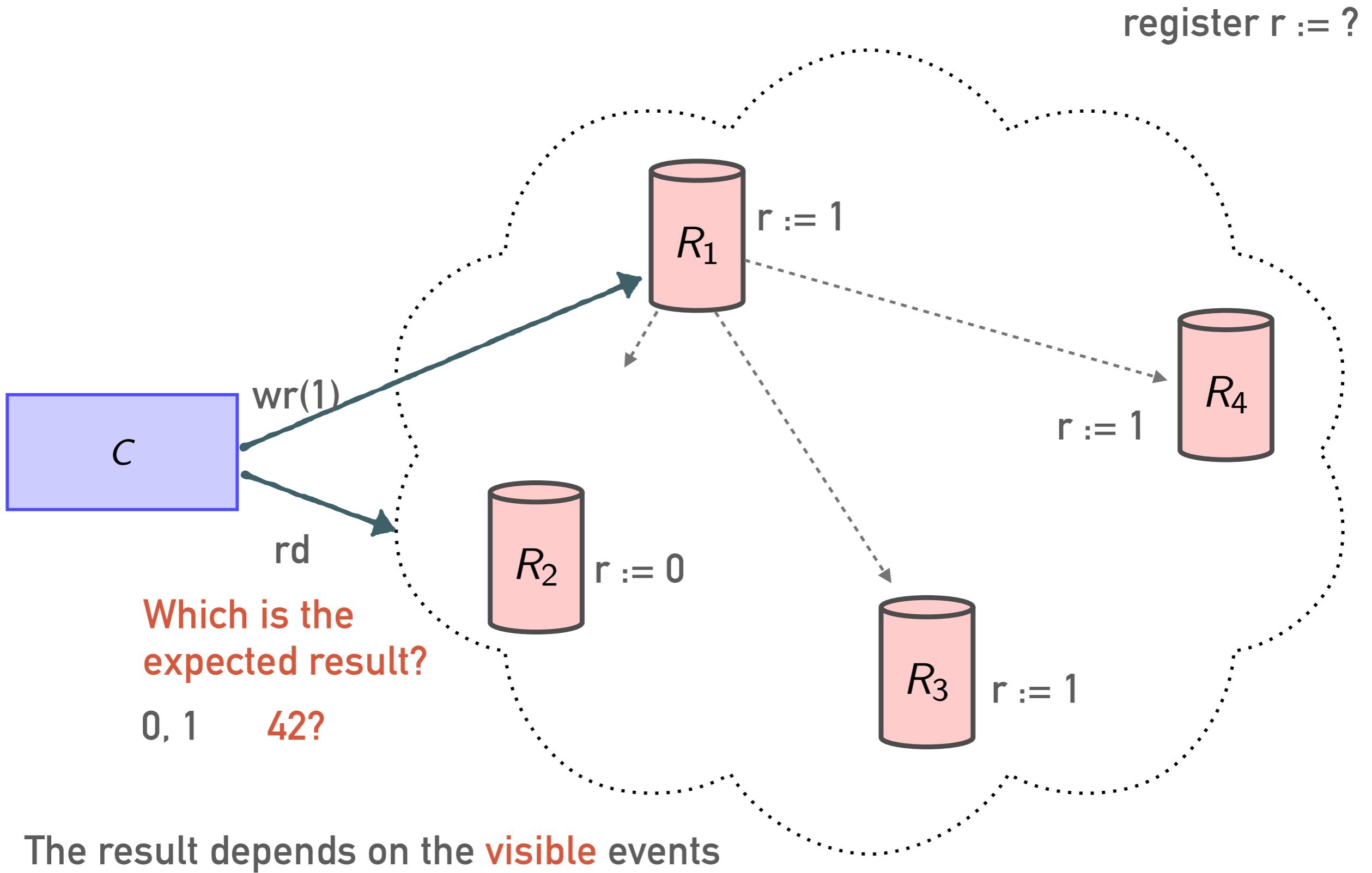
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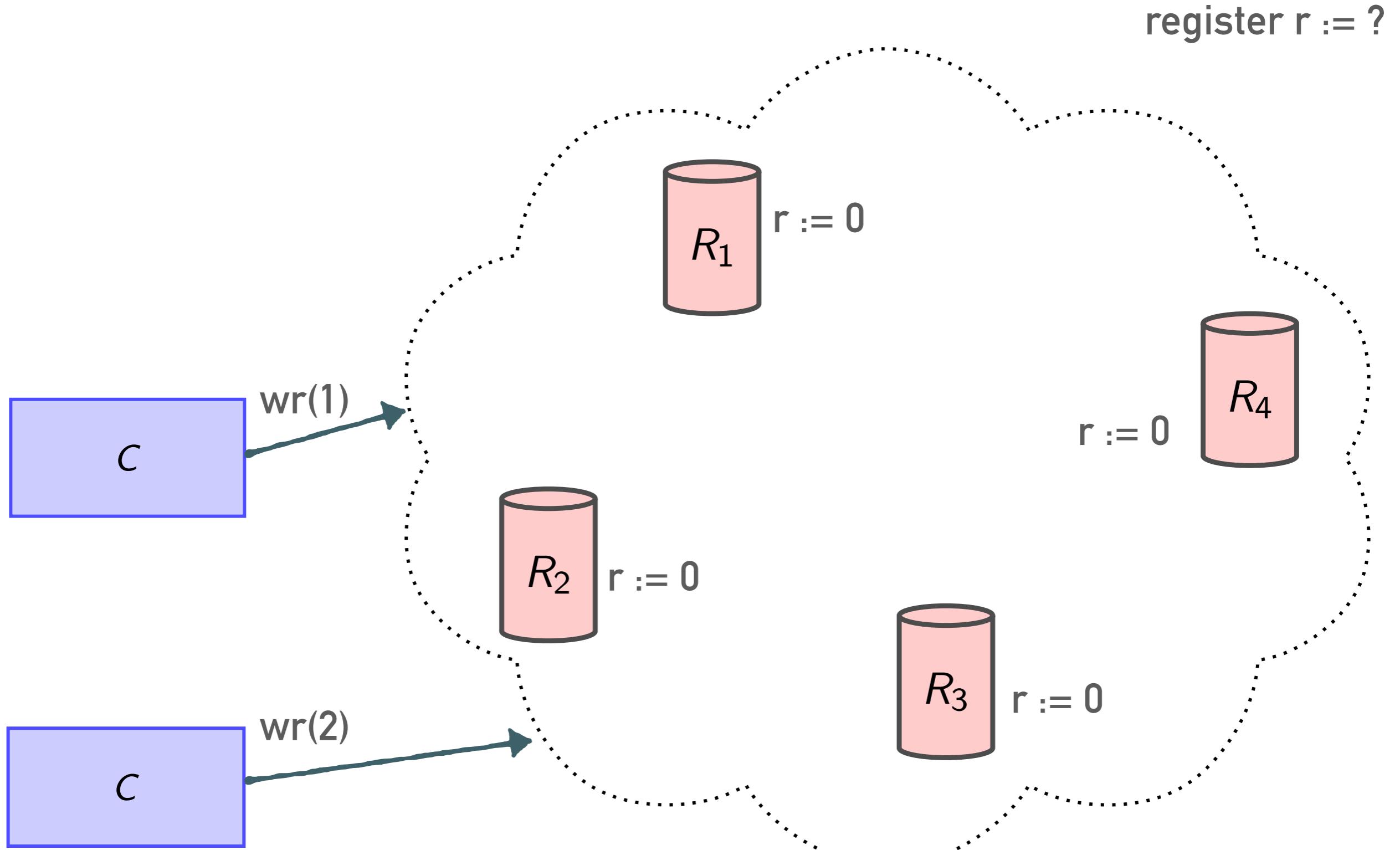
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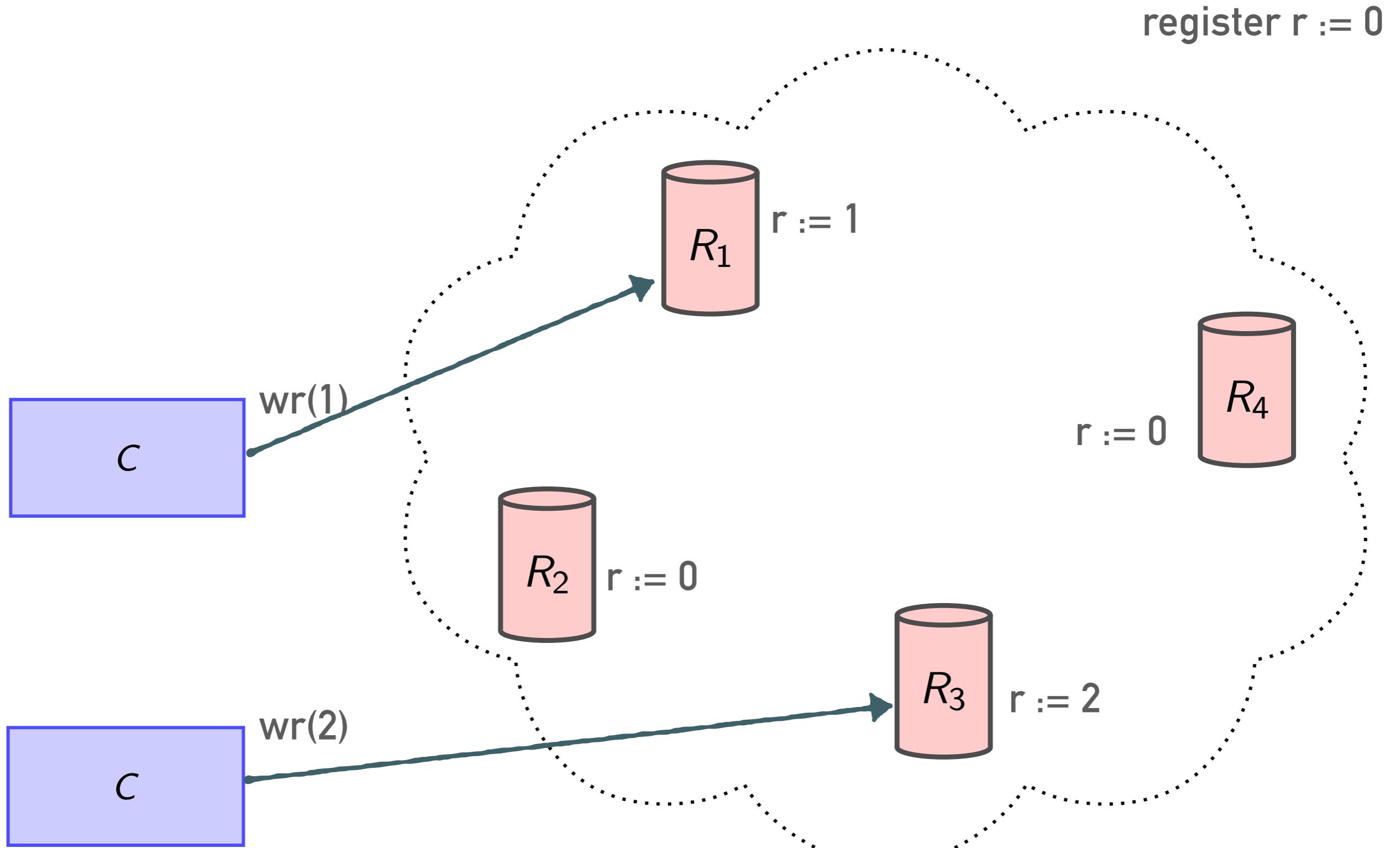
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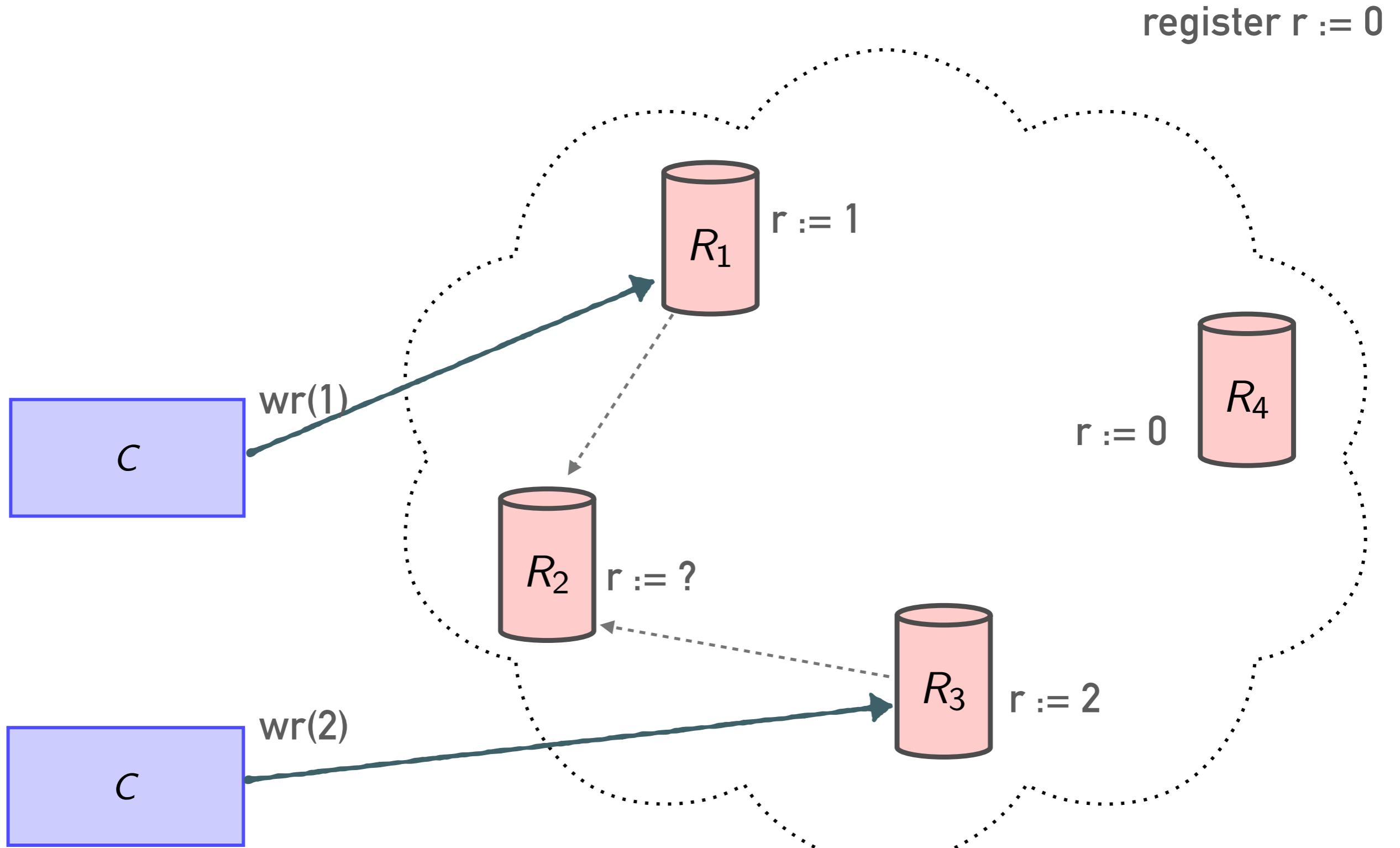
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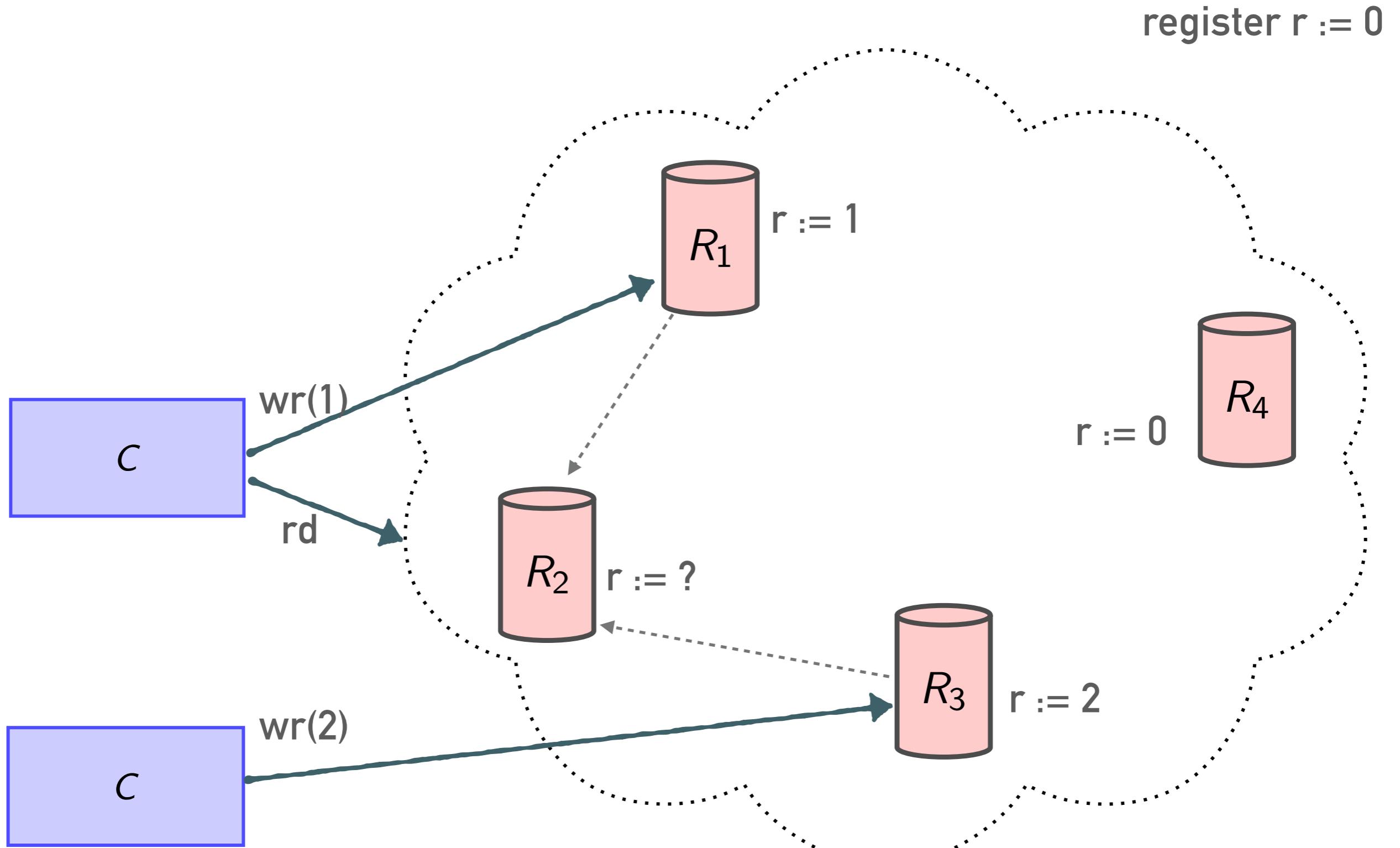
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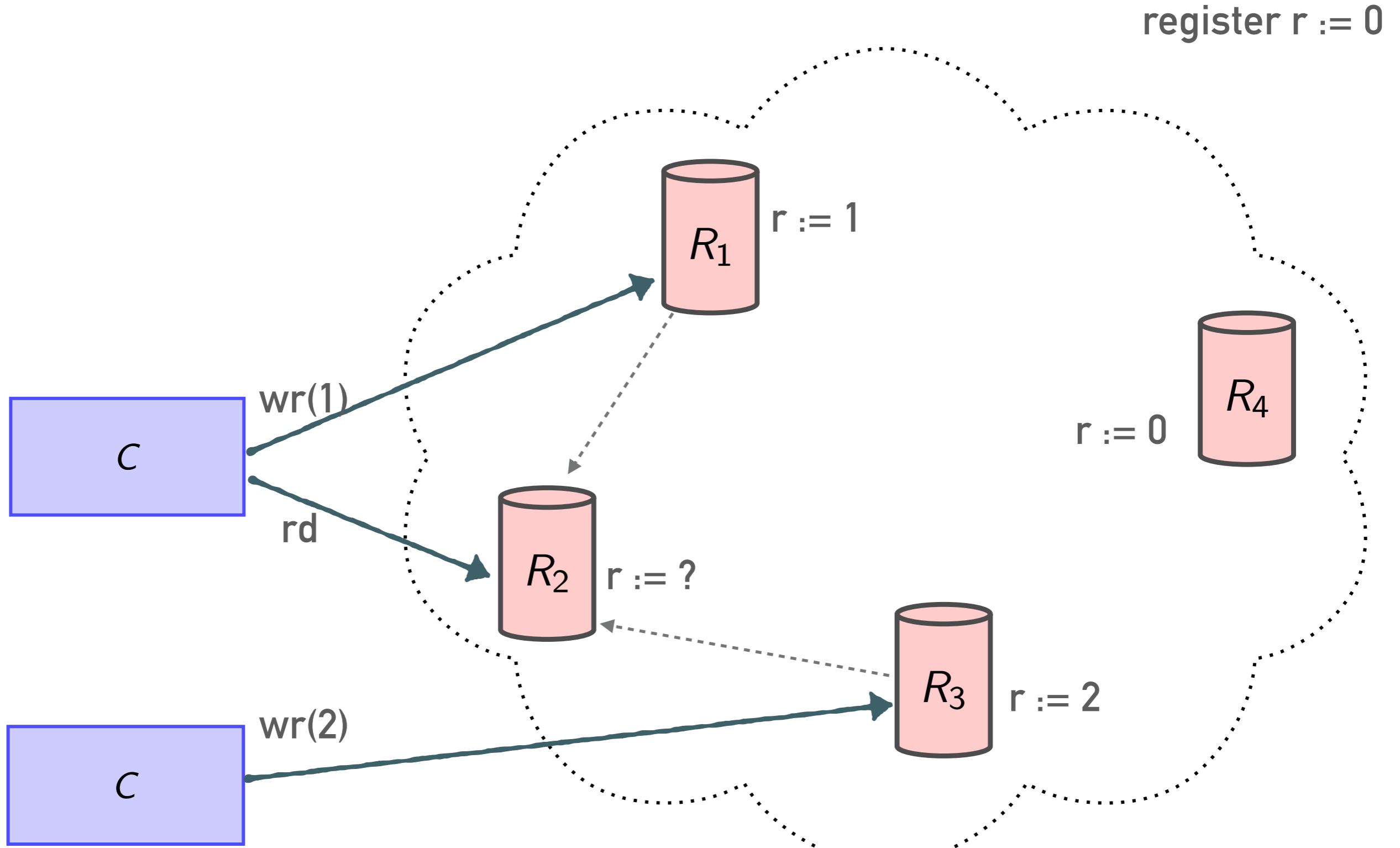
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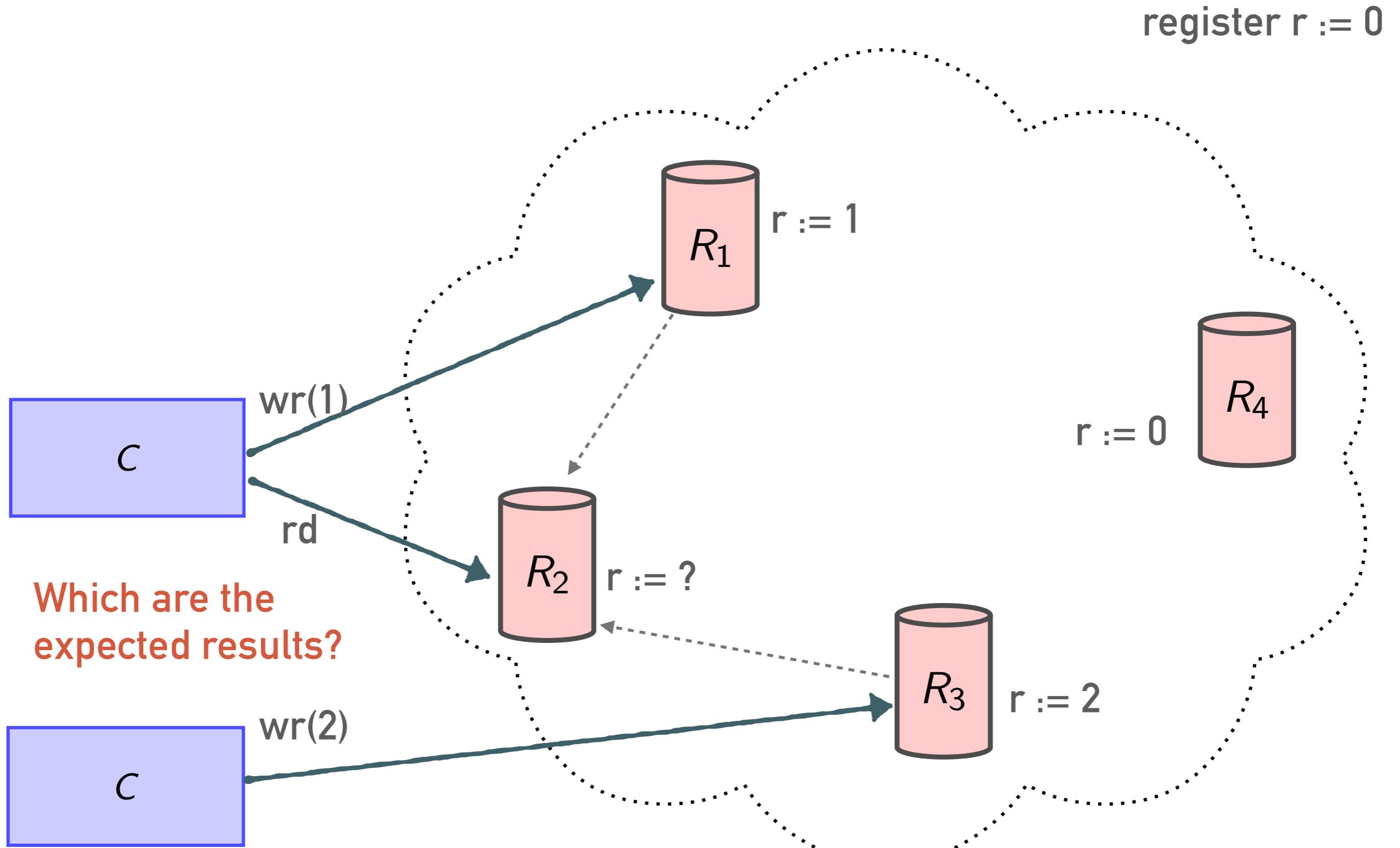
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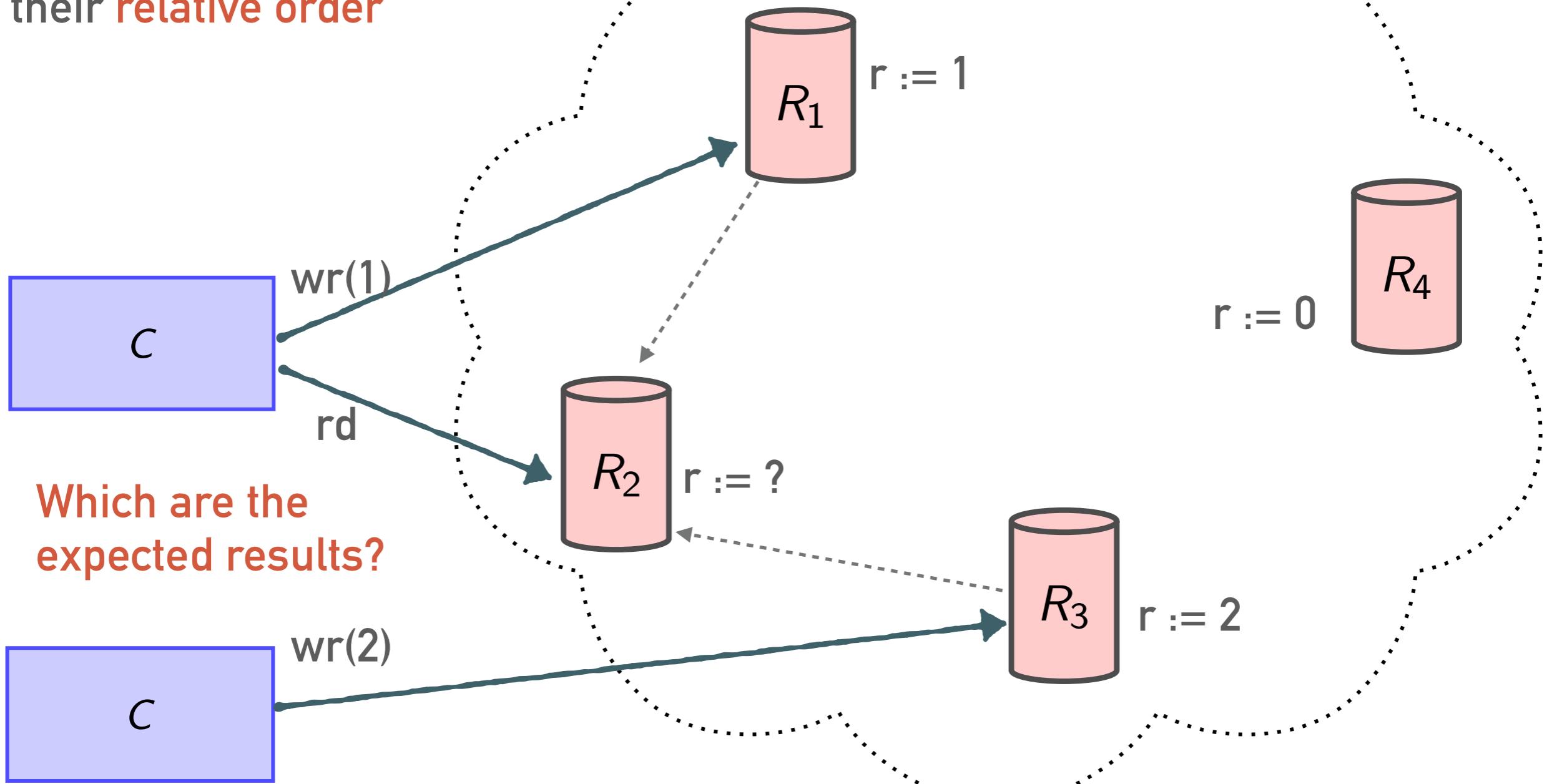


# A Replicated Register



# A Replicated Register

It depends on the  
**visible events** and  
their **relative order**



# Specifying RDTs... classically

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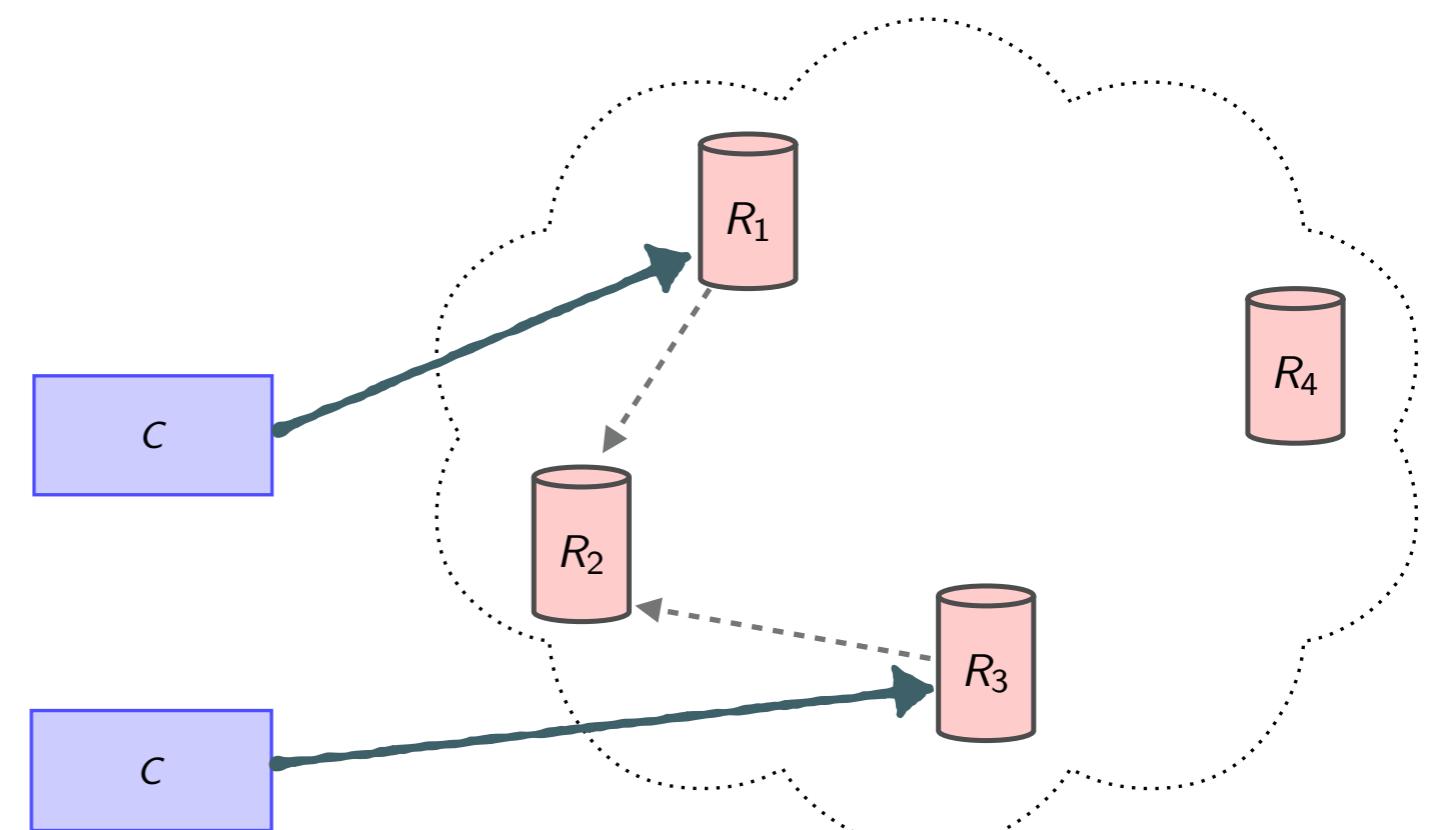
- $\text{op} : \text{VIS} \times \text{ARB} \rightarrow \text{RVAL}$
- **VISibility:** A partial order of operations over a replica
- **ARBitration:** A total order of such operations
- **Return VALue:** The value returned by the last operation

[BURCKHARDT, GOTSMAN, YANG, ZAWIRSKI 2015]

# A replicated register

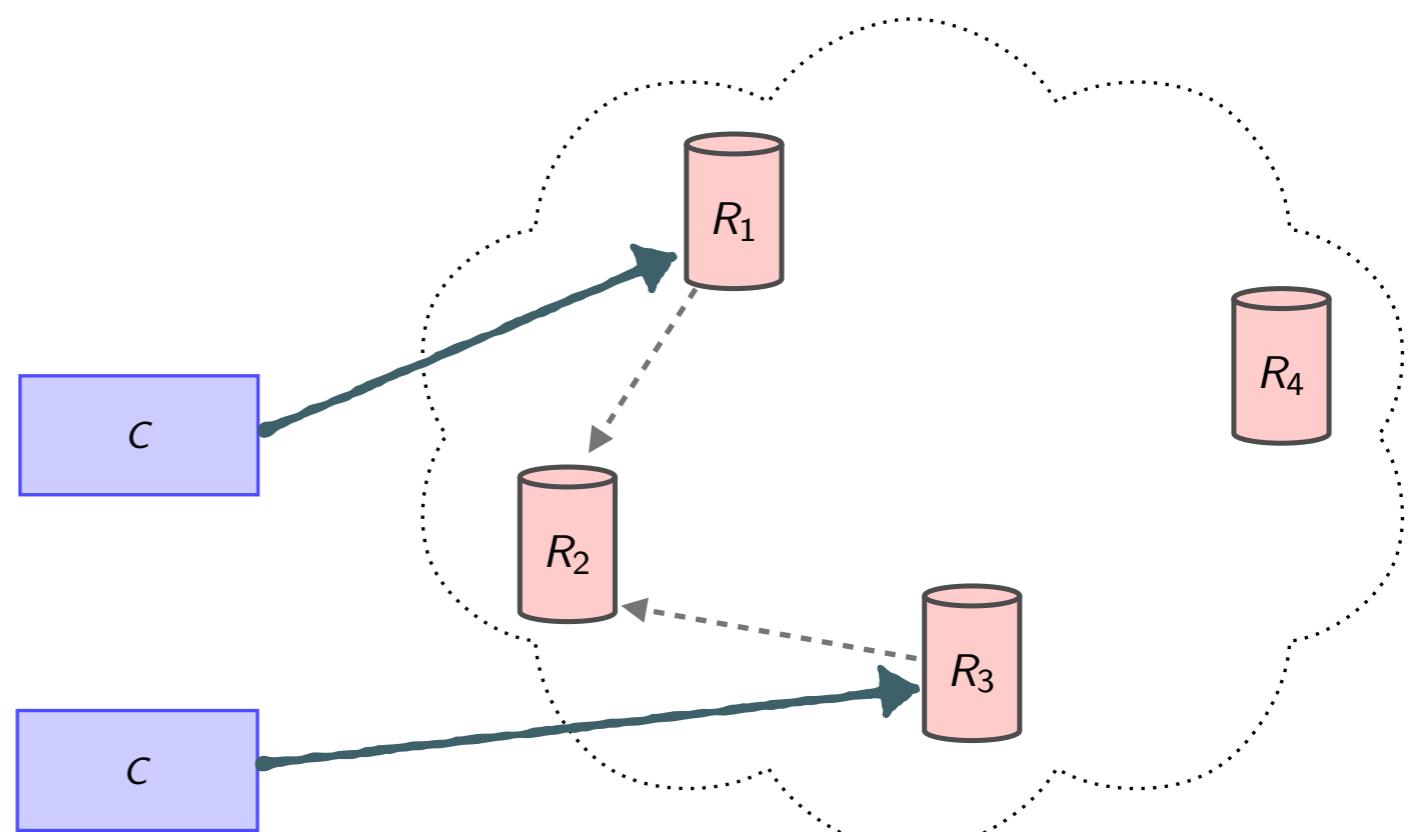
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- Two operations
  - $\text{rd}(\_, \_) = ?$
  - $\text{wr}(k)(\_, \_) = \text{ok}$



# A replicated register

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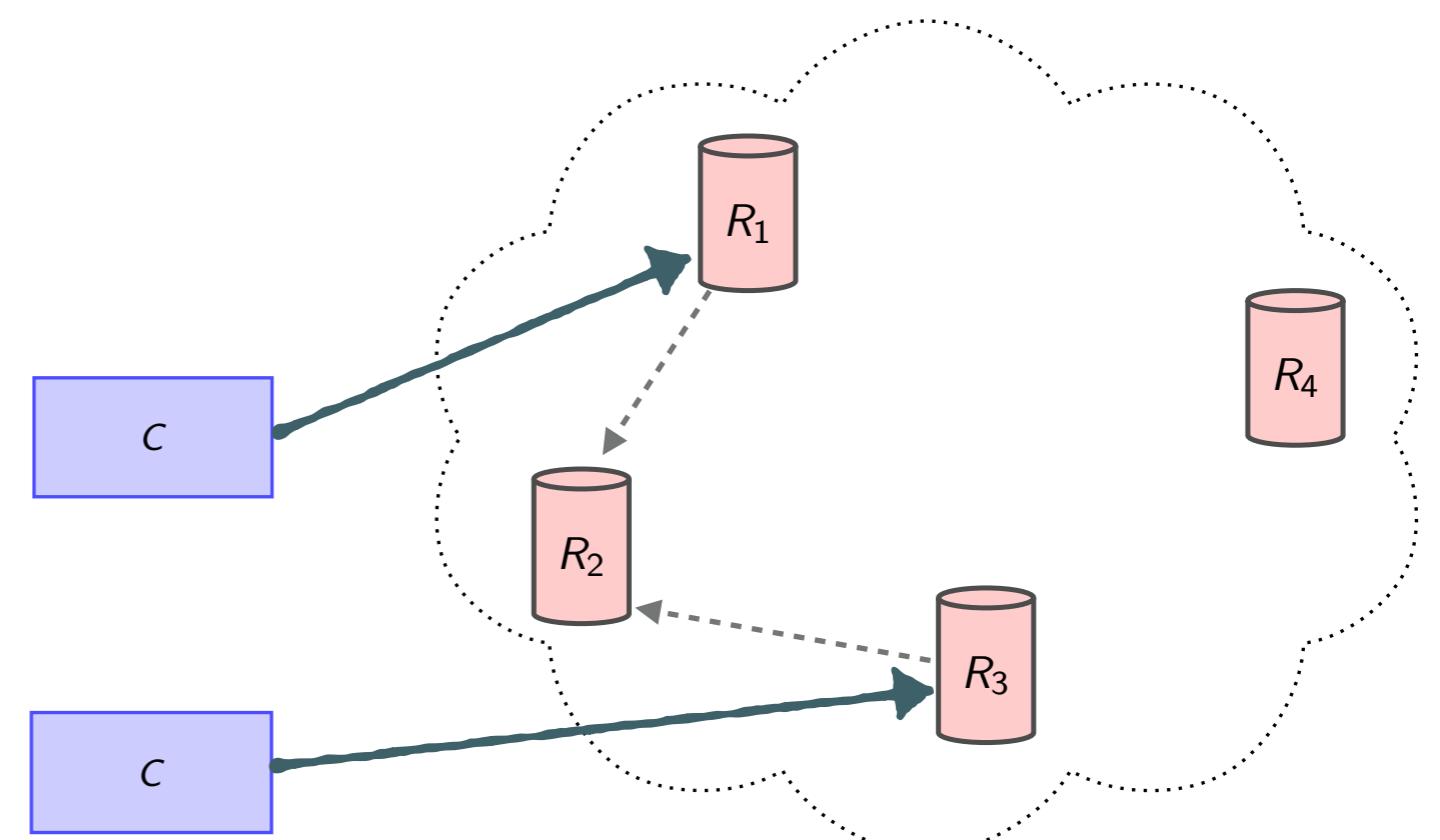


# A replicated register

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$\text{wr}(1)$        $\text{wr}(2)$

VISibility



# A replicated register

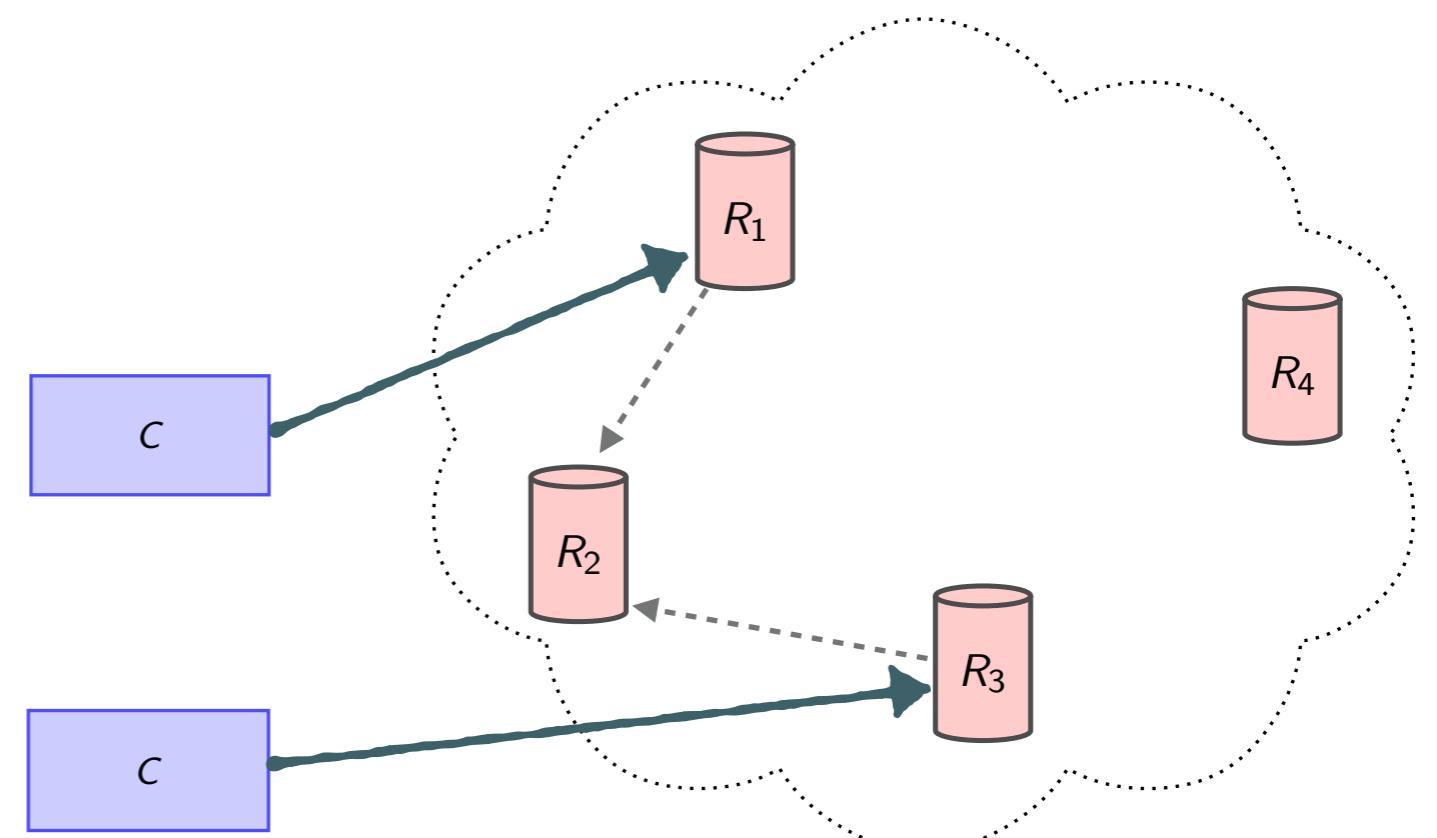
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**wr(1)**      **wr(2)**

VI~~S~~ibility

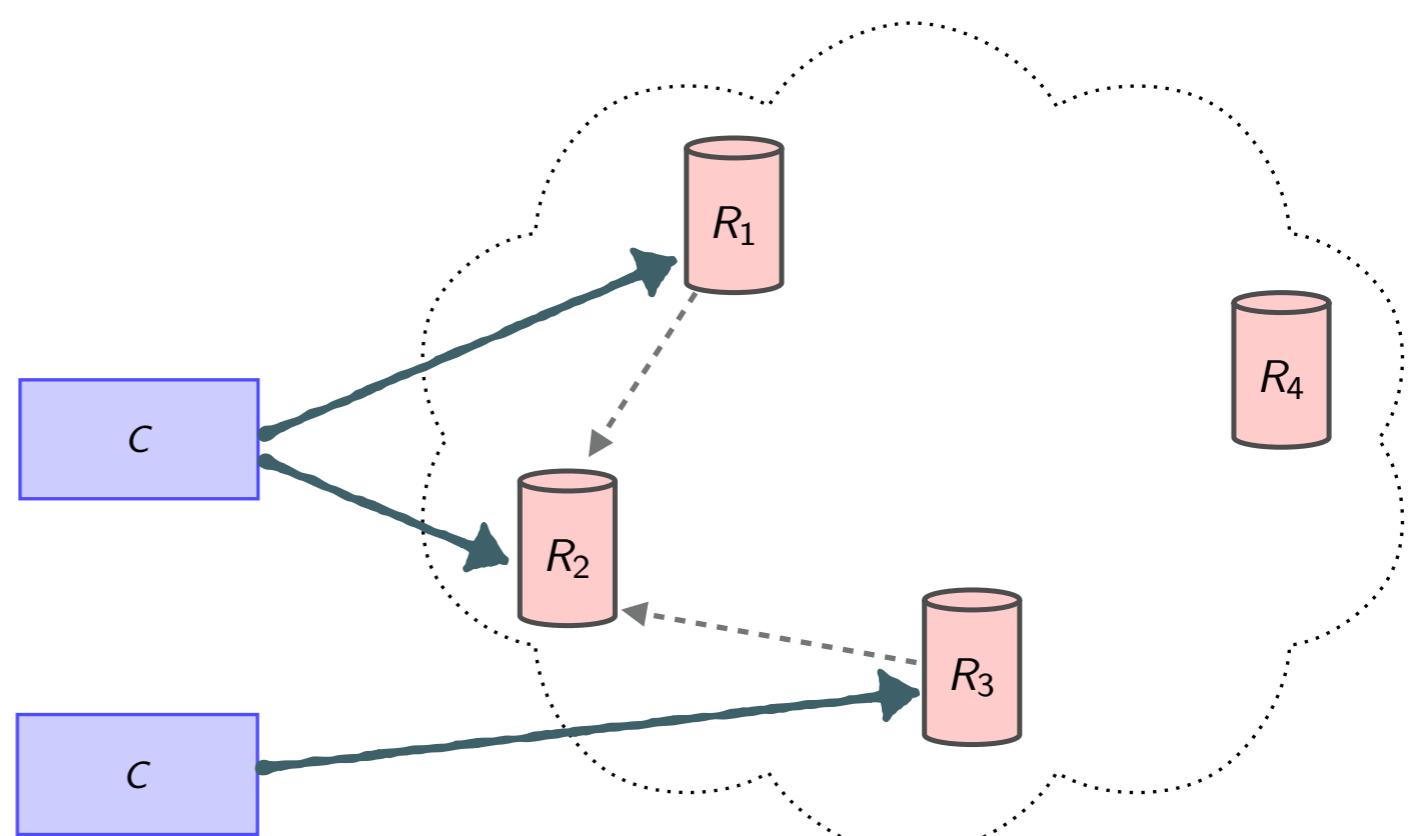
**wr(1)**  
|  
**wr(2)**

ARBitration



# A replicated register

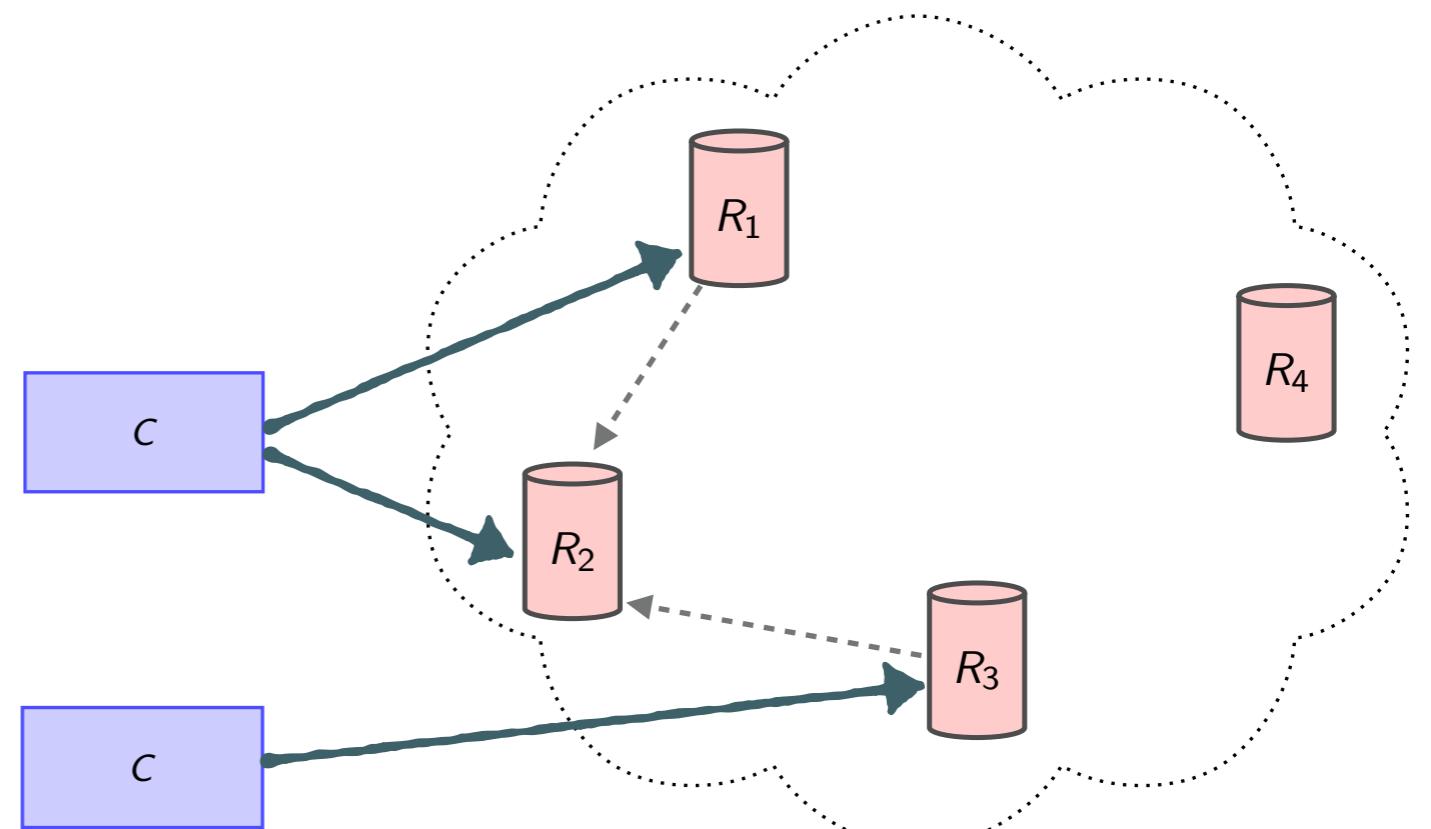
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# A replicated register

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$$\text{rd} \left( \begin{array}{cc|c} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & \\ \hline & & \text{wr}(2) \end{array} \right) = 2$$

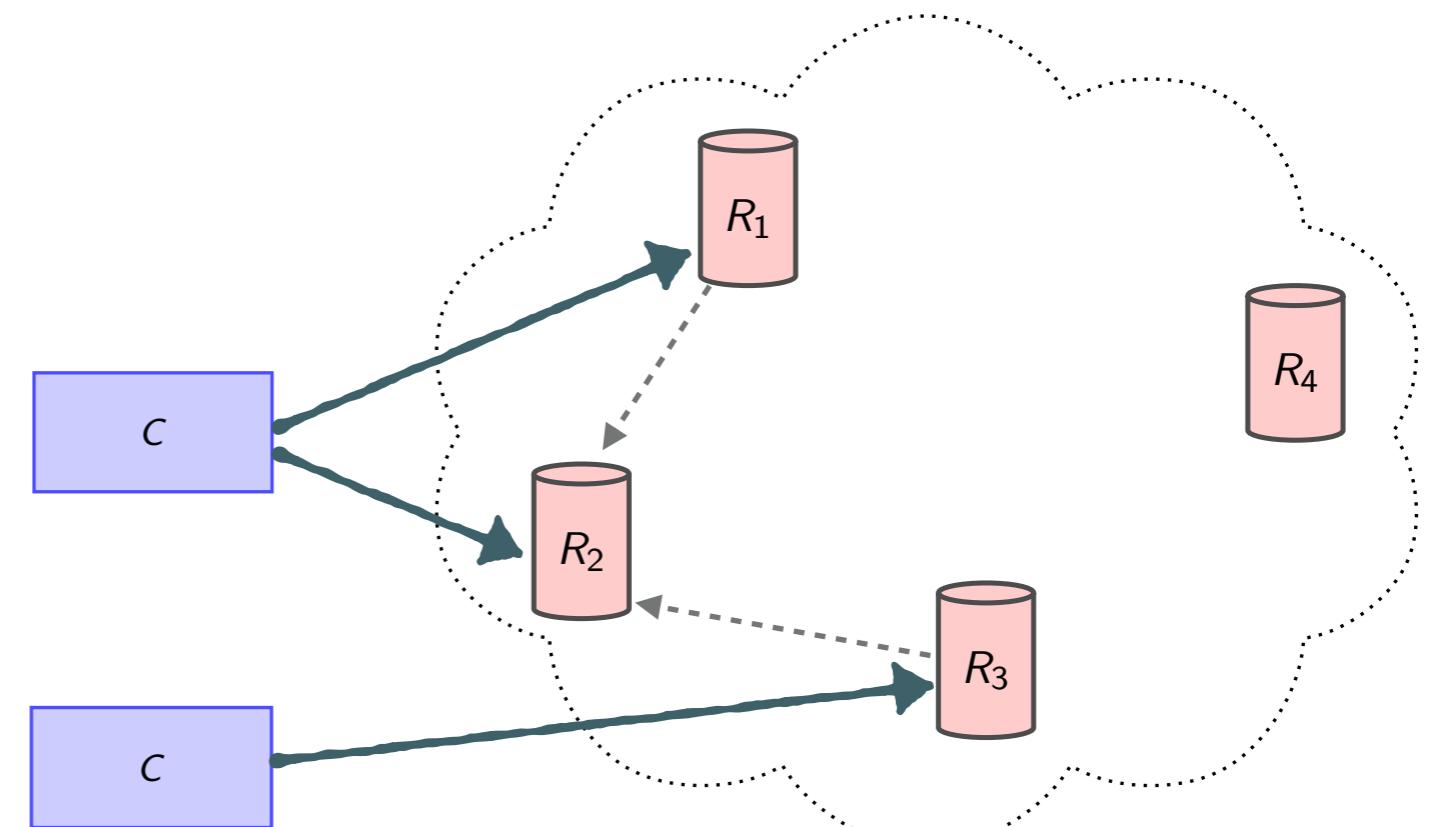


# A replicated register

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$$\text{rd} \left( \begin{array}{cc|c} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & \\ \hline & & \text{wr}(2) \end{array} \right) = 2$$

$$\text{rd} \left( \begin{array}{cc|c} & & \text{wr}(2) \\ \text{wr}(1) & \text{wr}(2) & \\ \hline & & \text{wr}(1) \end{array} \right) = 1$$



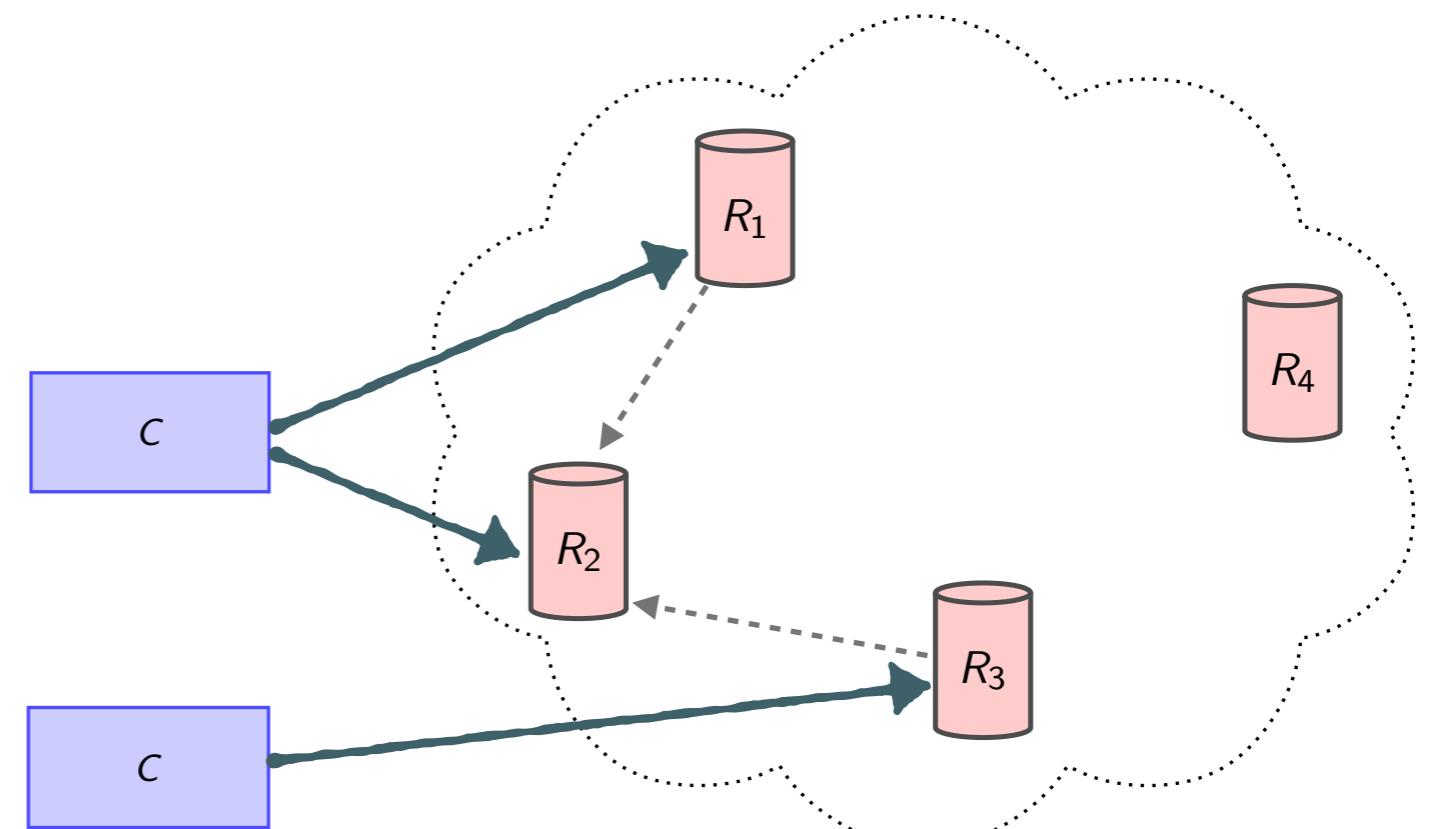
# A replicated register

---

$$\text{rd} \left( \begin{array}{cc|c} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & \\ \hline & & \text{wr}(2) \end{array} \right) = 2$$

$$\text{rd} \left( \begin{array}{cc|c} & & \text{wr}(2) \\ \text{wr}(1) & \text{wr}(2) & \\ \hline & & \text{wr}(1) \end{array} \right) = 1$$

Last-write-wins



# Implementing RDTs

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- Implementing RTDs means...
  - to provide an asynchronous communication mechanism among replicas
  - to ensure its compatibility wrt. the behaviour of the operations
  - to ensure global properties (e.g. eventual convergence of replicas) are preserved
- But first...
  - Is it possible to get an algebraic presentation of RTDs?
  - Is there any implicit assumption on the arbitrations?
  - Are RDTs compositional? That is, are arbitrations of larger visibility orders explained in terms of smaller ones?

# Internalising Values

---

$\langle \text{wr}(1), \textcolor{orange}{ok} \rangle \quad \langle \text{wr}(2), \textcolor{orange}{ok} \rangle$

# Internalising Values

---

$$\langle \text{wr}(1), \textcolor{brown}{ok} \rangle \quad \langle \text{wr}(2), \textcolor{brown}{ok} \rangle$$

$$\text{rd} \begin{pmatrix} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & | \\ & & \text{wr}(2) \end{pmatrix} = 2$$

$$\begin{array}{ccc} \langle \text{wr}(1), \textcolor{brown}{ok} \rangle & \langle \text{wr}(2), \textcolor{brown}{ok} \rangle & \\ \searrow & \swarrow & \\ \langle \text{rd}, \textcolor{brown}{2} \rangle & & \end{array}$$

# Internalising Values

---

$$\text{rd} \begin{pmatrix} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & | \\ & & \text{wr}(2) \end{pmatrix} = 2$$

$$S \begin{pmatrix} \langle \text{wr}(1), \text{ok} \rangle & \langle \text{wr}(2), \text{ok} \rangle \\ & \searrow \\ & \langle \text{rd}, 2 \rangle \end{pmatrix} = \left\{ \begin{array}{c} \langle \text{wr}(1), \text{ok} \rangle \\ | \\ \langle \text{wr}(2), \text{ok} \rangle \\ | \\ \langle \text{rd}, 2 \rangle \end{array} \right\}$$

A specification goes from configurations to sets of arbitrations

# Internalising Values

---

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$$s \begin{pmatrix} \langle \text{wr}(1), \text{ok} \rangle & \langle \text{wr}(2), \text{ok} \rangle \\ & \searrow \\ & \langle \text{rd}, 2 \rangle \end{pmatrix} = \left\{ \quad \right\}$$

A specification goes from configurations to sets of arbitrations

# Recovering Rtds: Saturation

---

$$\text{rd} \begin{pmatrix} & & \text{wr}(1) \\ \text{wr}(1) & \text{wr}(2) & | \\ & & \text{wr}(2) \end{pmatrix} = 2$$

A specification goes from configurations to sets of arbitrations

# Recovering Rtds: Saturation

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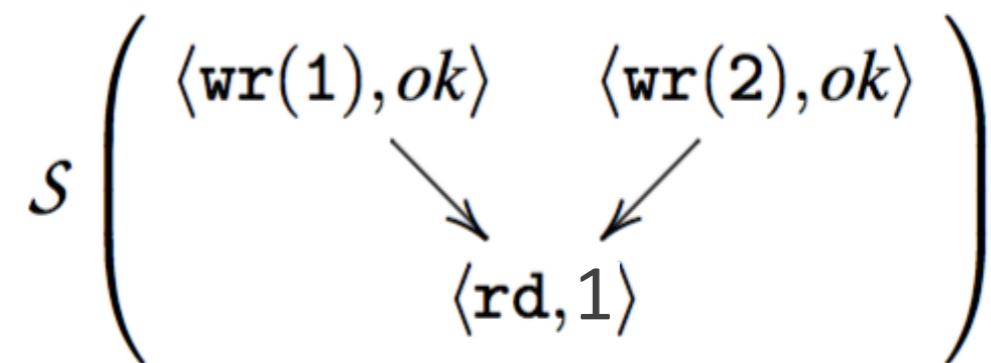
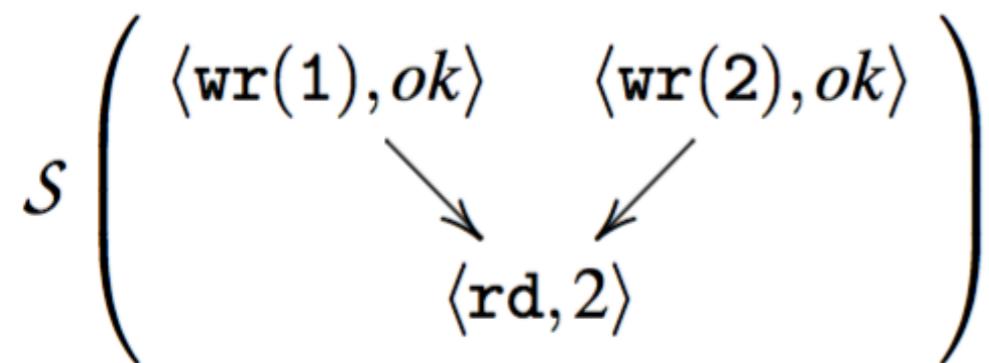
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$$S \begin{pmatrix} \langle \text{wr}(1), ok \rangle & \langle \text{wr}(2), ok \rangle \\ & \searrow \\ & \langle \text{rd}, 2 \rangle \end{pmatrix} = \left\{ \begin{array}{ccc} \langle \text{wr}(1), ok \rangle & \langle \text{wr}(1), ok \rangle & \langle \text{rd}, 2 \rangle \\ | & | & | \\ \langle \text{wr}(2), ok \rangle & \langle \text{rd}, 2 \rangle & \langle \text{wr}(1), ok \rangle \\ | & | & | \\ \langle \text{rd}, 2 \rangle & \langle \text{wr}(2), ok \rangle & \langle \text{wr}(2), ok \rangle \end{array} \right\}$$

A specification goes from configurations to sets of arbitrations

# Recovering RTDs: Determinism

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**value deterministic:** empty intersection after removing last event

**deterministic:** empty intersection after forgetting also the value

(Classic) RTDs have chosen the second path  
(thus e.g. forbidding write failures)

# Recovering Rtds: Coherence

---

$$\begin{array}{c} \langle \text{wr}(1), \text{ok} \rangle \\ | \\ \langle \text{wr}(2), \text{ok} \rangle \\ | \\ \langle \text{rd}, 2 \rangle \end{array} \otimes \begin{array}{c} \langle \text{wr}(2), \text{ok} \rangle \\ | \\ \langle \text{wr}(3), \text{ok} \rangle \end{array} = \left\{ \begin{array}{ll} \langle \text{wr}(1), \text{ok} \rangle & \langle \text{wr}(1), \text{ok} \rangle \\ | & | \\ \langle \text{wr}(2), \text{ok} \rangle & \langle \text{wr}(2), \text{ok} \rangle \\ | & | \\ \langle \text{rd}, 2 \rangle & \langle \text{wr}(3), \text{ok} \rangle \\ | & | \\ \langle \text{wr}(3), \text{ok} \rangle & \langle \text{rd}, 2 \rangle \end{array} \right\}$$

Admissible arbitrations never increase when extending visibility

# Recovering Rtds: Coherence

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$$\begin{array}{c} \langle \text{wr}(1), \text{ok} \rangle \\ | \\ \langle \text{wr}(2), \text{ok} \rangle \\ | \\ \langle \text{rd}, 2 \rangle \end{array} \otimes \begin{array}{c} \langle \text{wr}(2), \text{ok} \rangle \\ | \\ \langle \text{wr}(3), \text{ok} \rangle \end{array} = \left\{ \begin{array}{ll} \langle \text{wr}(1), \text{ok} \rangle & \langle \text{wr}(1), \text{ok} \rangle \\ | & | \\ \langle \text{wr}(2), \text{ok} \rangle & \langle \text{wr}(2), \text{ok} \rangle \\ | & | \\ \langle \text{rd}, 2 \rangle & \langle \text{wr}(3), \text{ok} \rangle \\ | & | \\ \langle \text{wr}(3), \text{ok} \rangle & \langle \text{rd}, 2 \rangle \end{array} \right\}$$

$$\forall G. S(G) = \bigotimes_{e \in E_G} S(G|_{-\prec^*_e})$$

Admissible arbitrations never increase when extending visibility

# Recovering Rtds: Main Theorem

---

- There is a one-to-one correspondence between RTDs and saturated, deterministic, and coherent specifications

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....which is bad for RDTs!!

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saturation and especially determinism are bad!!

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saturation and especially determinism are bad!!

$$S \begin{pmatrix} \langle \text{inc}, \text{ok} \rangle \\ \downarrow \\ \langle \text{rd}, 1 \rangle \end{pmatrix} = \left\{ \begin{array}{c} \langle \text{inc}, \text{ok} \rangle \\ | \\ \langle \text{rd}, 1 \rangle \end{array} \right\} \quad S \begin{pmatrix} \langle \text{inc}, \text{fail} \rangle \\ \downarrow \\ \langle \text{rd}, \perp \rangle \end{pmatrix} = \left\{ \begin{array}{c} \langle \text{inc}, \text{fail} \rangle \\ | \\ \langle \text{rd}, \perp \rangle \end{array} \right\}$$

value-deterministic, yet not deterministic

# From specifications to transitions systems

---

$\langle G, P \rangle$        $P \in \mathcal{S}(G)$       states

# From specifications to transitions systems

---

$$\langle G, P \rangle \quad P \in \mathcal{S}(G) \quad \text{states}$$

$$\langle G, P \rangle \xrightarrow{\ell} \langle G', P' \rangle \quad \text{transitions}$$

$$G' = G^\ell \quad P'|_{\mathcal{E}_G} = P$$

# From specifications to transitions systems

---

(COMP)

$$\frac{\langle G_1, P|_{E_{G_1}} \rangle \xrightarrow{\ell} \langle G'_1, P'_1 \rangle \quad P' \in P \otimes P'_1}{\langle G_1 \sqcup G_2, P \rangle \xrightarrow{\ell} \langle G'_1 \sqcup G_2, P' \rangle}$$

an abstract transition system against which to compare (by asynchronous simulation) those of actual implementations...

# RDT specifications (functional style)

---

$$S : G(\mathcal{L}) \rightarrow 2^{P(\mathcal{L})}$$

Abstract representation of  
the state

Sequence of operations that  
generate a state

# Abstract representation of states

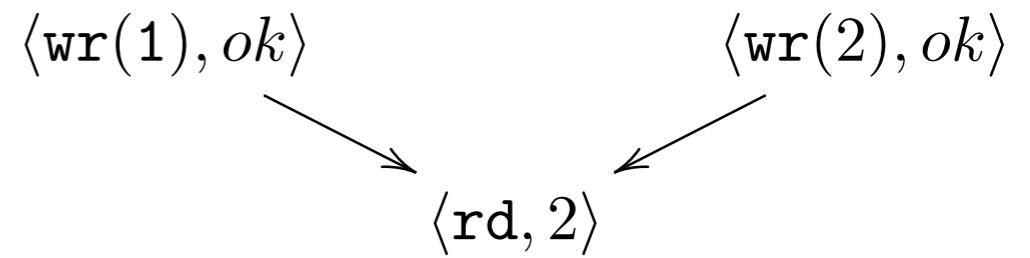
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- A state is given as *labelled acyclic directed graph*
  - a node represents an **executed operation**
  - a label describes
    - the **invoked operation**, and
    - the **return value**
  - arcs stands for visible dependencies

# Abstract representation of states

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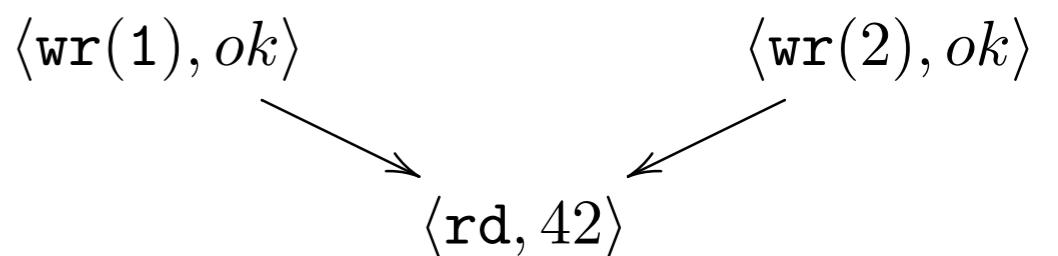
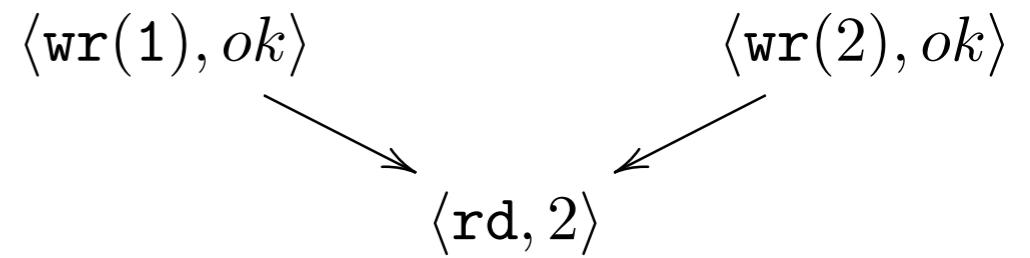
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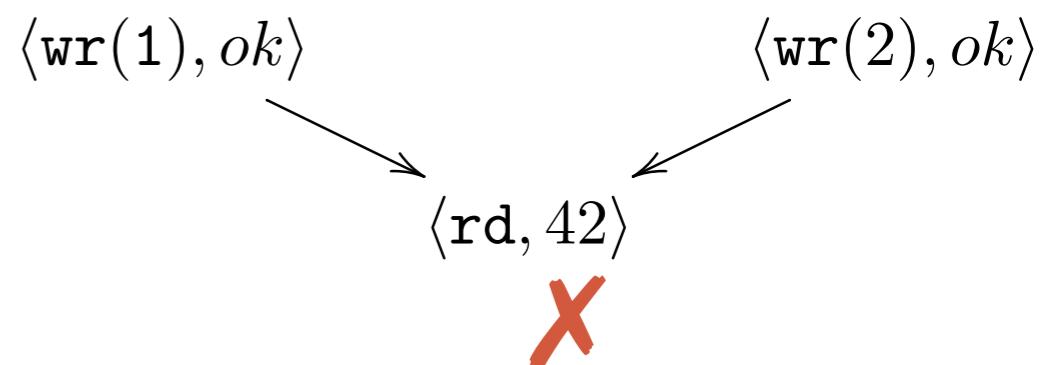
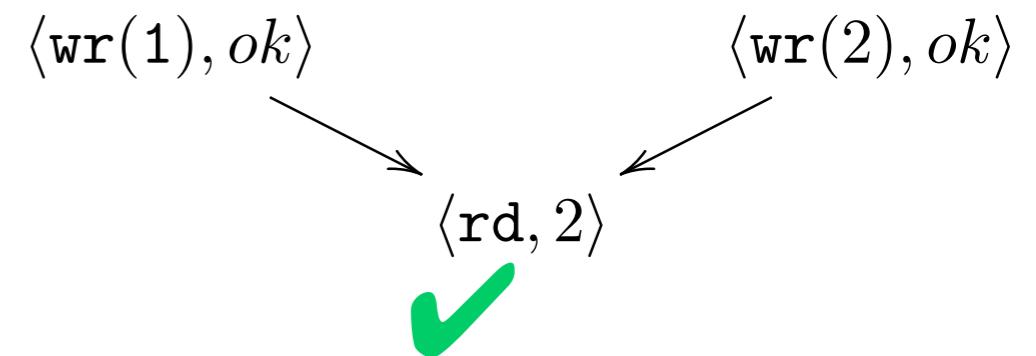
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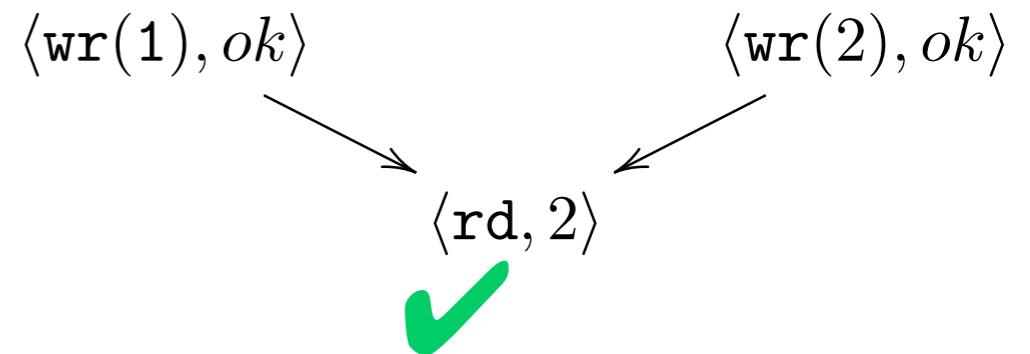
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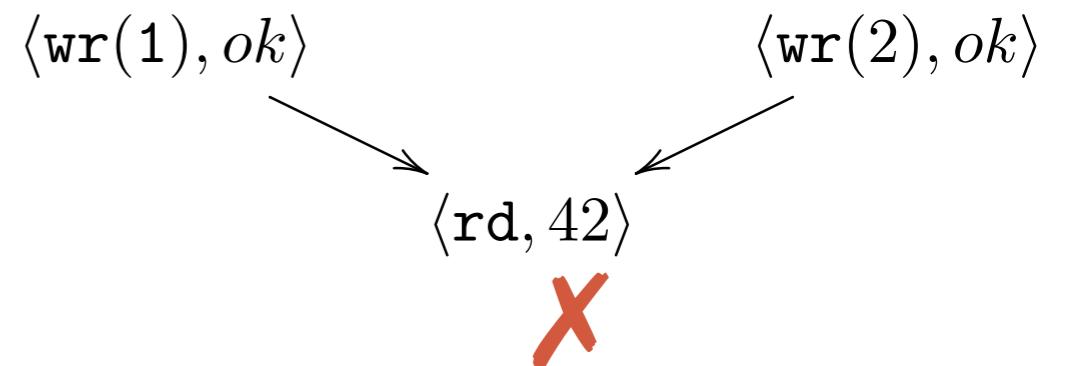
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**A specification allows us  
to make such a distinction**



# RDT specifications (functional style)

---

$$S : G(\mathcal{L}) \rightarrow 2^{P(\mathcal{L})}$$

Acyclic graphs  
labelled over  $\mathcal{L}$

Total orders (paths)  
labelled over  $\mathcal{L}$

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Acyclic graphs  
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Total orders (paths)  
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$$S \begin{pmatrix} \langle wr(1), ok \rangle & \langle wr(2), ok \rangle \\ & \searrow \\ & \langle rd, 2 \rangle \end{pmatrix} = \left\{ \begin{array}{l} \langle wr(1), ok \rangle \\ | \\ \langle wr(2), ok \rangle \\ | \\ \langle rd, 2 \rangle \end{array} \right\}$$

A state

An ordering that generates  
that state

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Acyclic graphs  
labelled over  $\mathcal{L}$

Total orders (paths)  
labelled over  $\mathcal{L}$

$$S \left( \begin{array}{cc} \langle wr(1), ok \rangle & \langle wr(2), ok \rangle \\ \searrow & \swarrow \\ & \langle rd, 3 \rangle \end{array} \right) = \emptyset$$

A state disallowed by the specification

# RDTs, Algebraically: Roadmap

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- Specifications are functors
- Implementations are functors
- LTSs are recovered from these functors
- Implementation correctness via simulation

# RDT specification, algebraically

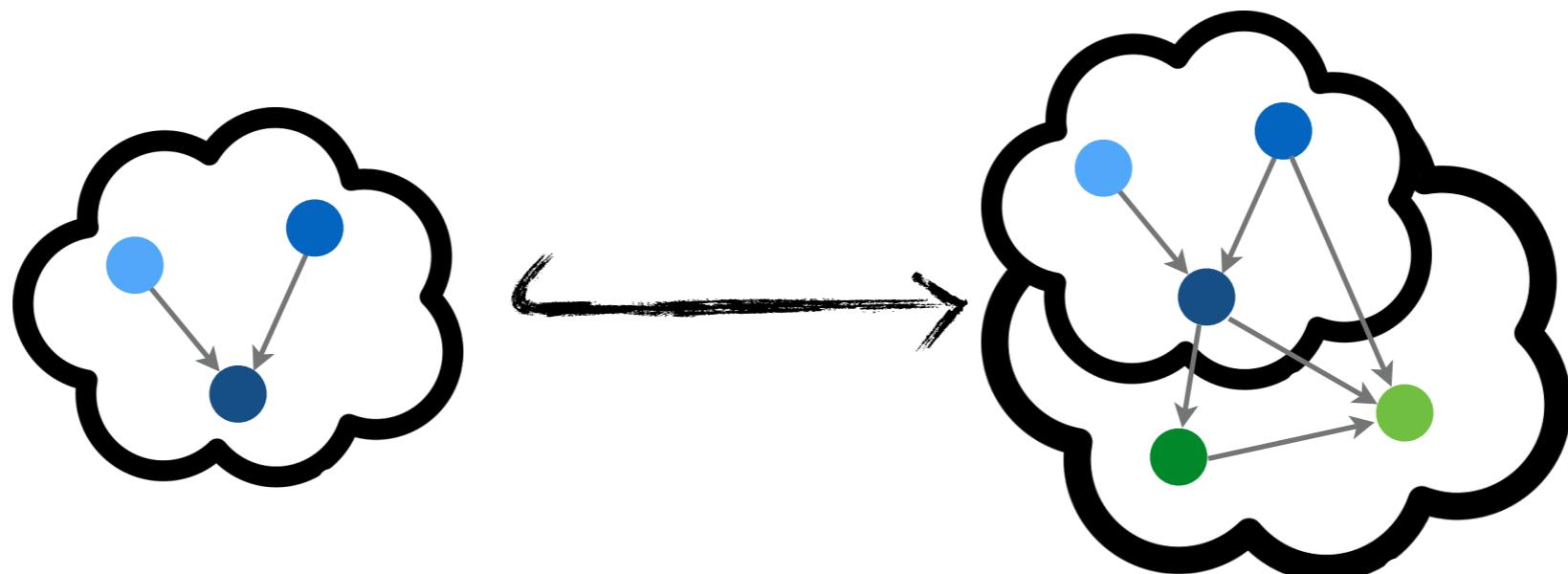
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- A functor  $\mathbf{S} : \text{PIDag}(\mathcal{L}) \rightarrow \text{SPaths}(\mathcal{L})$ 
  - from the category of states ( $\text{PIDag}(\mathcal{L})$ )
  - to the category of sets of paths ( $\text{SPaths}(\mathcal{L})$ )

# Category of States $\text{PiDag}(\mathcal{L})$

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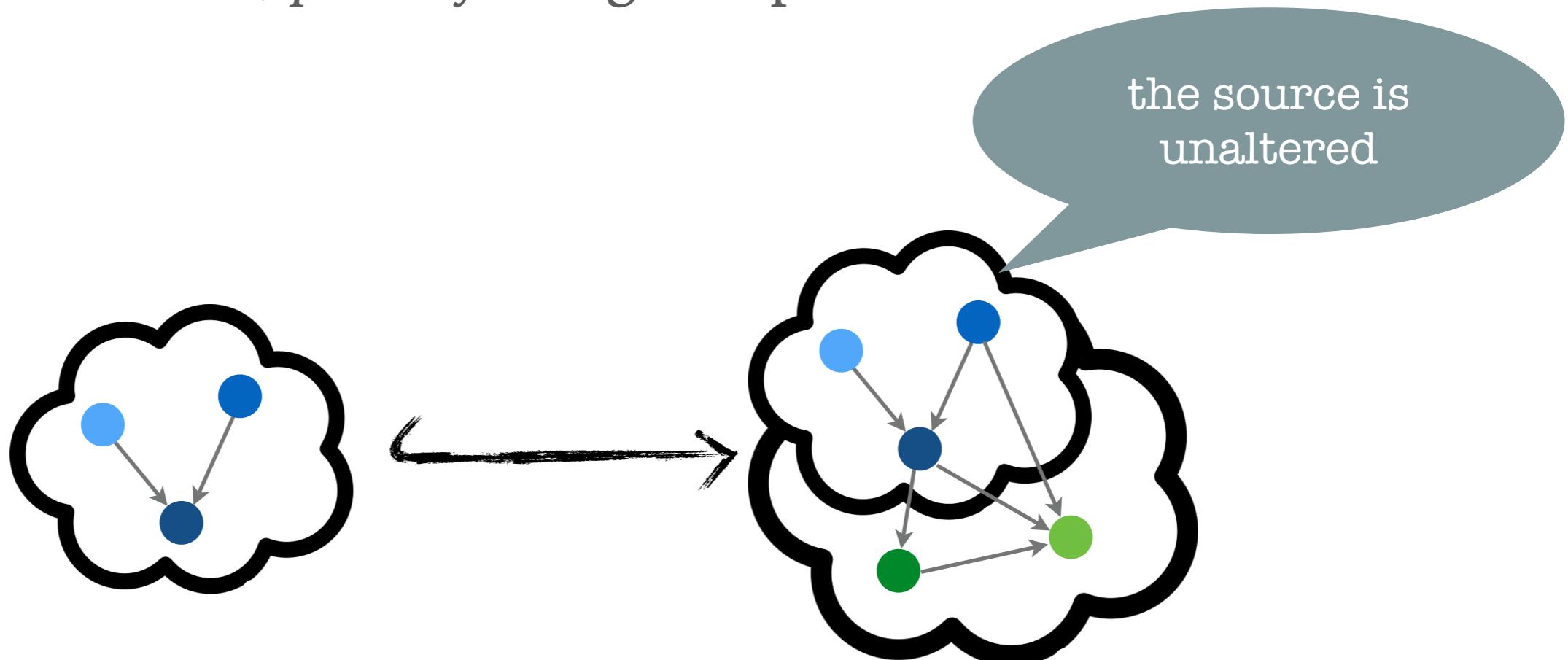
- Objects: Acyclic directed graphs labelled over  $\mathcal{L}$
- Arrows: monic, *past-reflecting* morphisms



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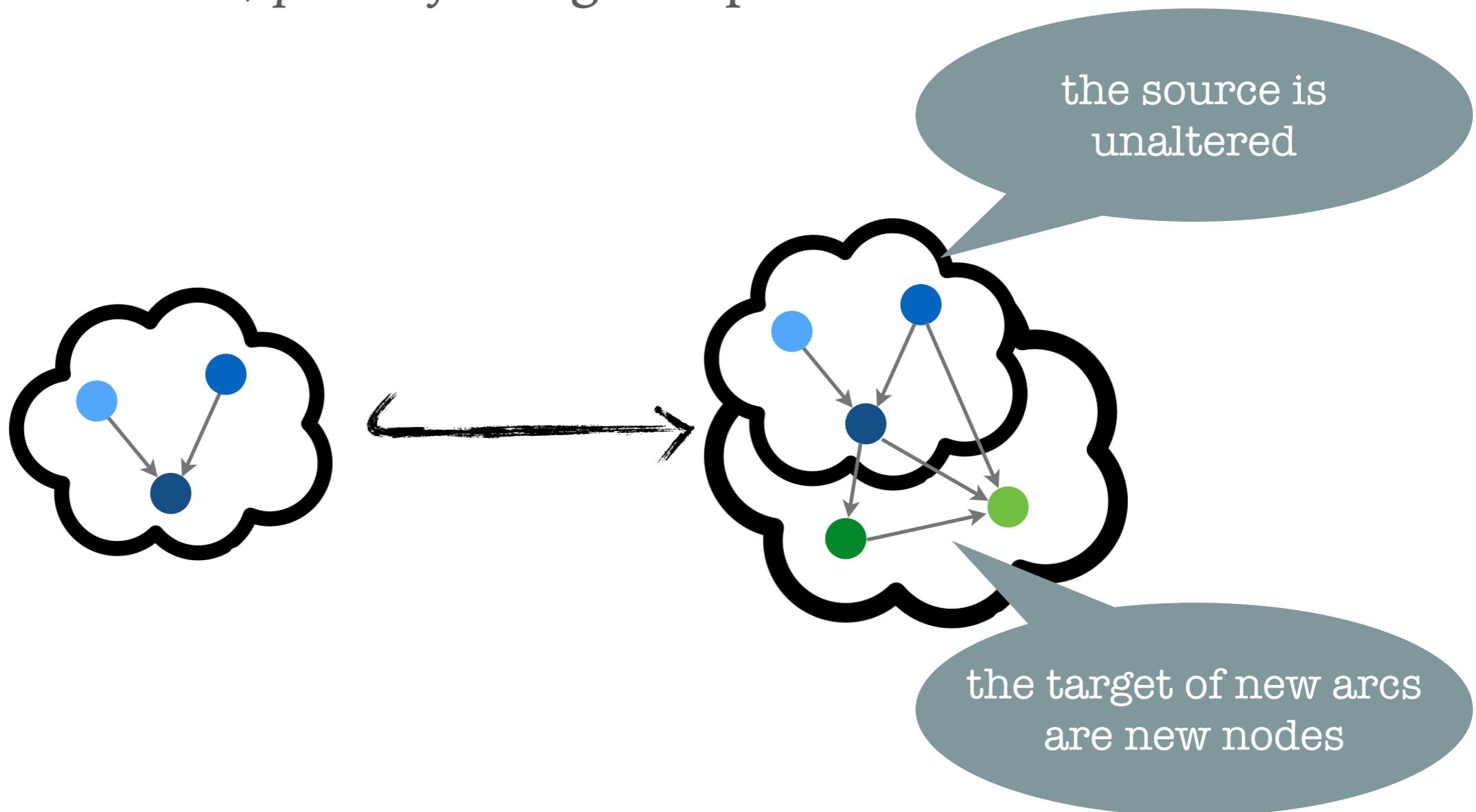
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# Category of States $\text{PiDag}(\mathcal{L})$

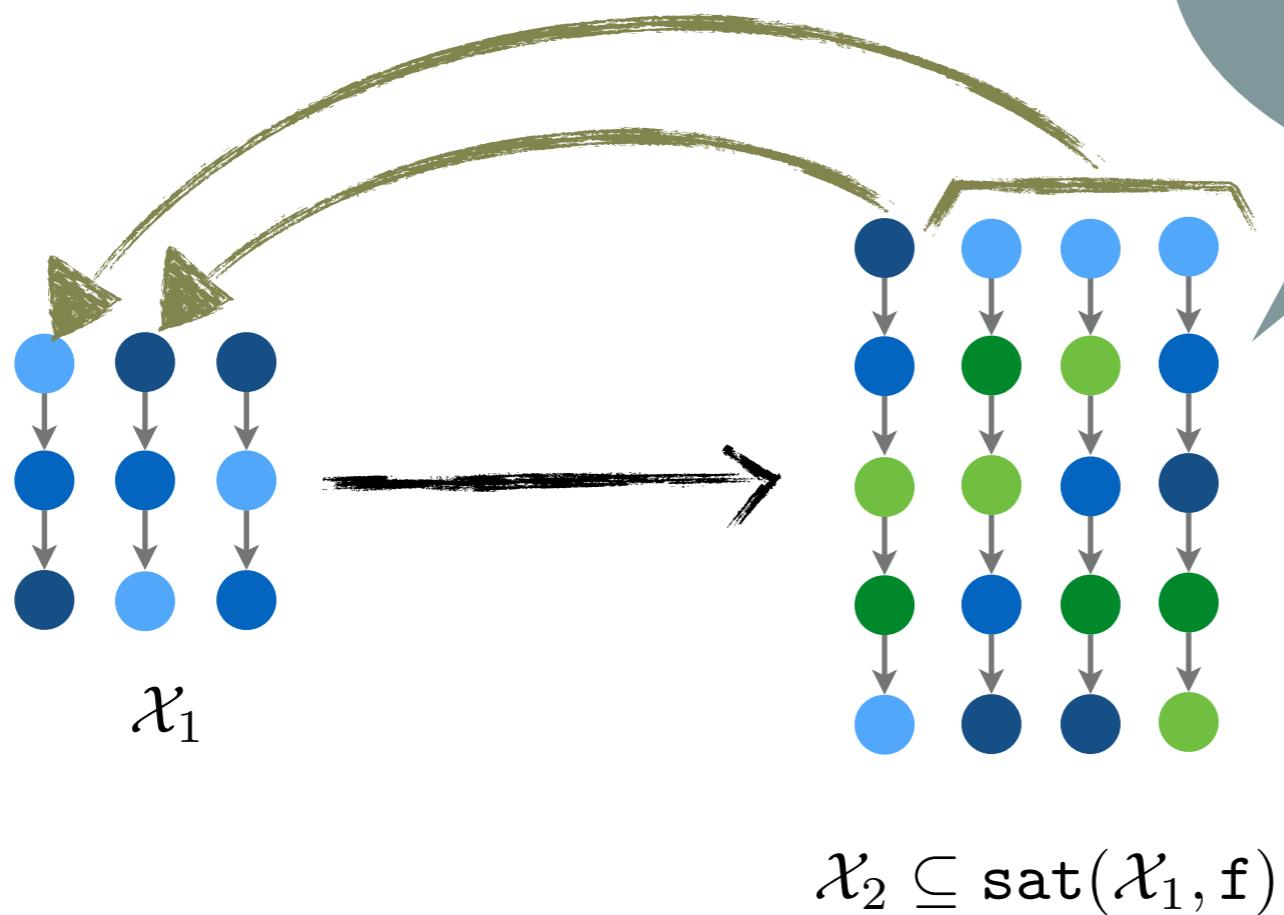
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- Objects: Acyclic directed graphs labelled over  $\mathcal{L}$
- Arrows: monic, *past-reflecting* morphisms

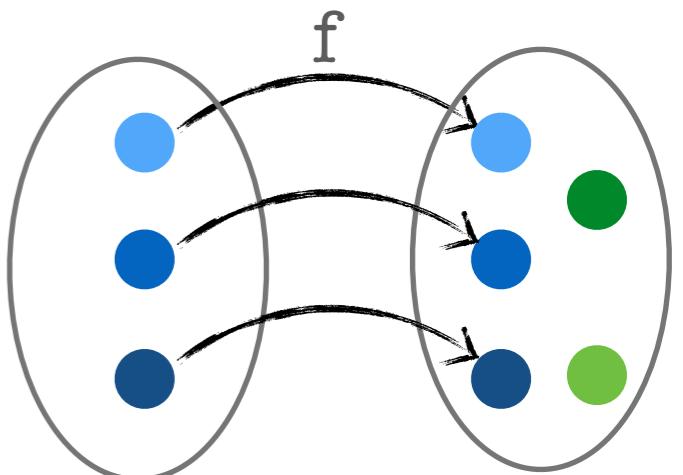


# Category of Set of Paths SPath( $\mathcal{L}$ )

- Objects: set of paths labelled over  $\mathcal{L}$
- Arrows: *past-set* morphisms

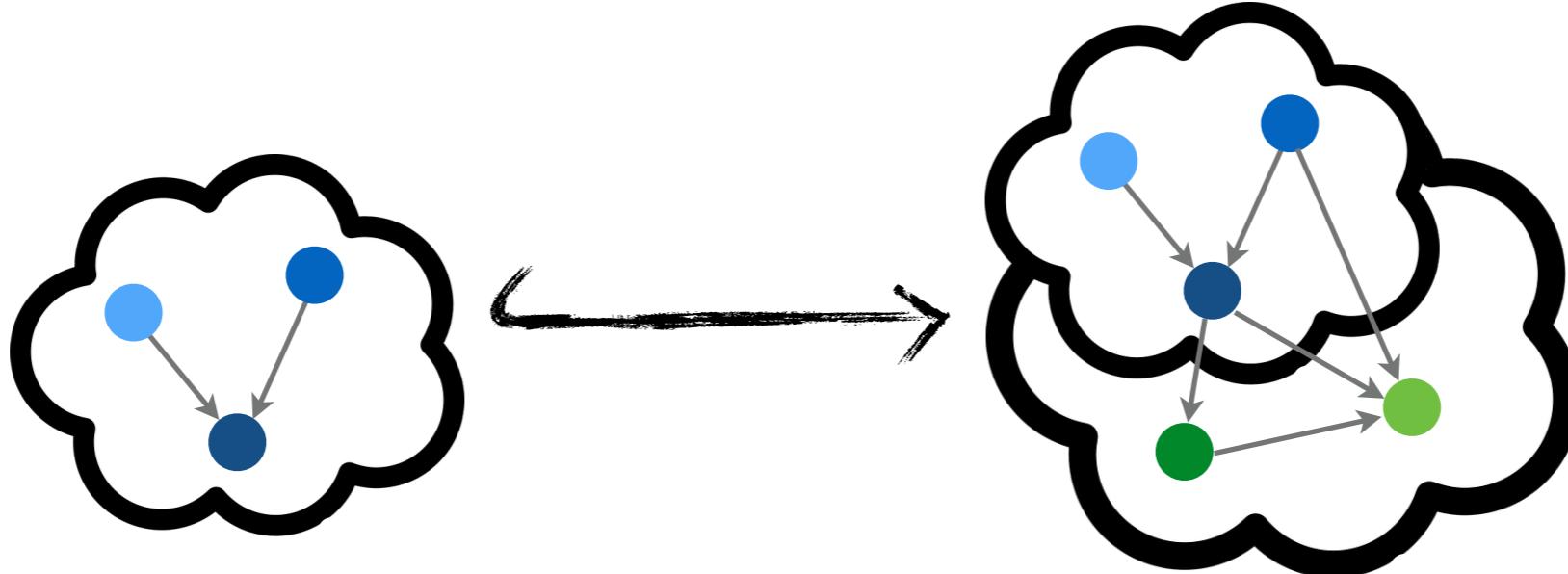


Each path is obtained  
by extending some path  
in  $X_1$



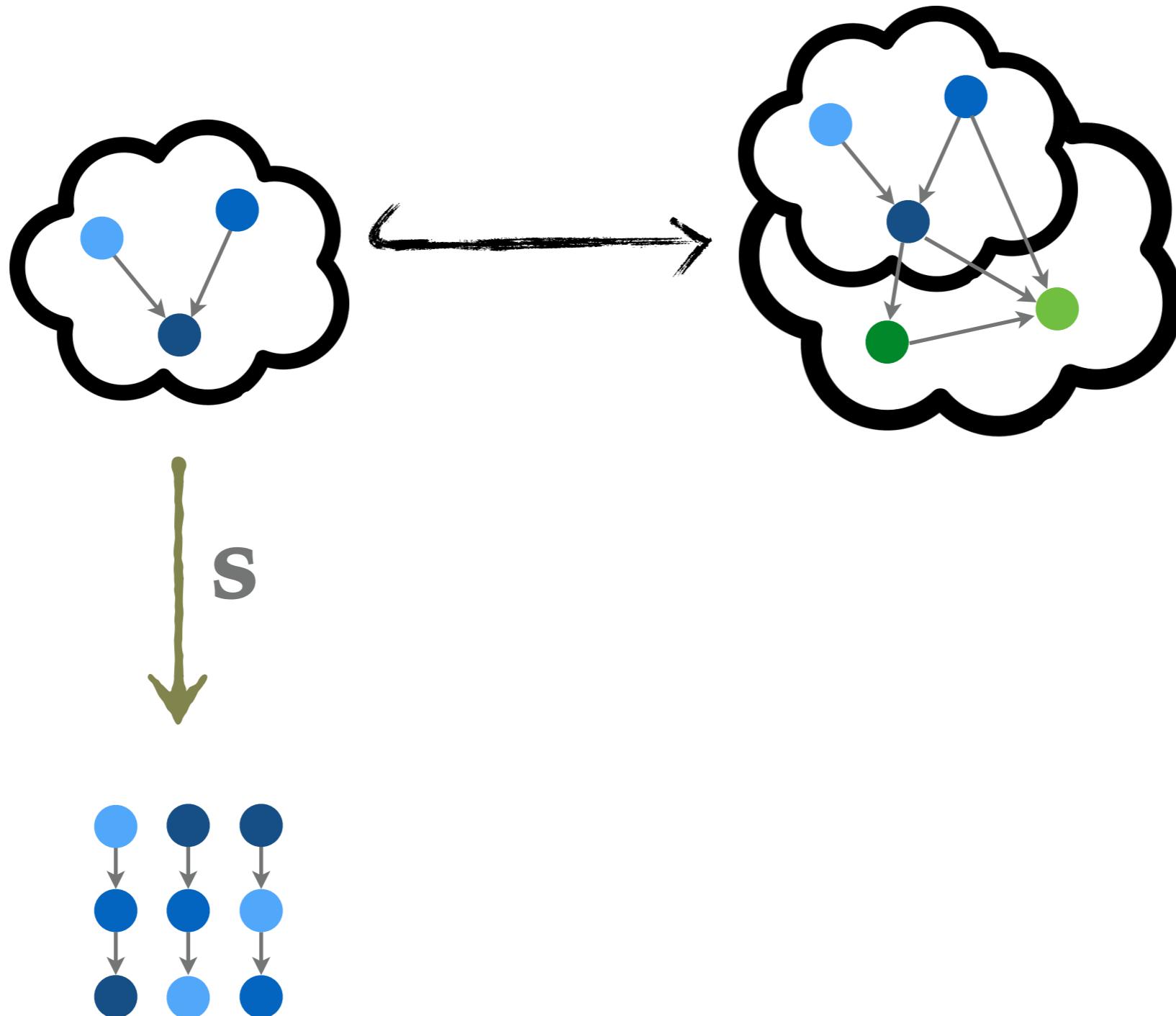
Specifications are functors from  $\text{PiDag}(\mathcal{L})$  to  $\text{SPath}(\mathcal{L})$

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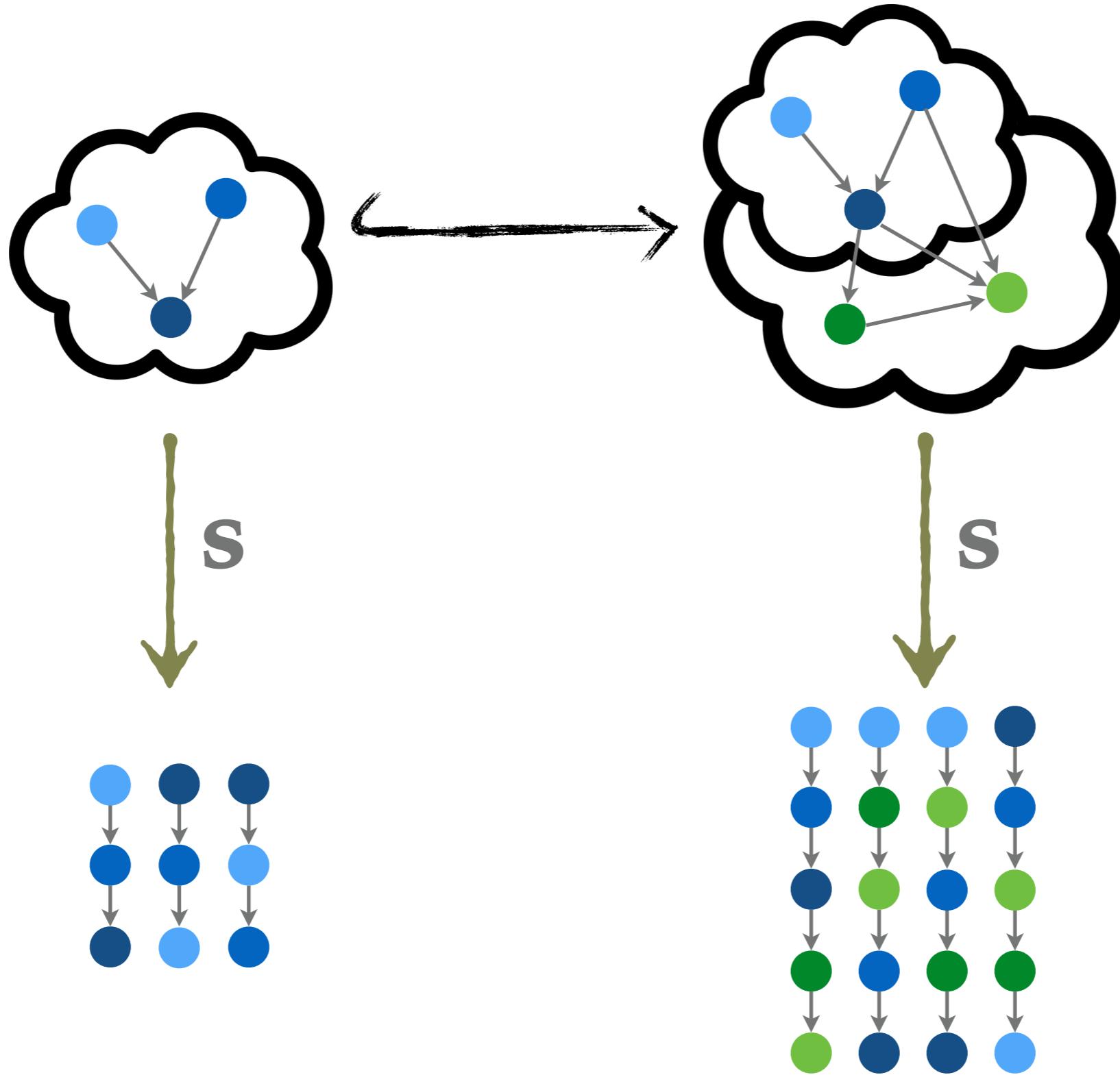
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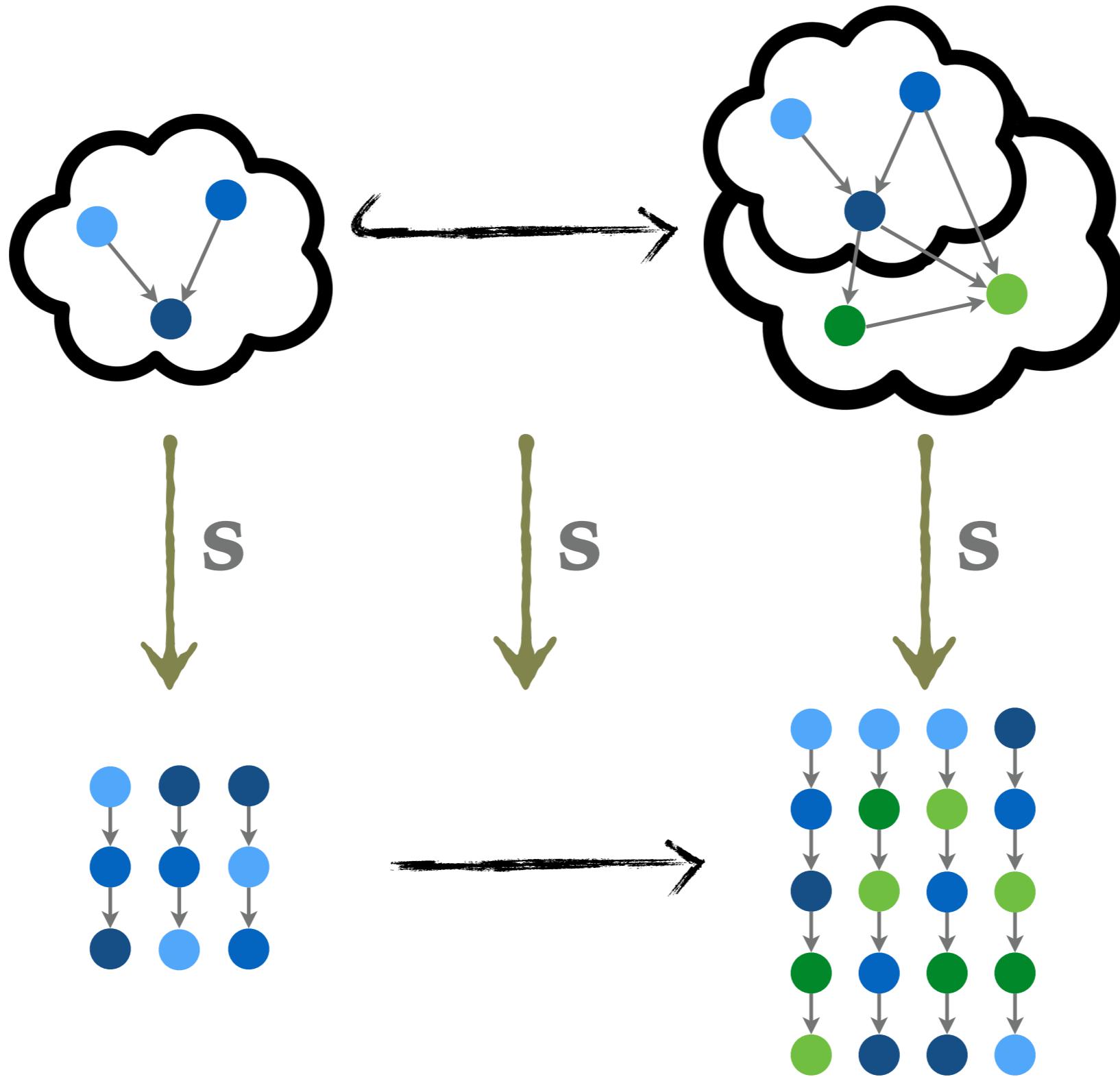
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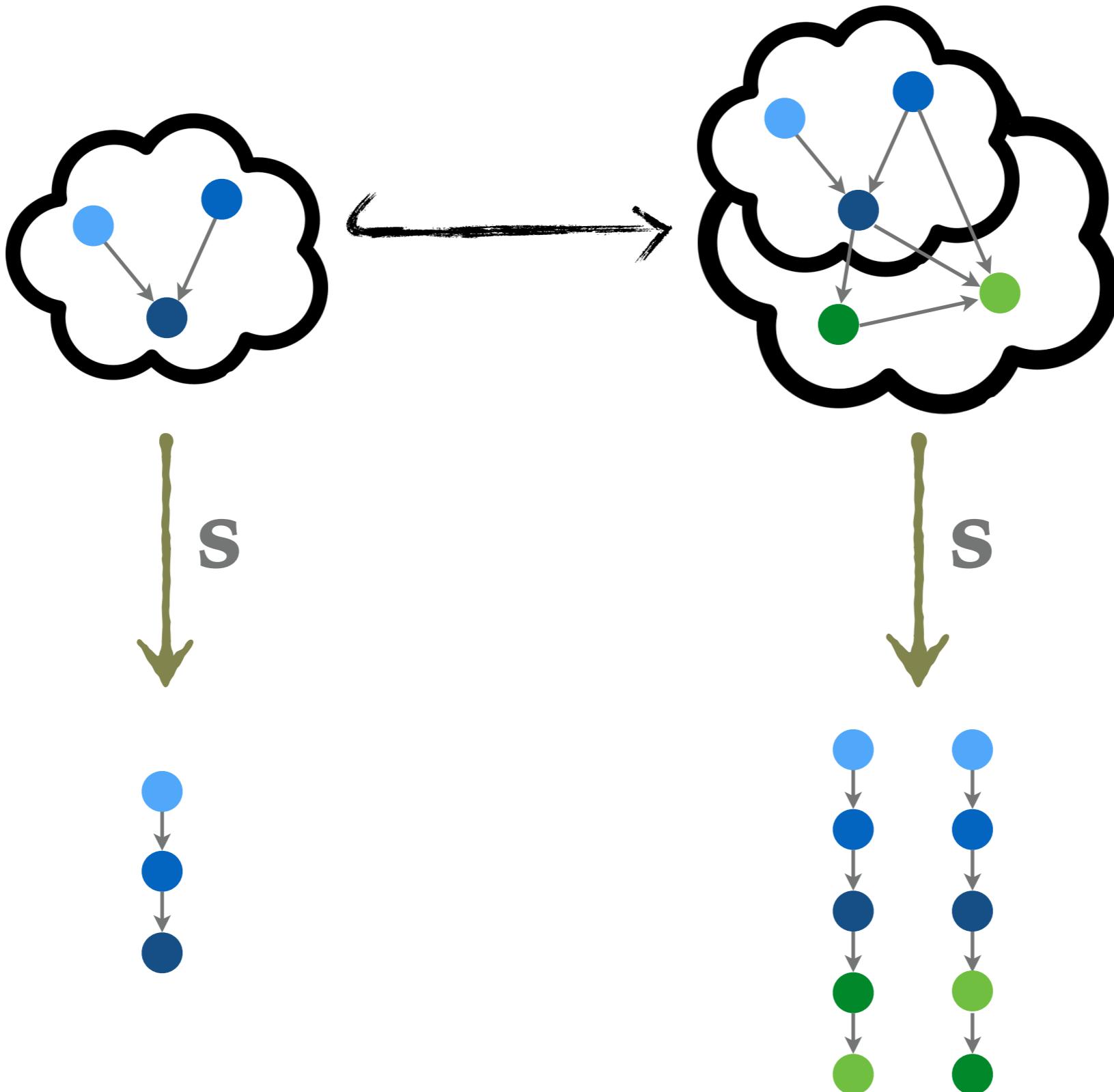


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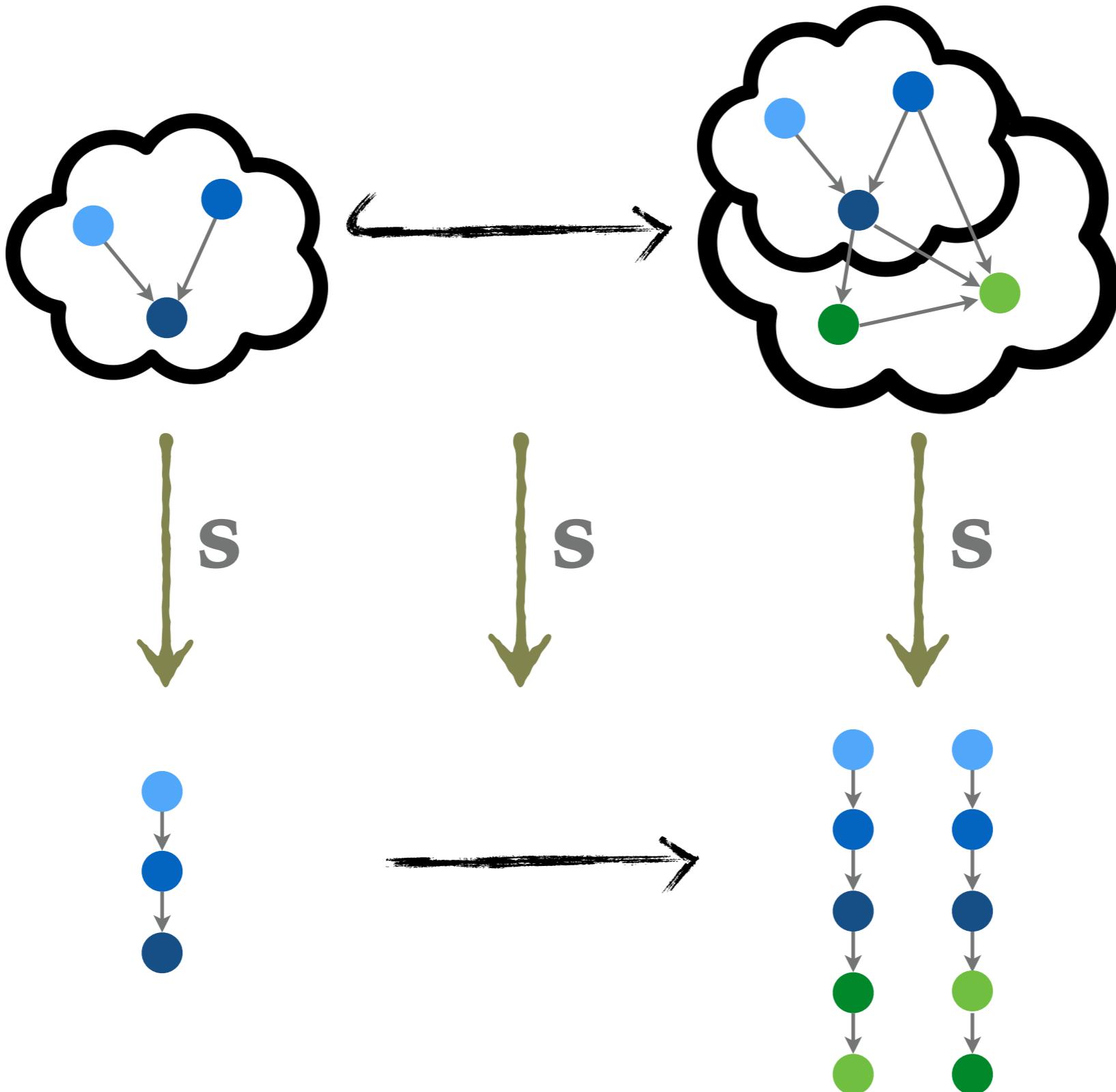
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# Specifications may be topological...



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# Specifications Are Functors “Preserving” Pushouts . . .

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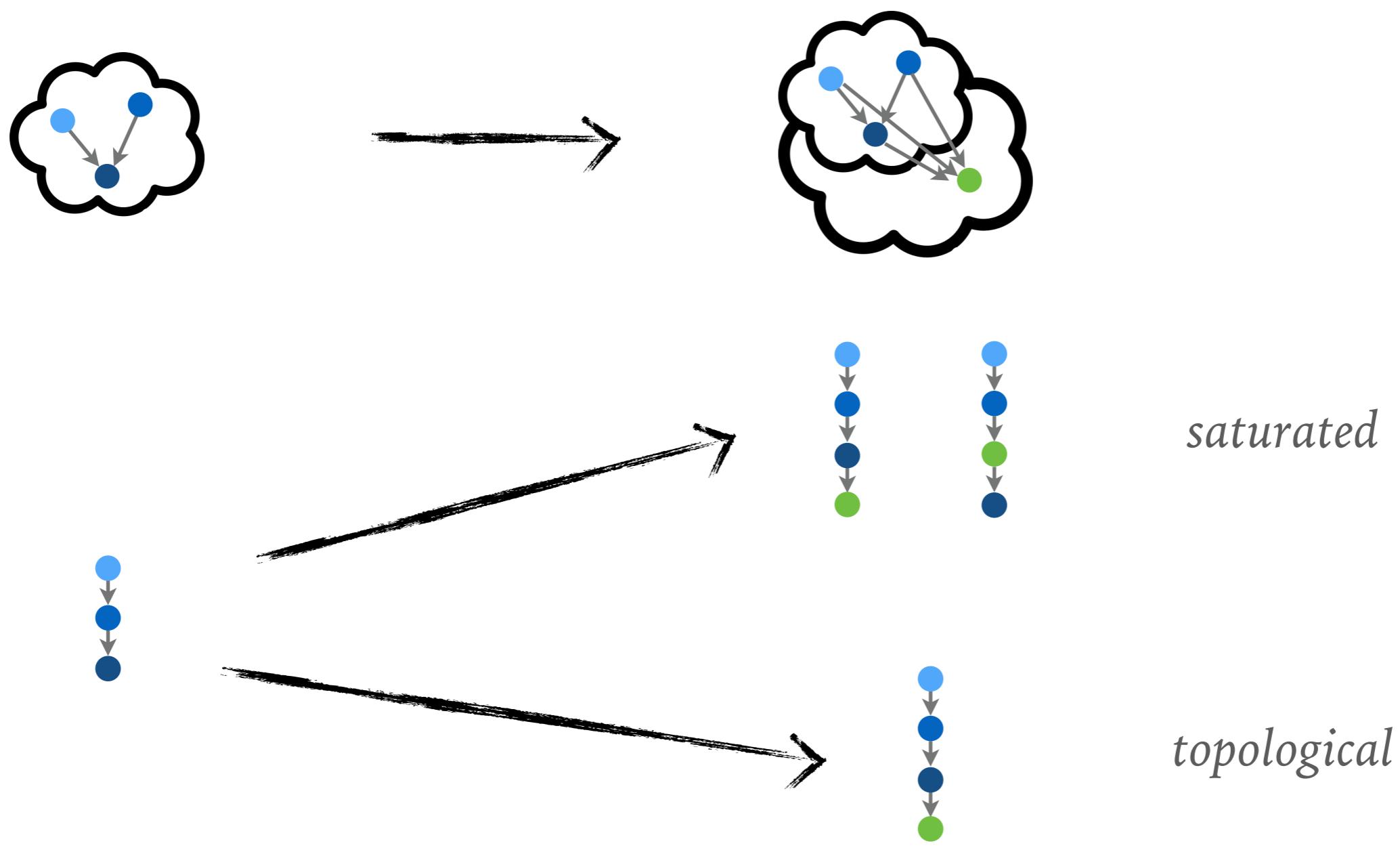
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- (meaning pushouts corresponds to coherence)
- ... plus suitably mapping root extensions

# Specifications Are Functors “Preserving” Pushouts . . .

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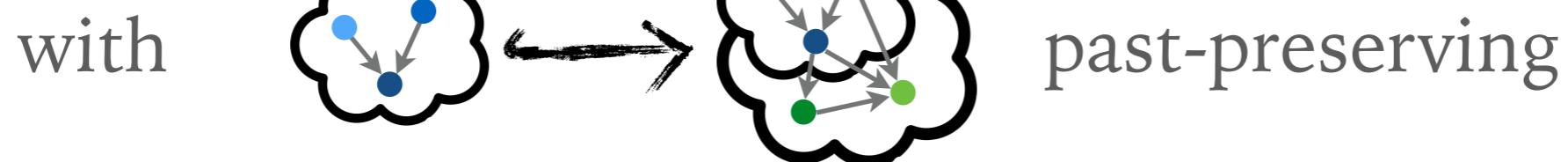
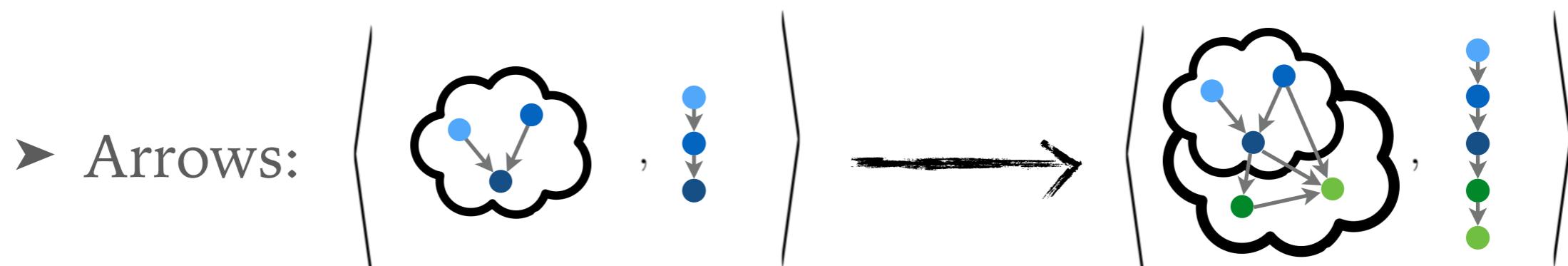
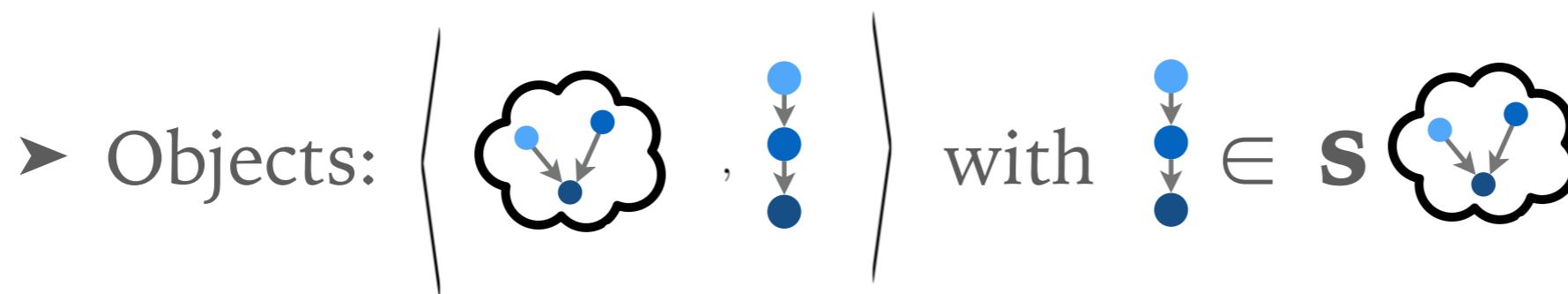
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# Operational interpretation of a specification $\mathbf{S}$

---

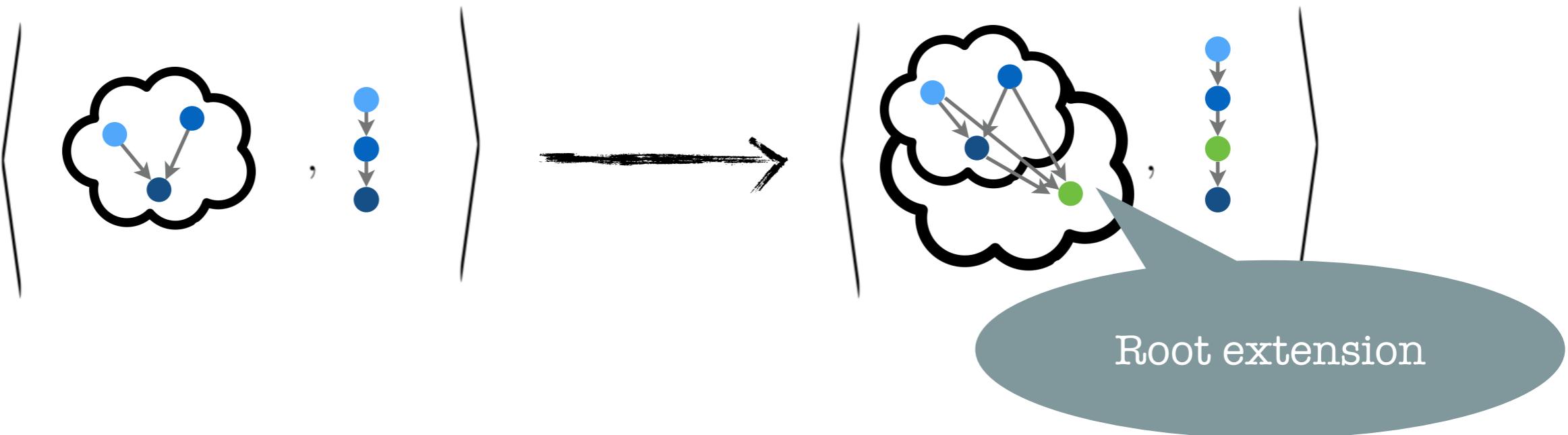
- The category of elements  $\mathcal{E}(\mathbf{S})$



# Operational interpretation of a specification $\mathcal{E}(\mathbf{S})$

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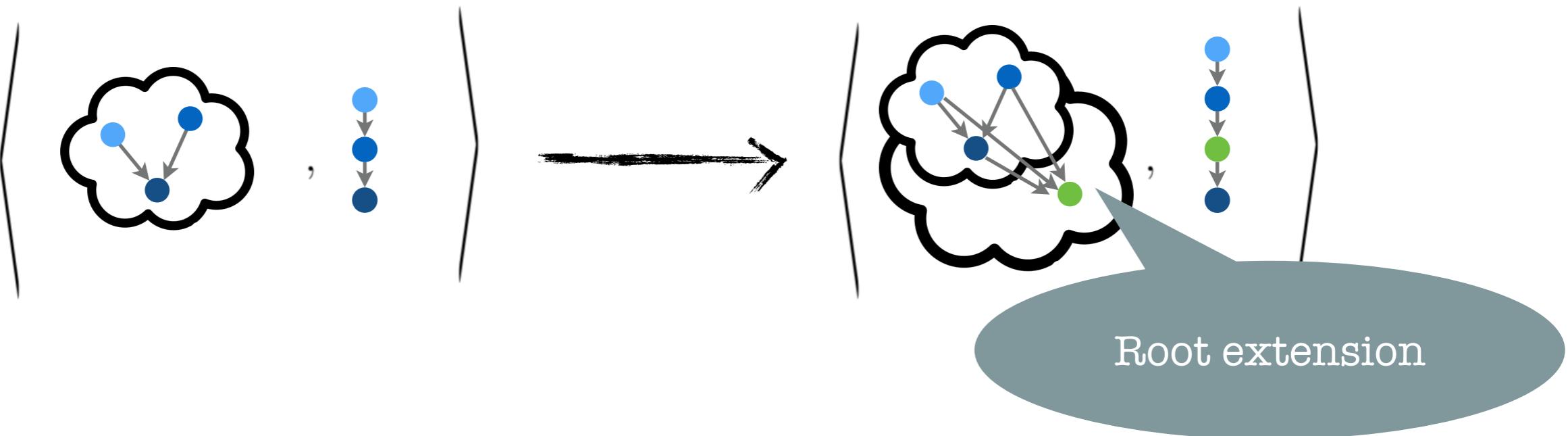
- $\mathcal{E}_o(\mathbf{S})$ : The behaviour of one replica



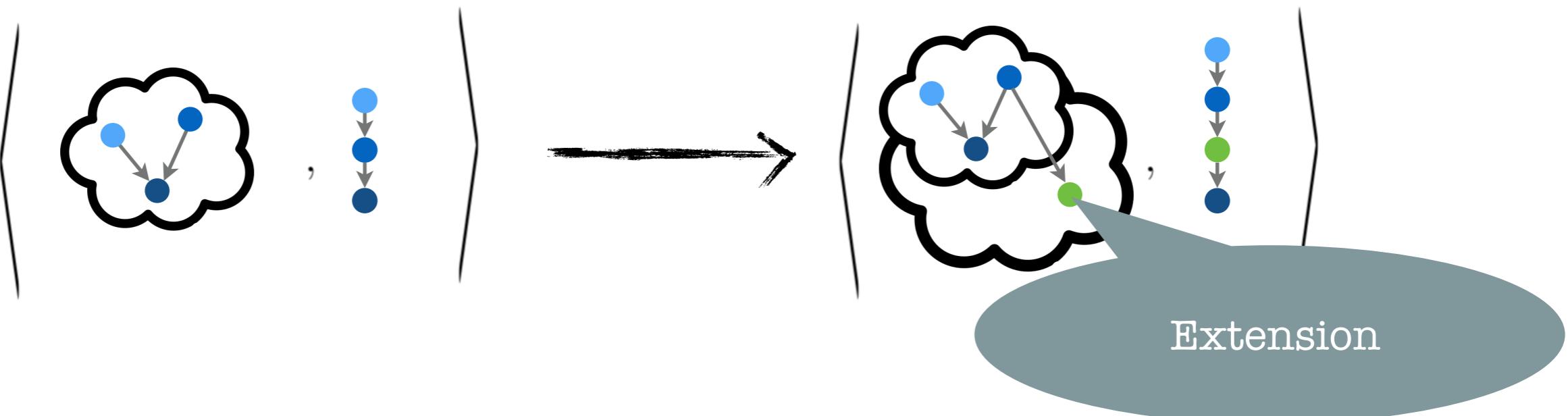
# Operational interpretation of a specification $\mathcal{E}(\mathbf{S})$

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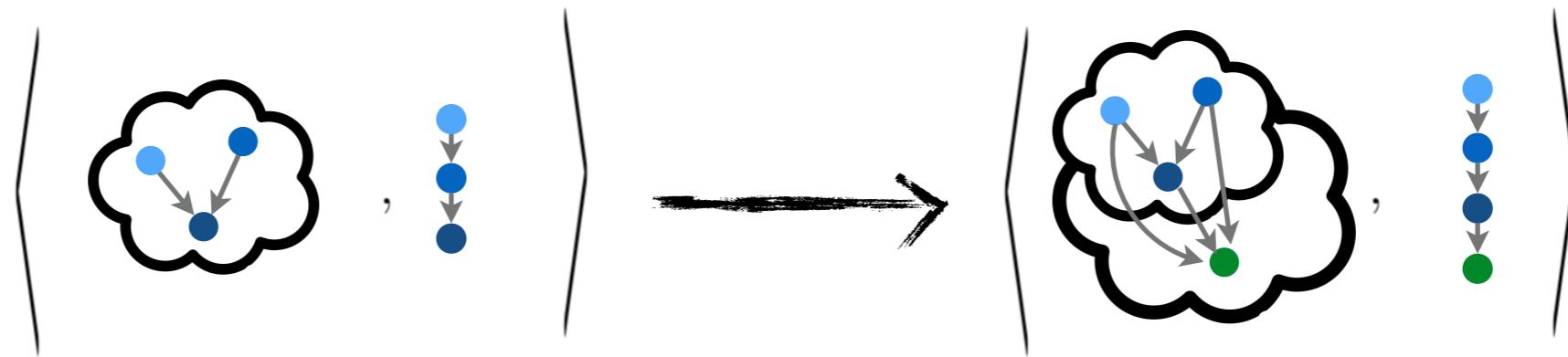
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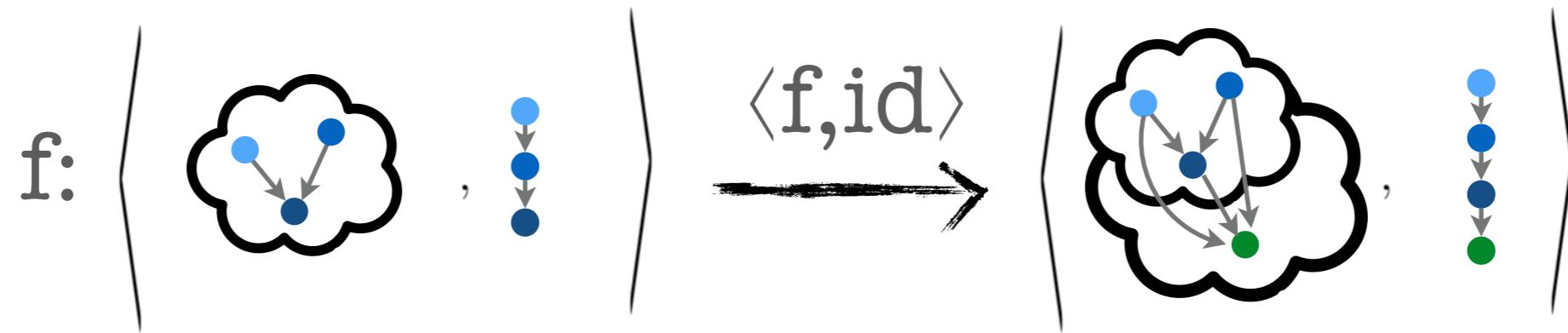
- $\mathcal{E}_m(\mathbf{S})$ : The behaviour of multiple replicas



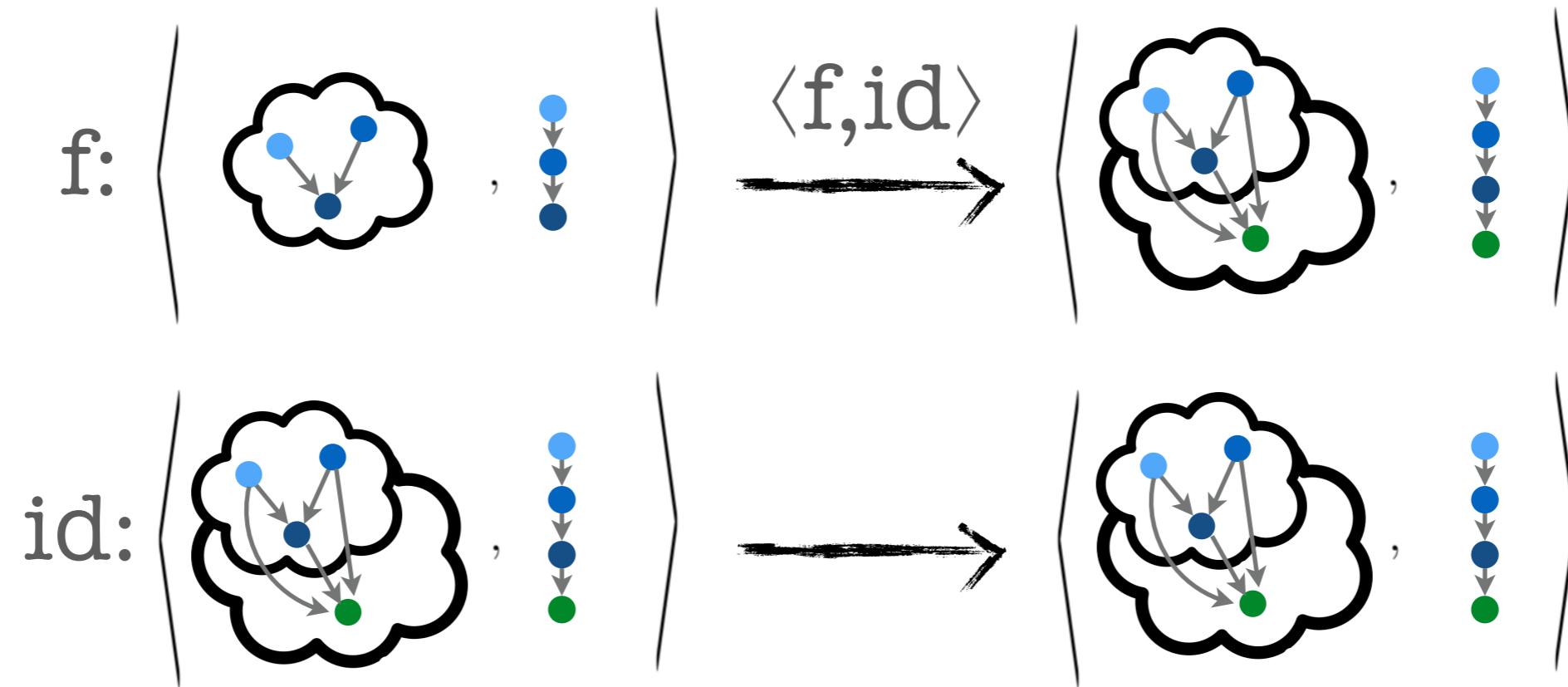
# Recovering labels (Leifer-Milner approach)



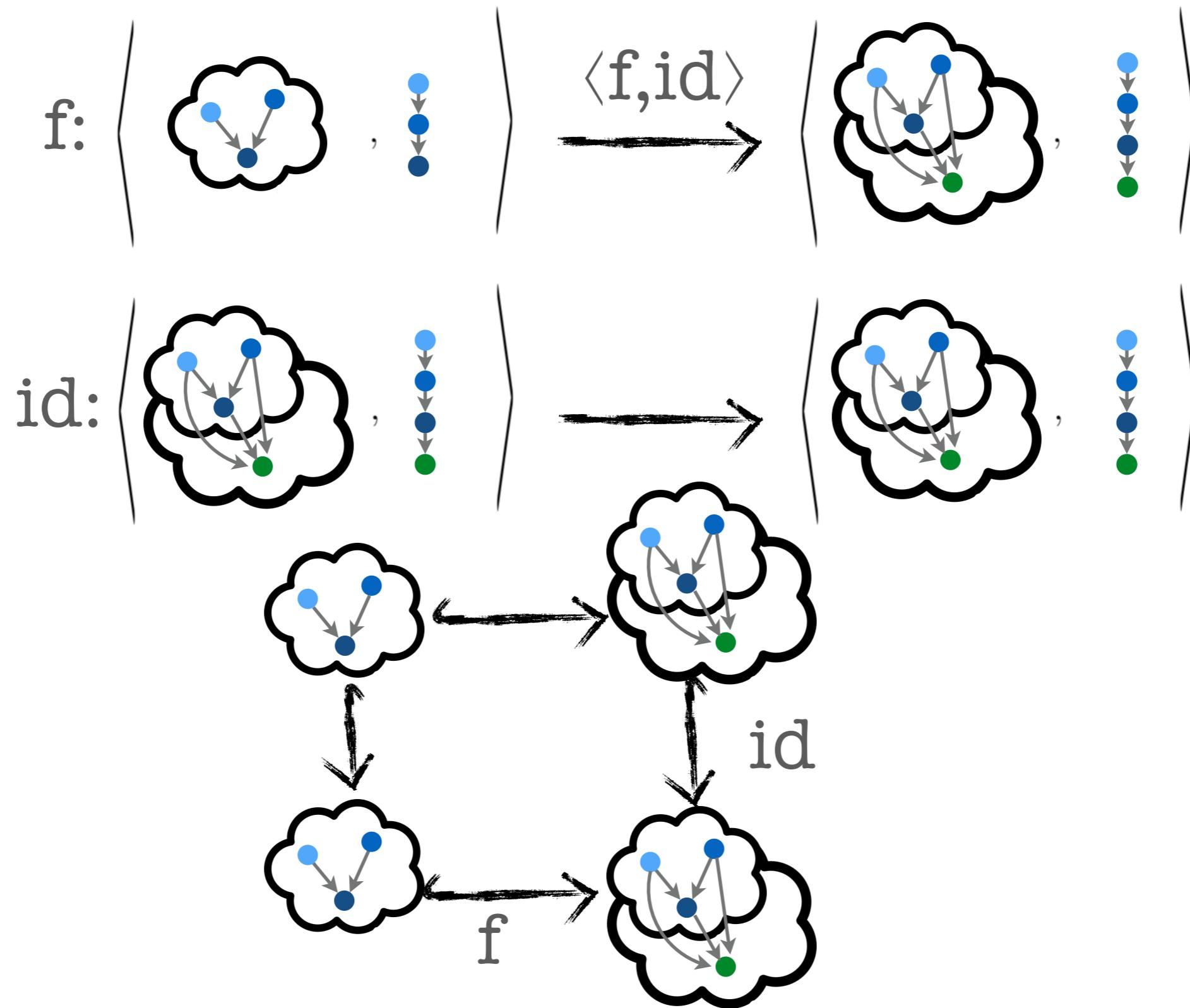
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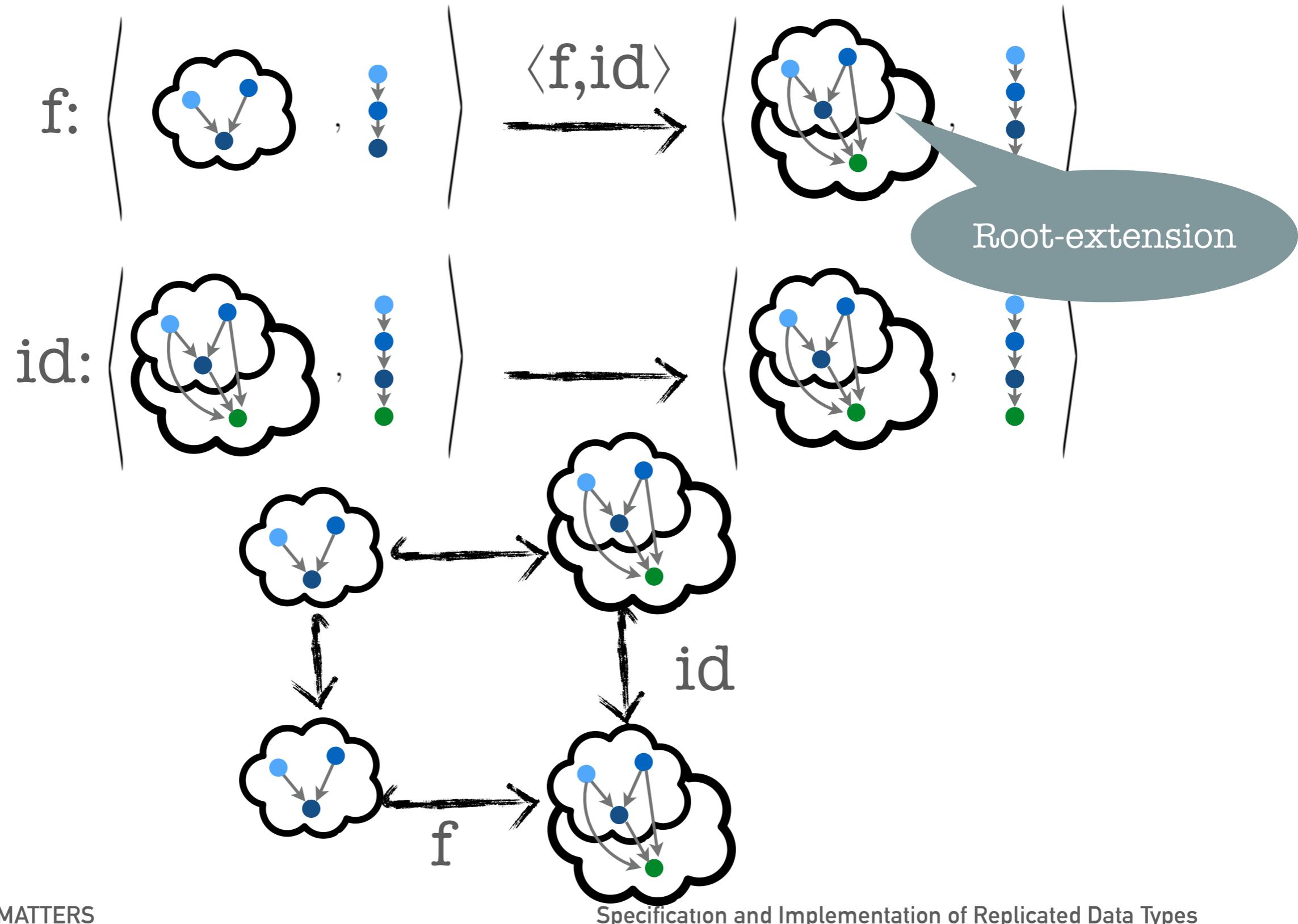
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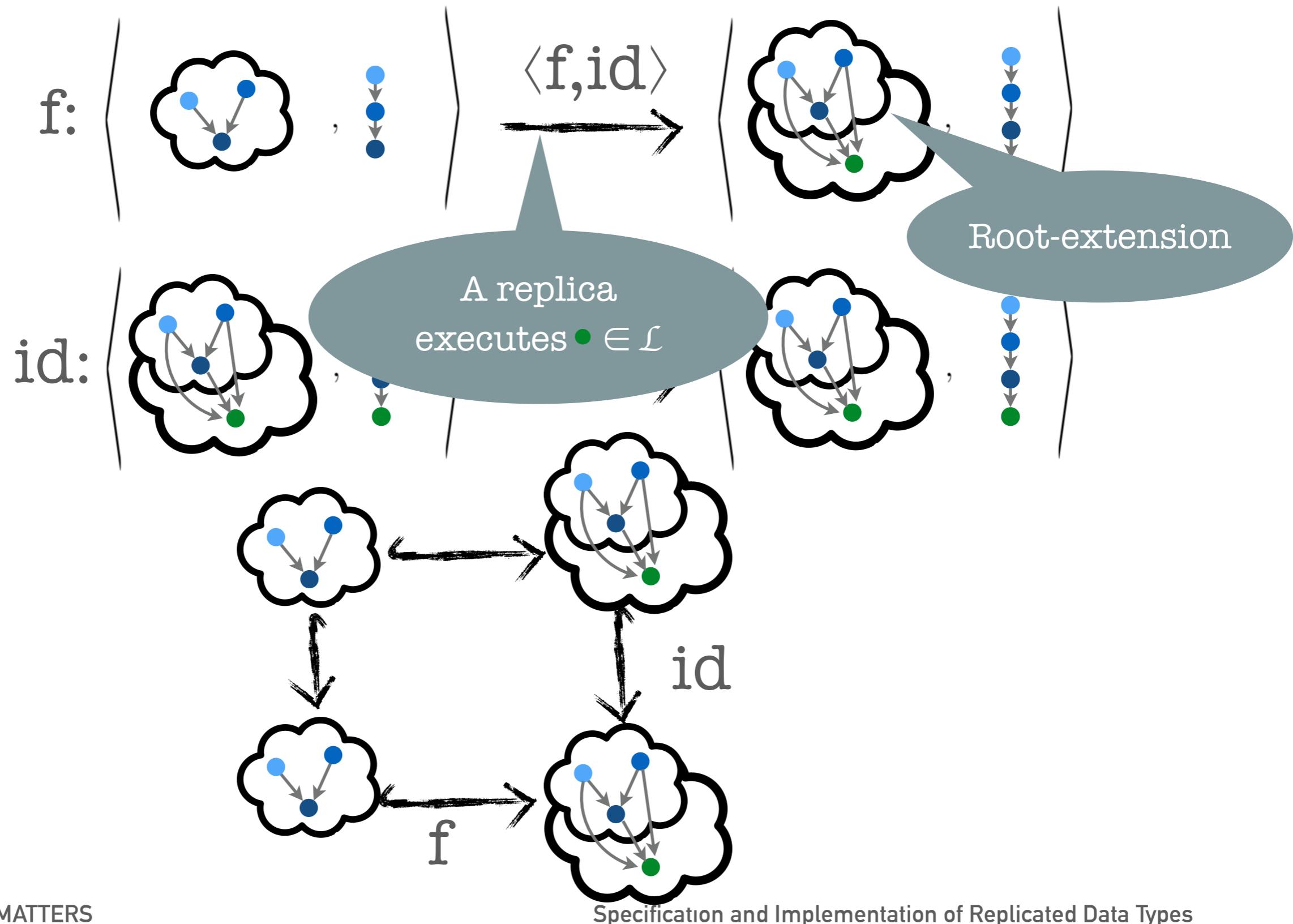
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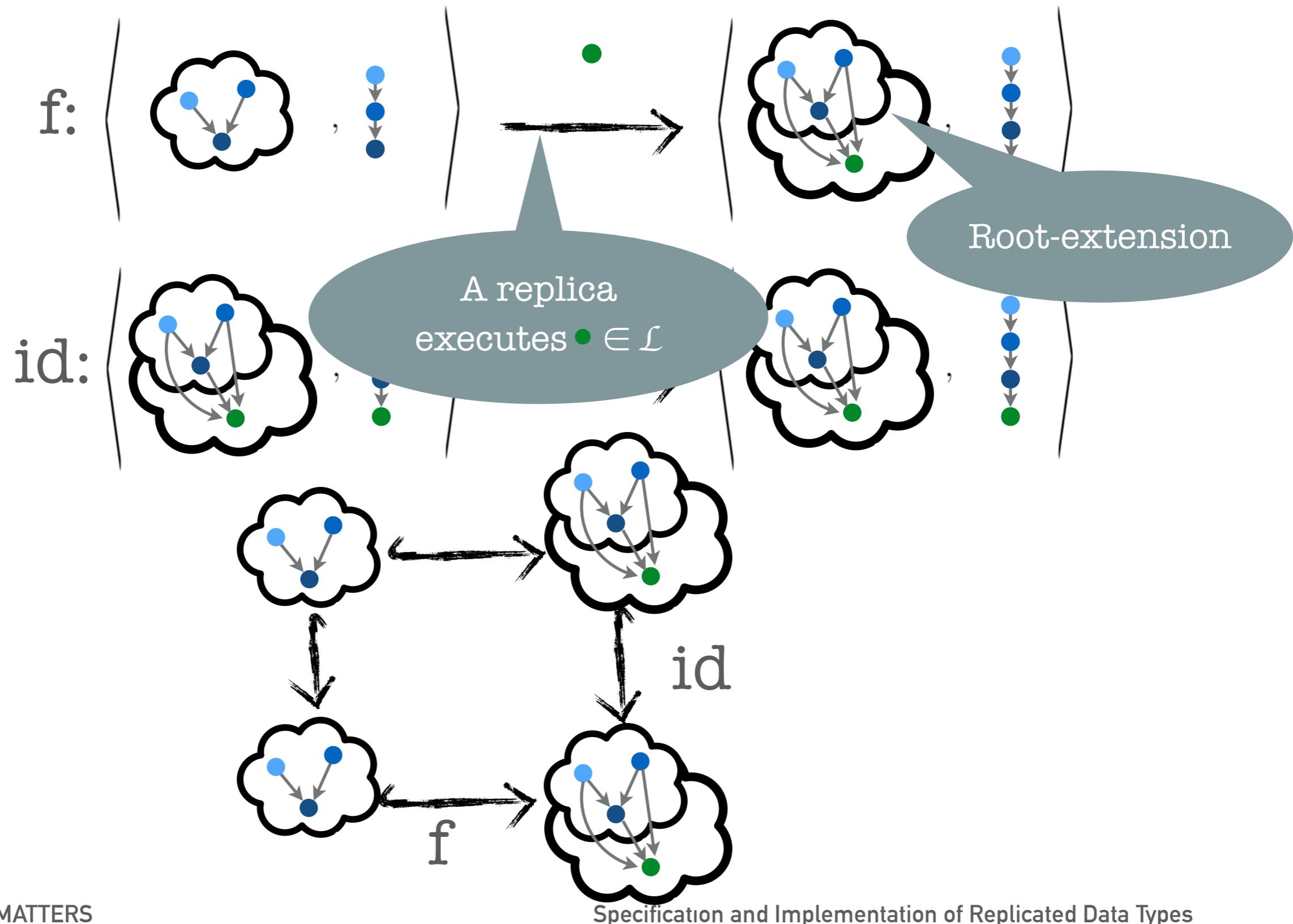
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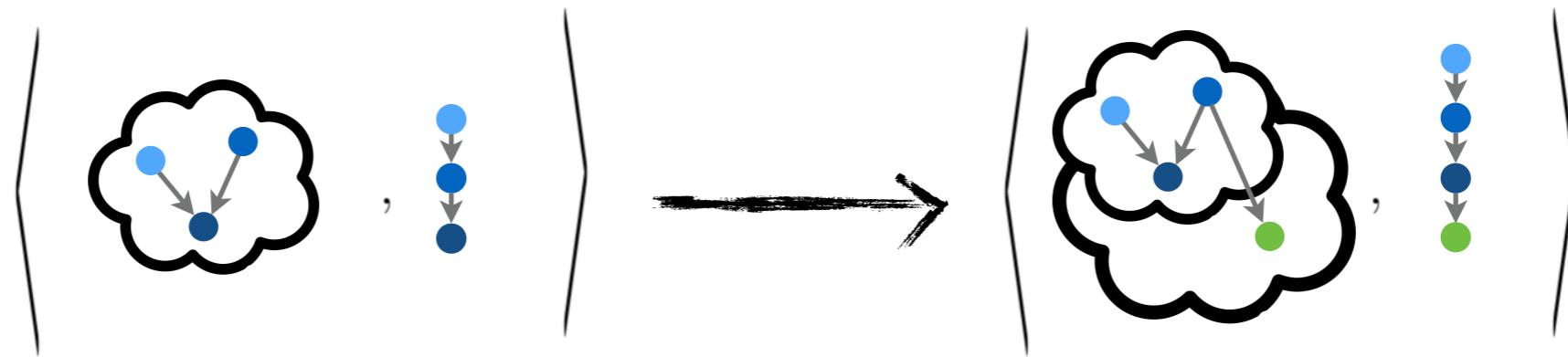
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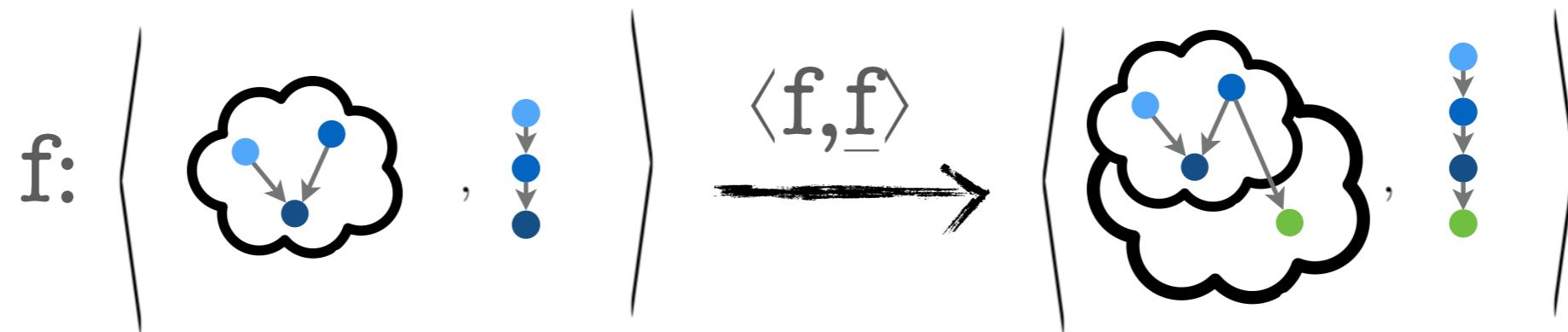
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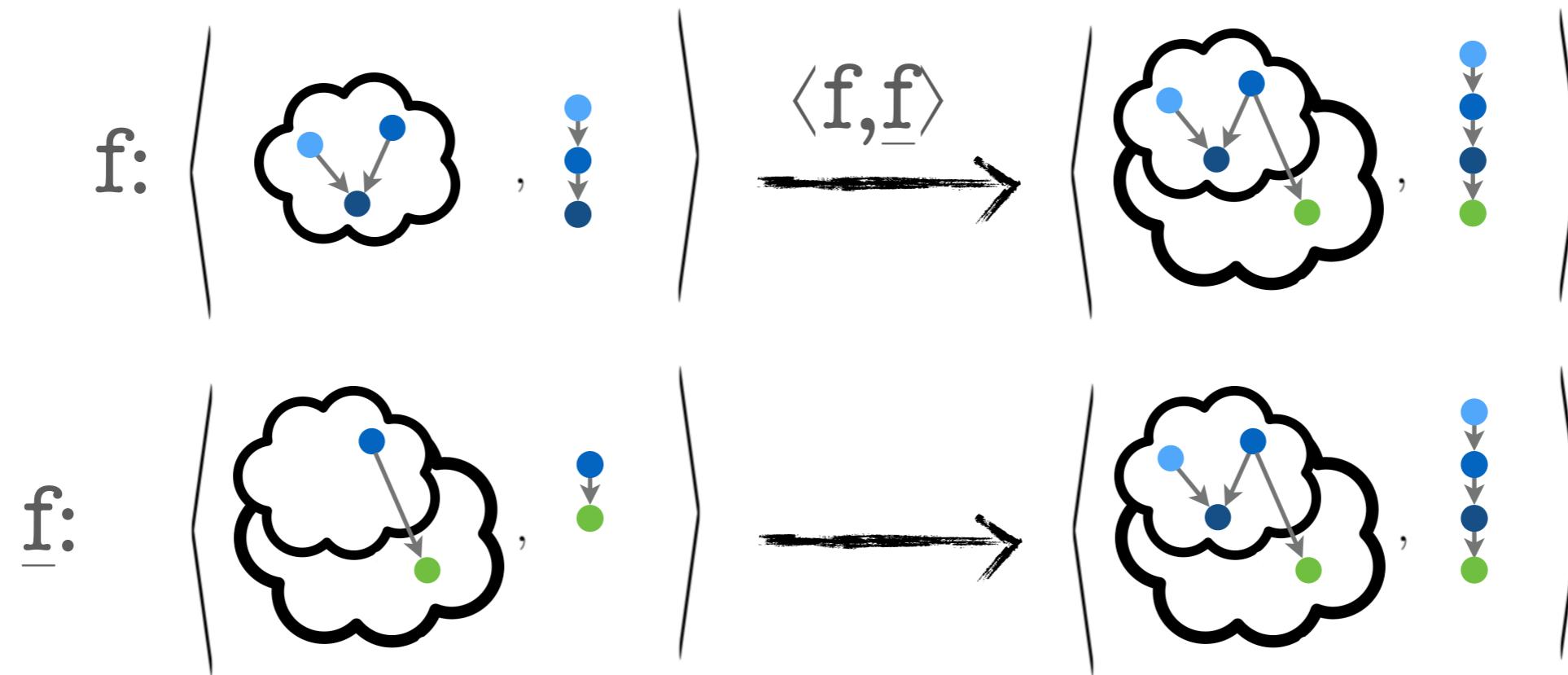
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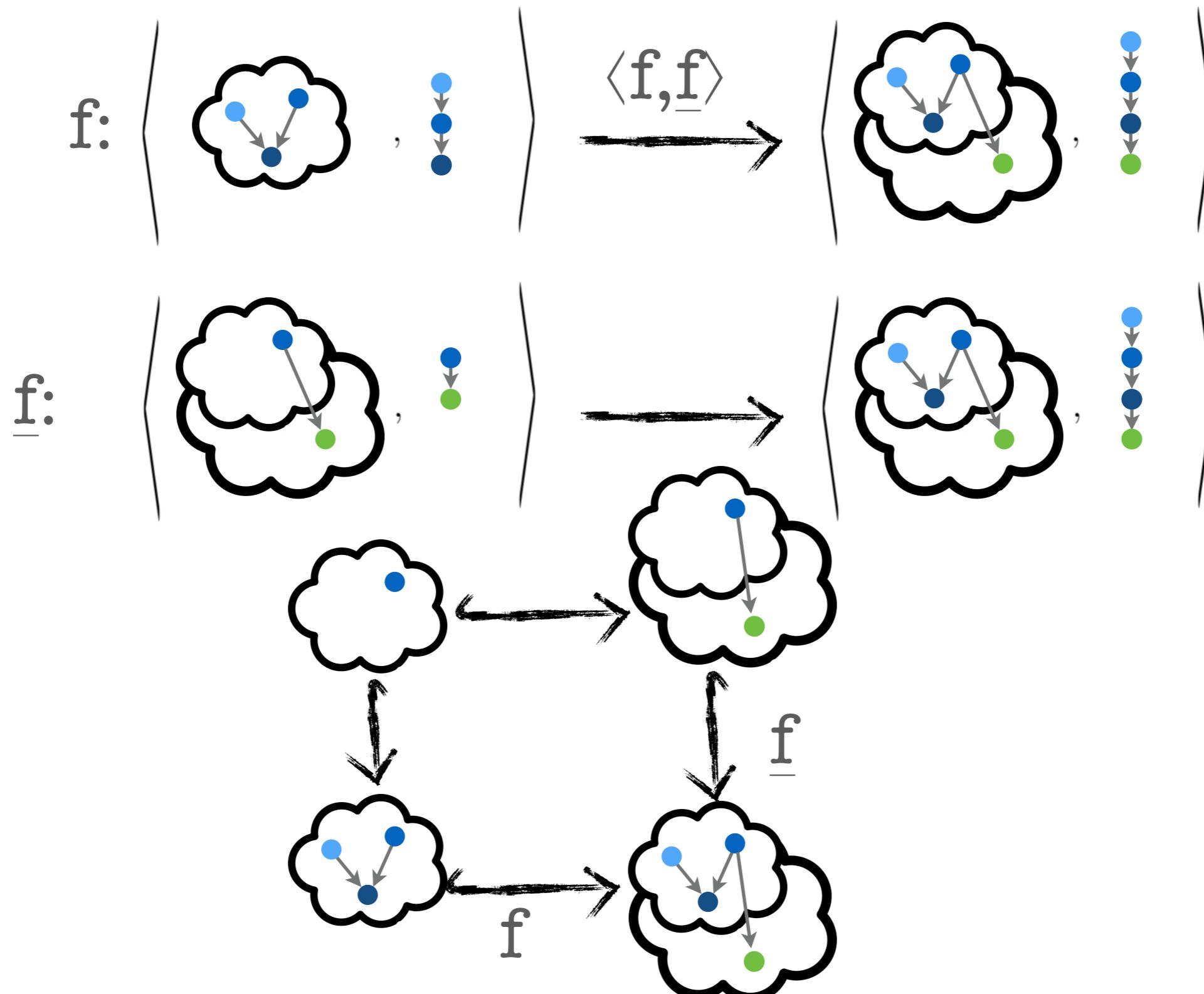
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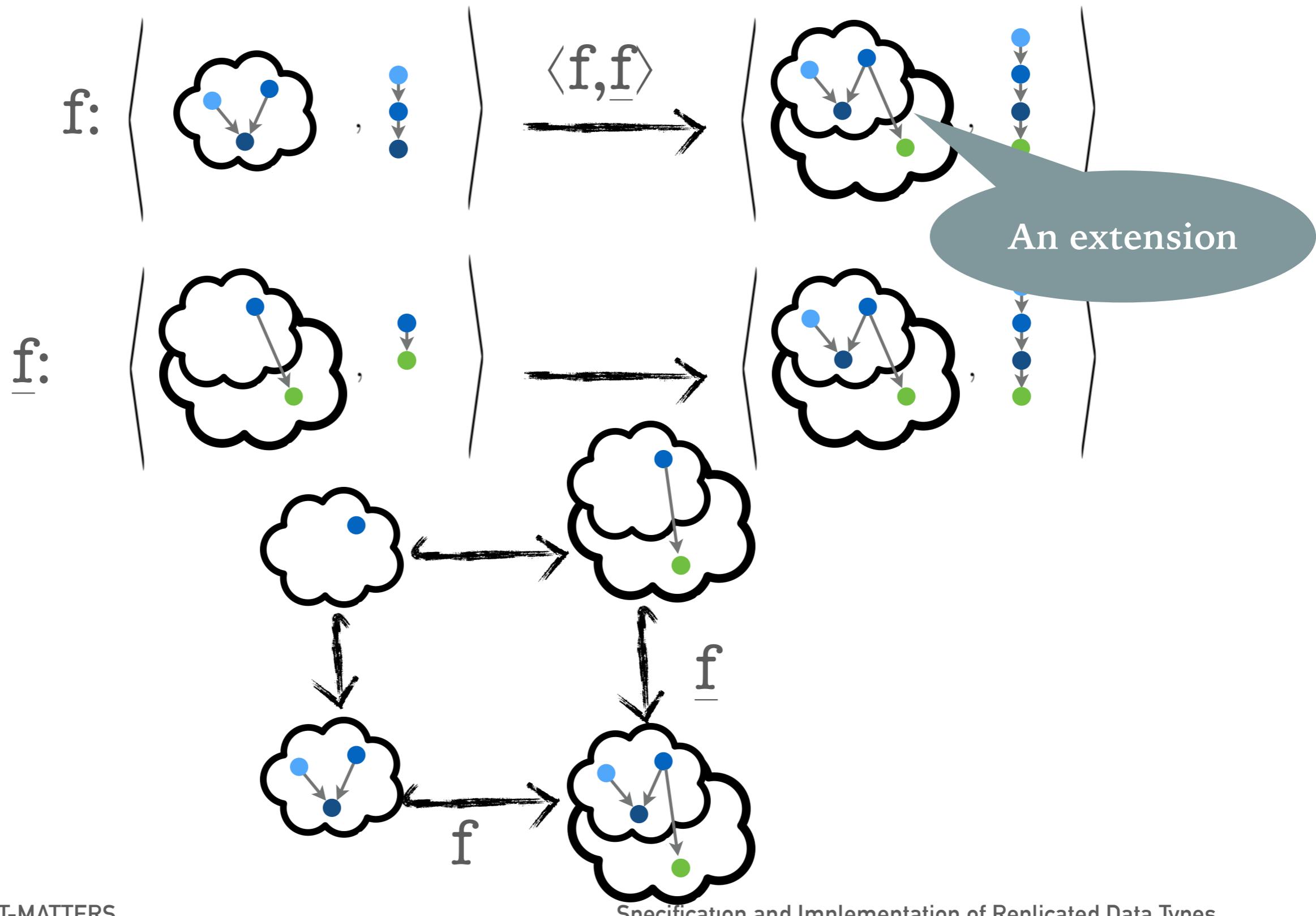
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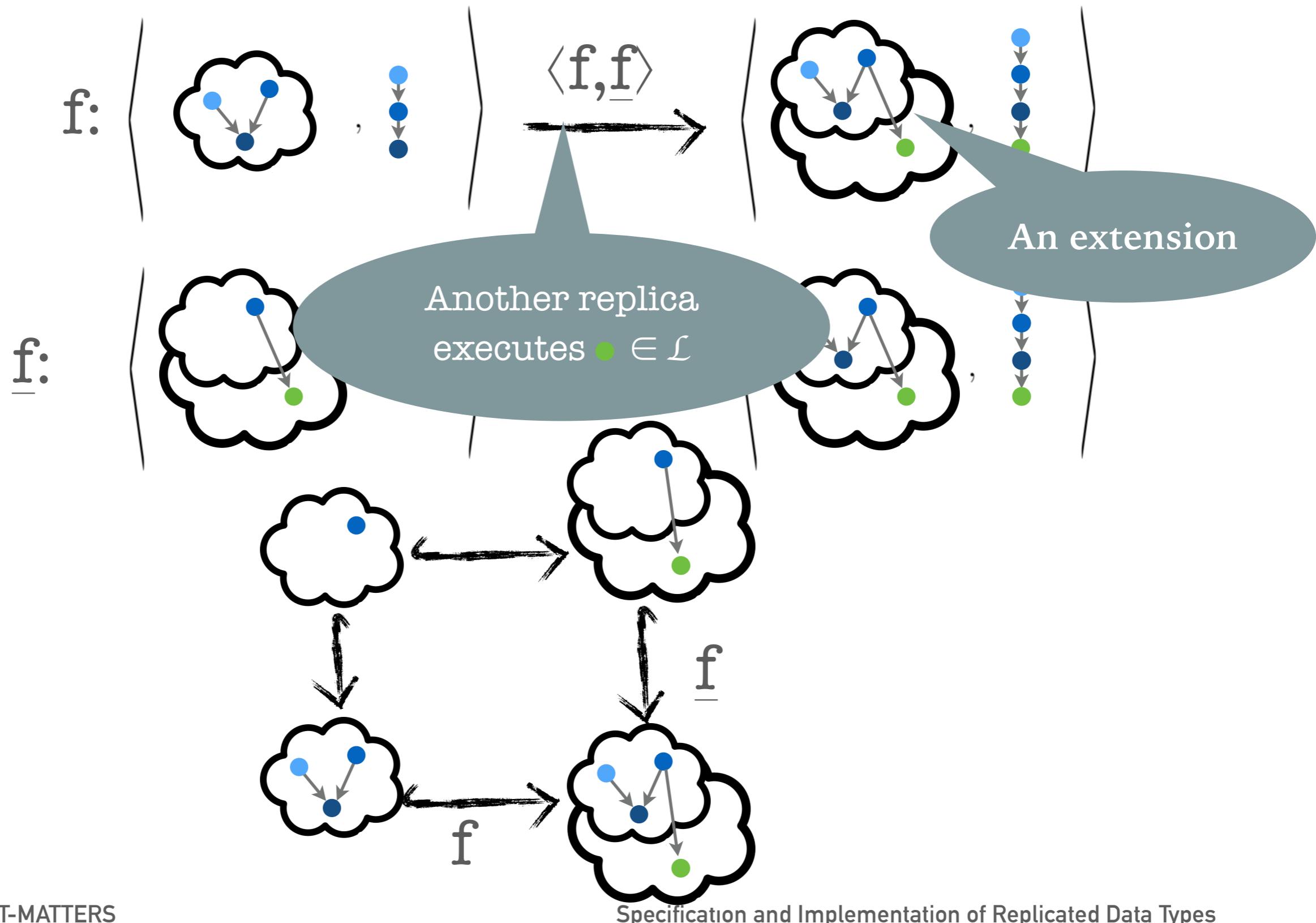
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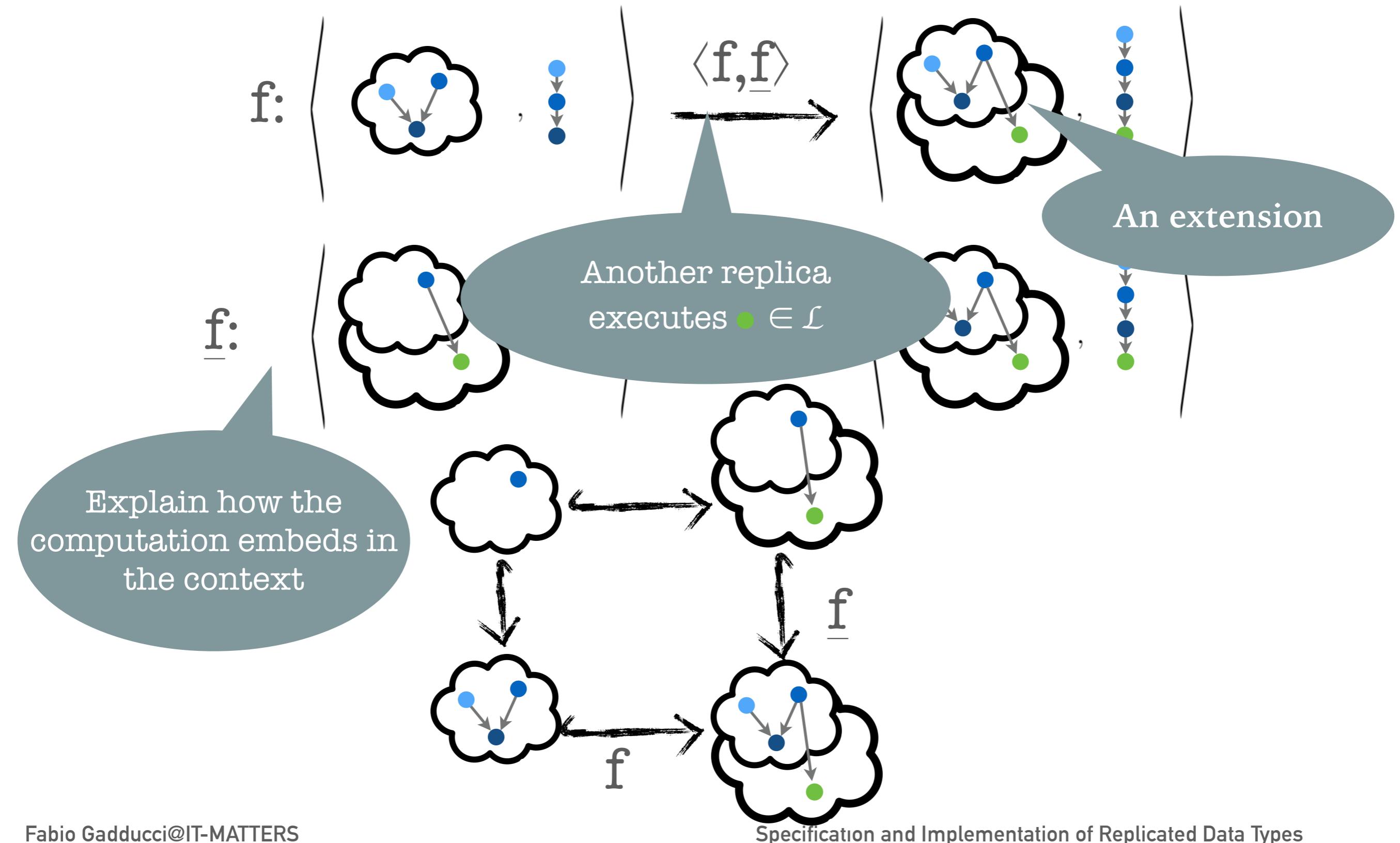
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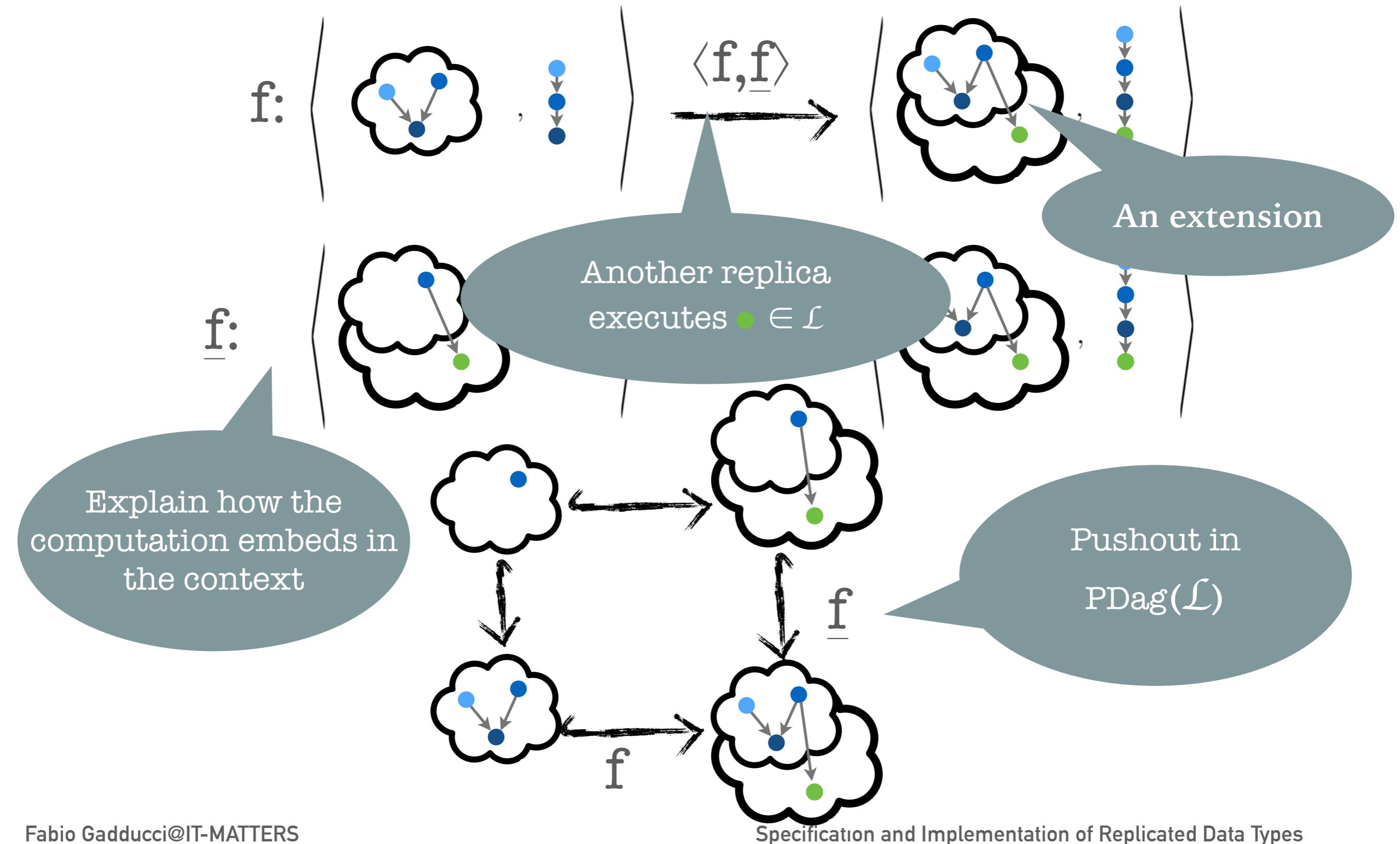
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$$\mathcal{Q} = \langle \Sigma, \oplus, 1, \rightarrow \rangle$$

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$$\frac{\sigma_1 \xrightarrow{l} \sigma'_1 \quad \sigma_1 \xrightarrow{l} \sigma'_2}{\sigma_1 \oplus \sigma_2 \xrightarrow{l} \sigma'_1 \oplus \sigma'_2}$$

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plus a decomposition requirement for  $\sigma_1 \oplus \sigma_2 \xrightarrow{l} \sigma'$

# (Part of an) Implementation of a replicated counter

---

$$\mathcal{Q}_r = \langle \mathbb{N}^{\mathcal{R}}, \max, 0, \rightarrow_r \rangle$$

*states are functions from  
replicas to the naturals*

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# Implementation correctness as simulation

---

An implementation relation  $R_S$  is a relation between states in  $I_S$  and  $C_S$  such that if  $(\sigma, \langle G, P \rangle) \in R_S$  then

1. if  $\sigma \xrightarrow{l} \sigma'$  then  $\exists \langle G', P' \rangle$  such that  $\langle G, P \rangle \xrightarrow{l} \langle G', P' \rangle$  and  $(\sigma', \langle G', P' \rangle) \in R_S$
2. if  $\sigma \xrightarrow{\sigma'} \sigma''$  then  $\exists \langle G', P' \rangle, \langle G'', P'' \rangle$  such that  $\langle G, P \rangle \xrightarrow{\langle G', P' \rangle} \langle G'', P'' \rangle$ ,  $(\sigma', \langle G', P' \rangle) \in R_S$ , and  $(\sigma'', \langle G'', P'' \rangle) \in R_S$

# RDT implementation, categorically

---

- A functor  $\mathbf{I} : \mathbf{IR}(\mathcal{R}) \rightarrow \mathbf{P}(\mathcal{M}on)$ 
  - from the category of sequences of operations performed over replicas ( $\mathbf{IR}(\mathcal{R})$ )
  - to the category of implementation states  $\mathbf{P}(\mathcal{M}on)$

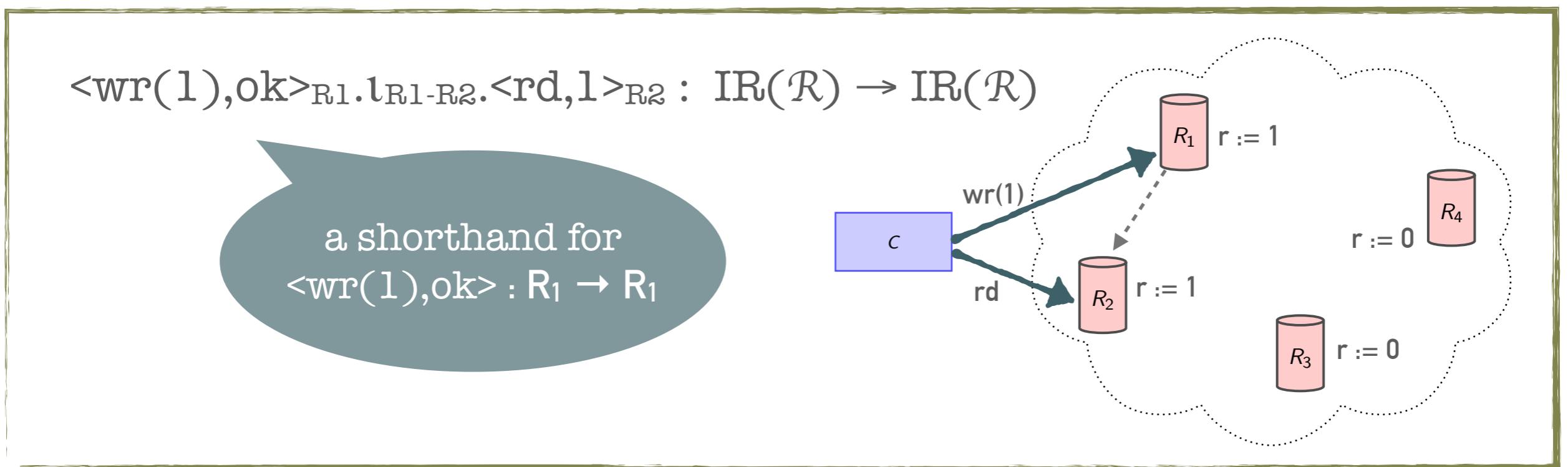
# Category of sequence of operations

---

- One replica category **IR**:
  - One object
  - Words over  $\mathcal{L}$  as arrows
- Multi replica category **IR( $\mathcal{R}$ )** : # $\mathcal{R}$  isomorphic copies of IR

# Category of sequence of operations

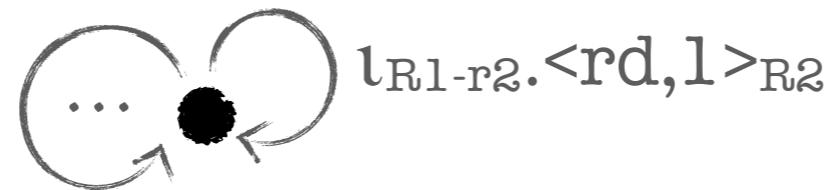
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# Implementation Functor

---

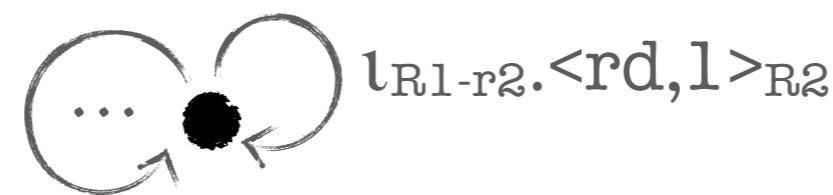
$\mathbf{IR}(\mathcal{R})$



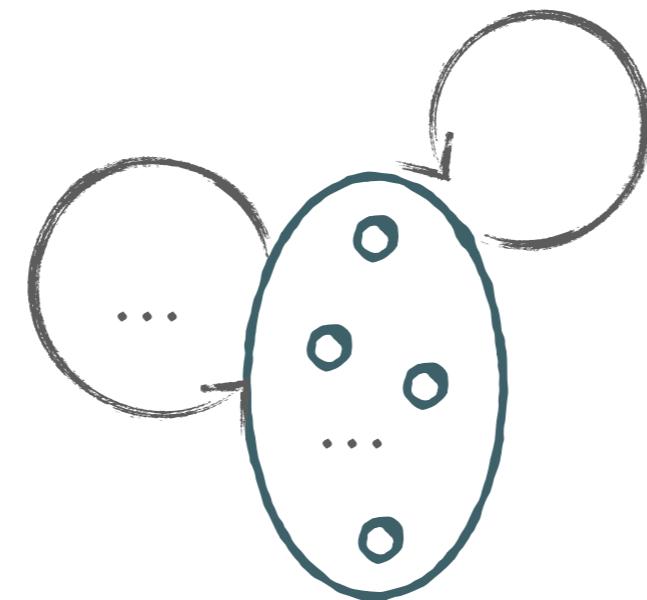
# Implementation Functor

---

$\mathbf{IR}(\mathcal{R})$



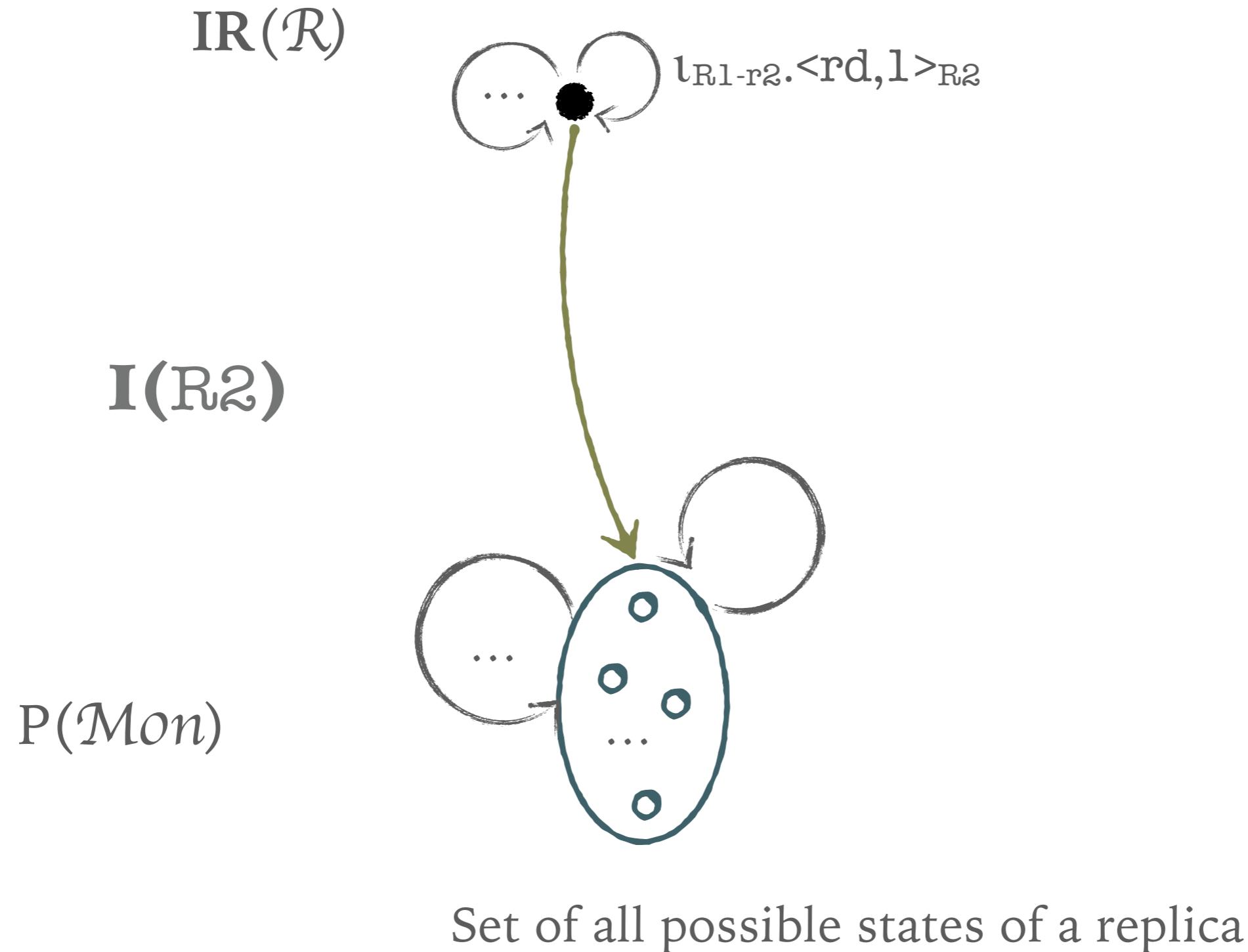
$P(Mon)$



Set of all possible states of a replica

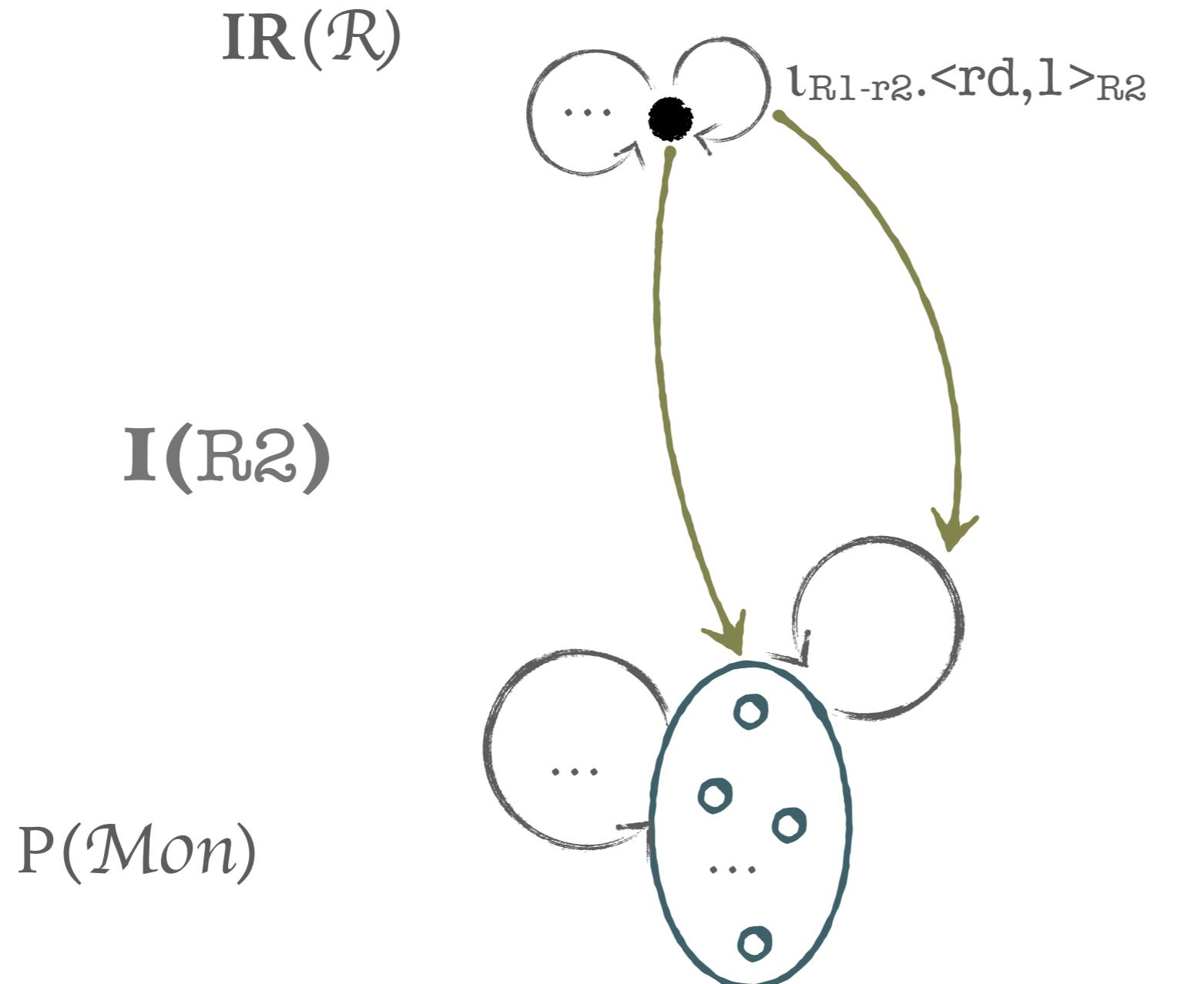
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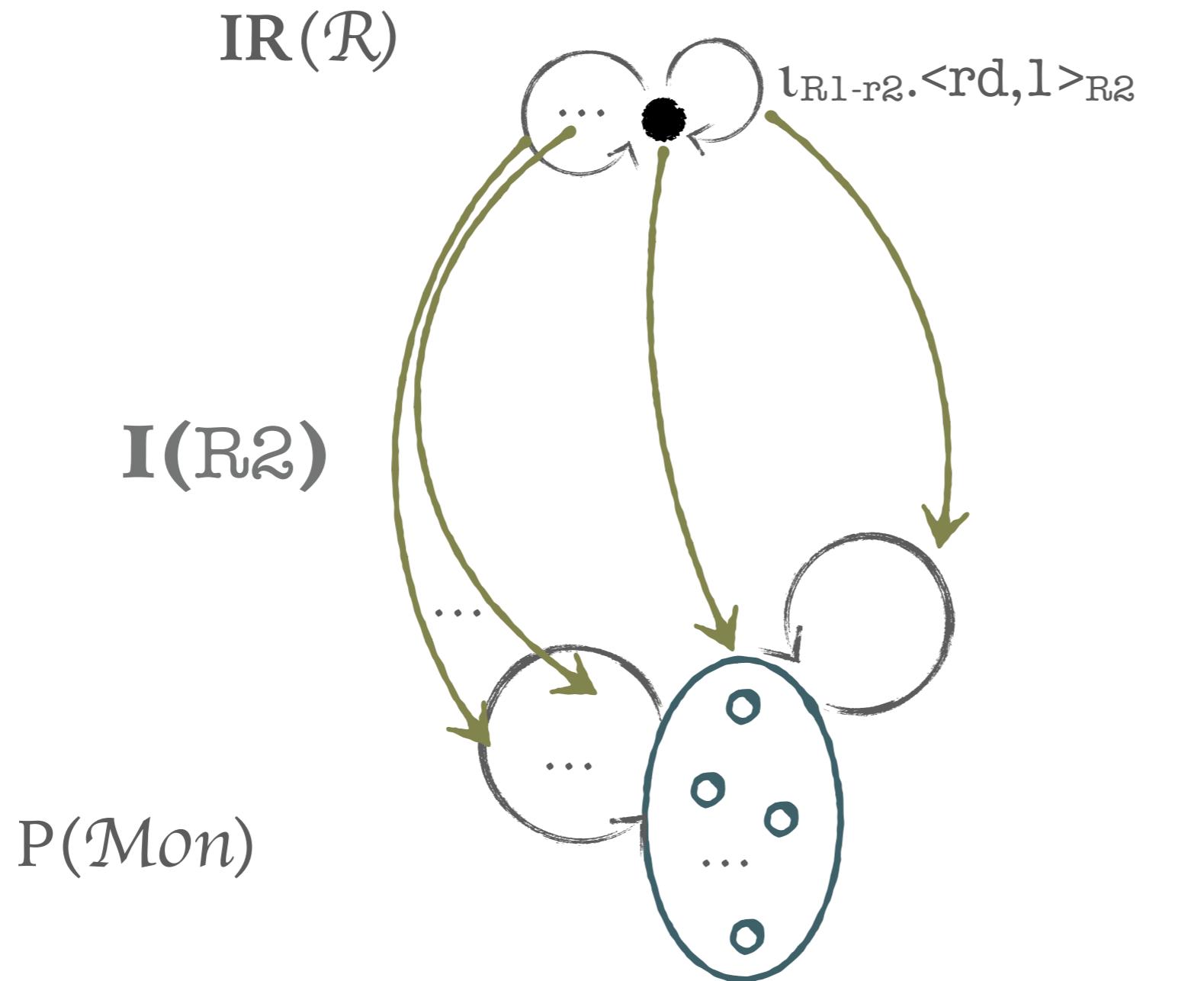
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Set of all possible states of a replica

# Implementation Functor

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Set of all possible states of a replica

# Final words

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- We have provided
  - an algebraic characterisation of the specification and (state-based) implementation of RDTs
  - a notion of implementation correctness in terms of (higher-order) simulation
- The approach suffices to model various well-known RDTs
  - We did not consider labels for `snd` operations because most RDTs implementation communicate full copies of their state
- The approach does not cover operation-based implementations