



Universal Solutions in Temporal Data Exchange

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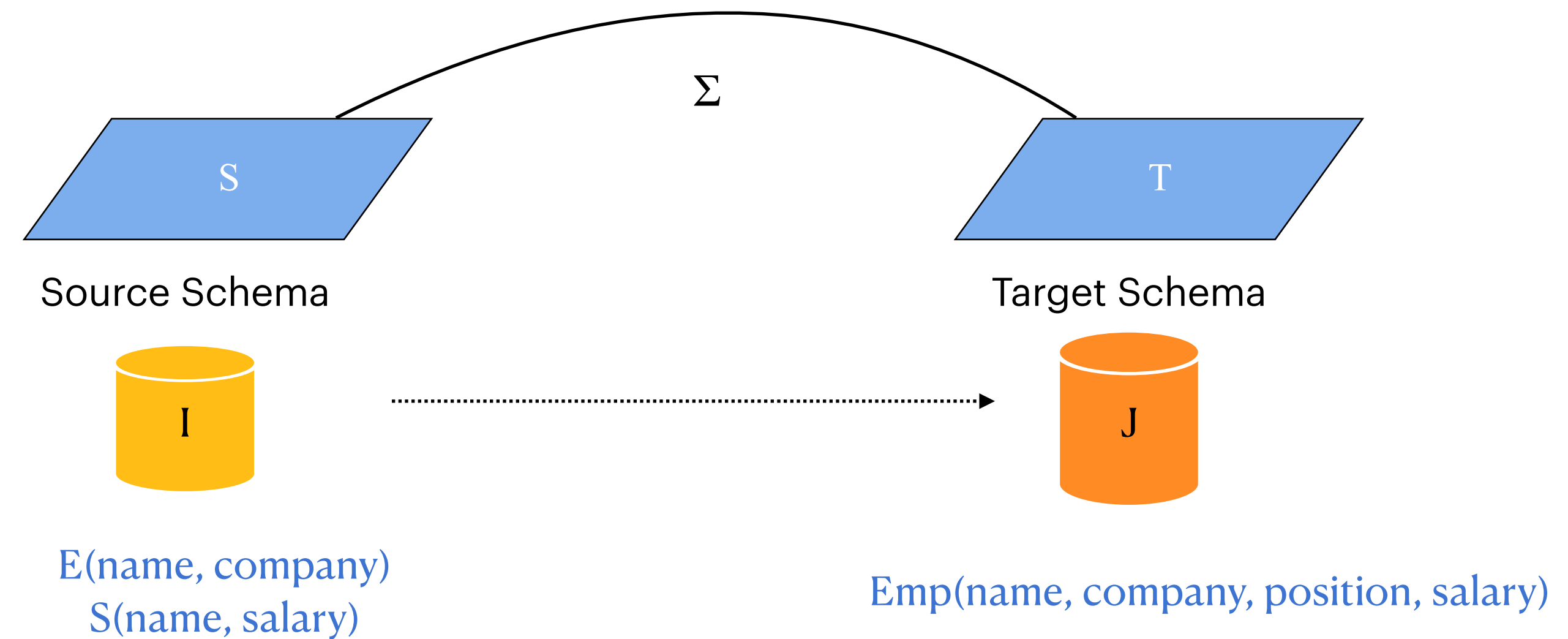
24 September 2020

Data Exchange

Transform data structured under a source schema into data structured under a different target schema.

Schema Mapping $\mathcal{M} = (\mathbf{S}, \mathbf{T}, \Sigma)$

- Relational **source** schema \mathbf{S} , Relational **target** schema \mathbf{T}
- A set Σ of constraints between \mathbf{S} and \mathbf{T}



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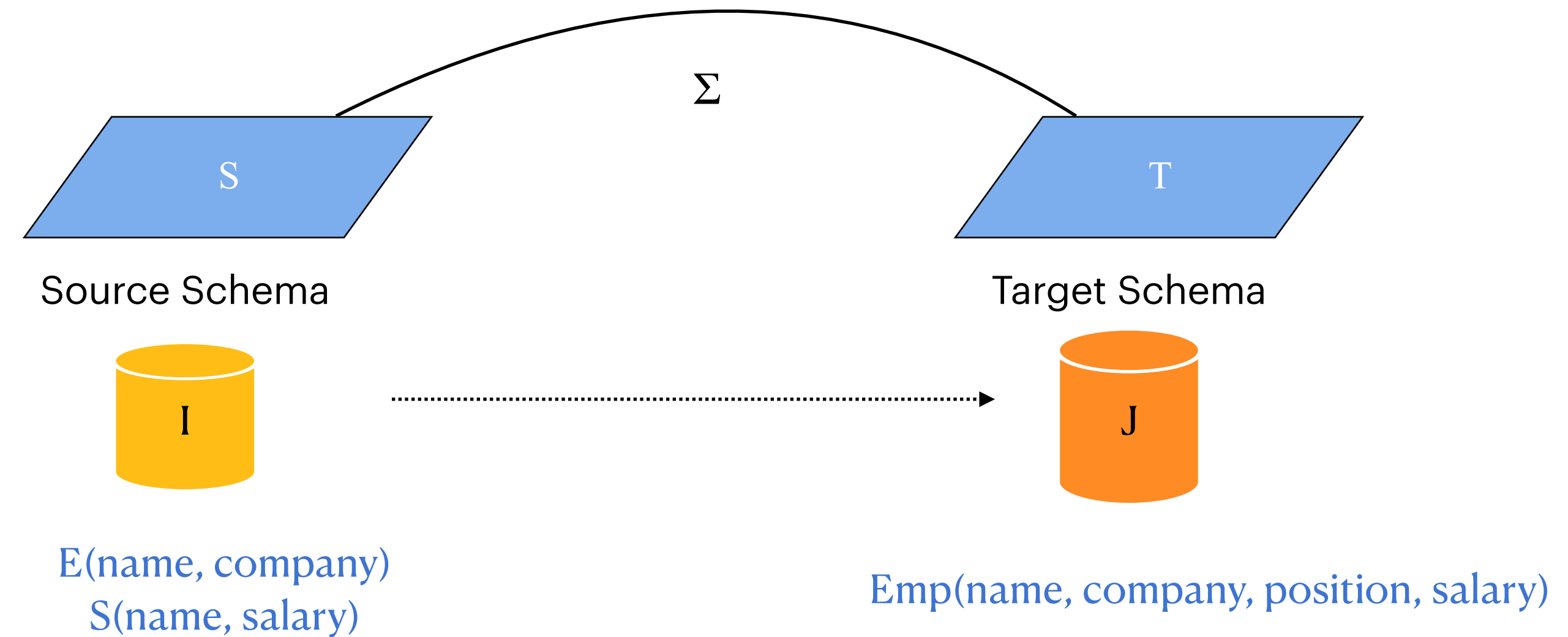
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Constraints:

- source-to-target tuple-generating dependencies (s-t tgds)

$$\forall \mathbf{x}(\phi(\mathbf{x}) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}))$$
- target equality-generating dependencies (target egds)

$$\forall \mathbf{x}(\theta(\mathbf{x}) \rightarrow x_k = x_l)$$



Example:

(s-t tgd) $\forall n, c, p(E(n, c) \wedge P(n, p) \rightarrow \exists s Emp(n, c, p, s))$

(target egd) $\forall n, c, p, s_1, s_2(Emp(n, c, p, s_1) \wedge Emp(n, c, p, s_2) \rightarrow s_1 = s_2)$

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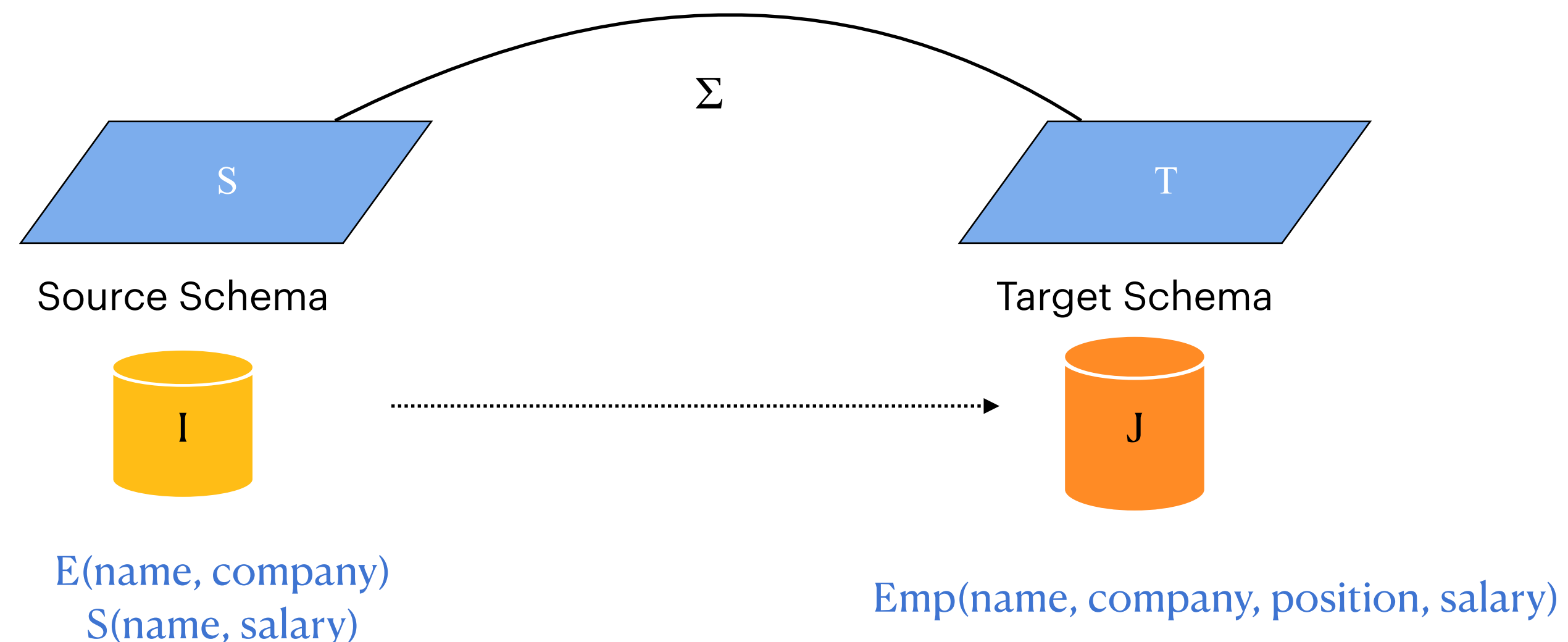
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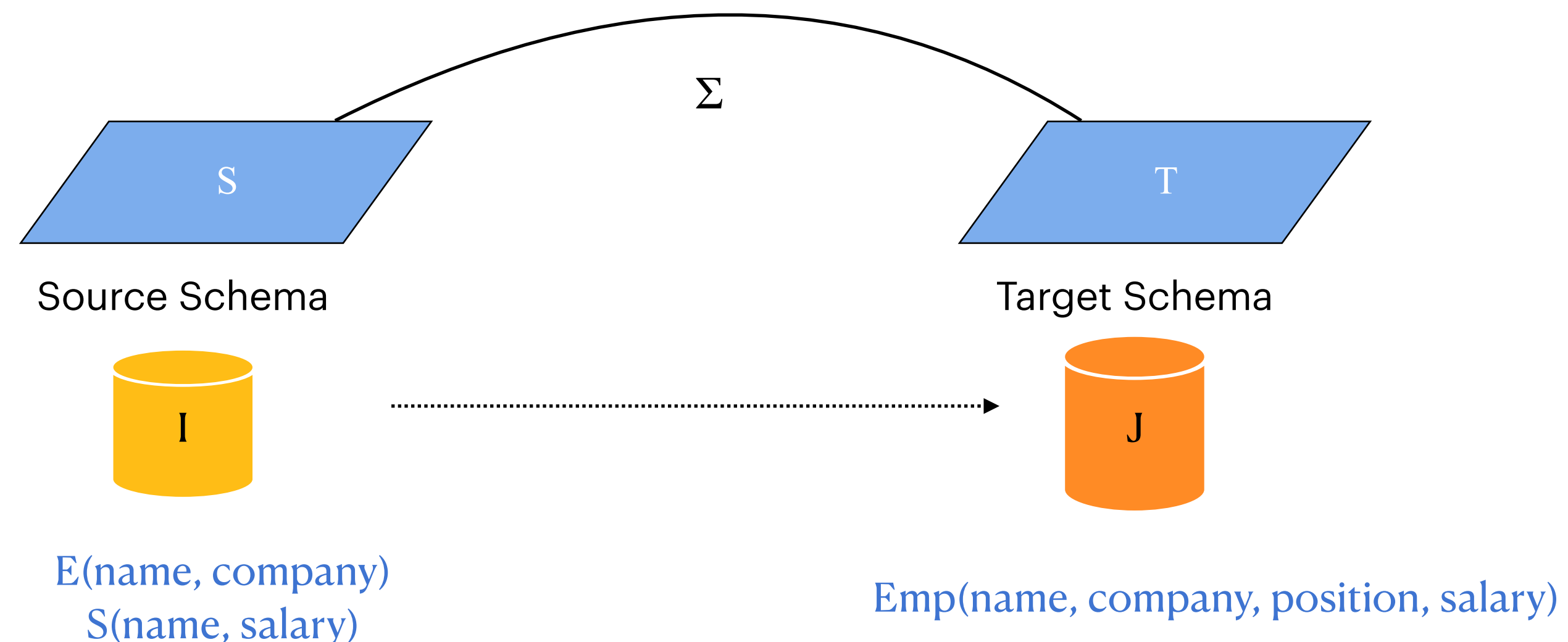
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Universal Solutions: The “most general” solutions (notion formalized using **homomorphisms**)



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Temporal Databases

Abstract Model of Time: Time points (natural numbers)

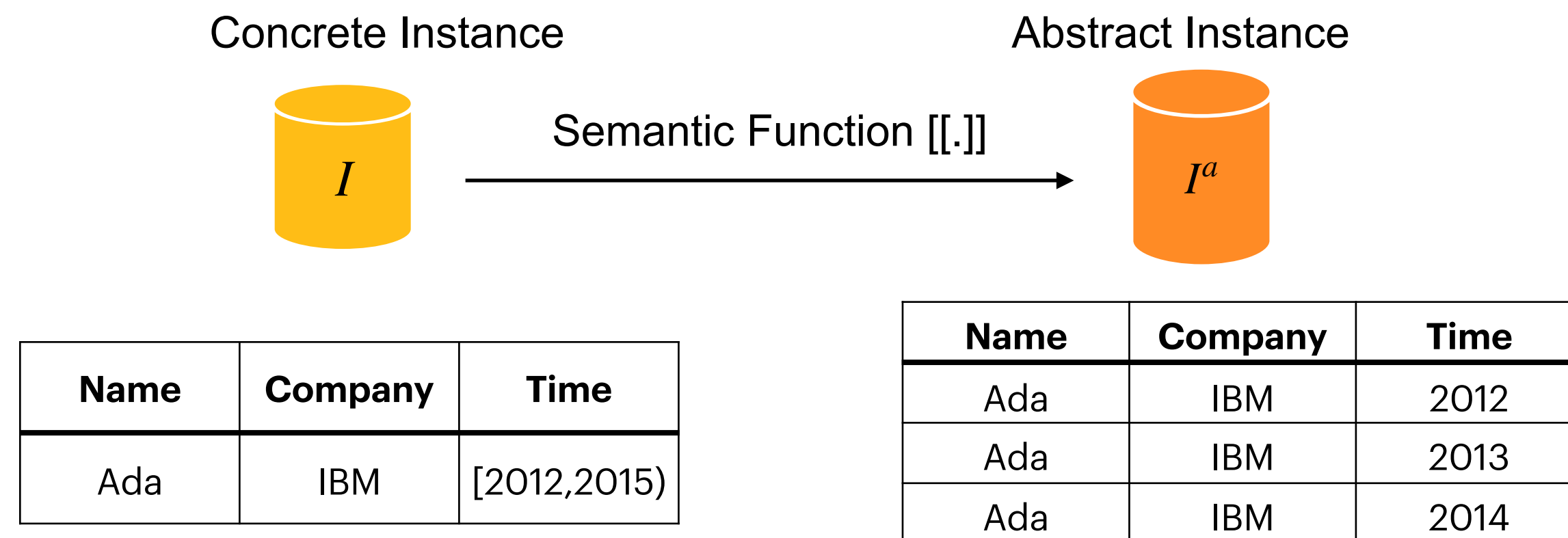
Concrete Model of Time: Time intervals (intervals $[s, e)$)

Temporal Schema: A schema with temporal relations, such as $R(\text{Name}, \text{Company}, \text{Time})$

Abstract Instance: temporal attributes range over time points.

Concrete Instance: temporal attributes range over time intervals.

Semantic Function $[[\cdot]]$: convert all tuples of the form $\mu = (c_1, \dots, c_m, [s, e))$ into $[[\mu]] = \{(c_1, \dots, c_m, t) : s \leq t < e\}$.



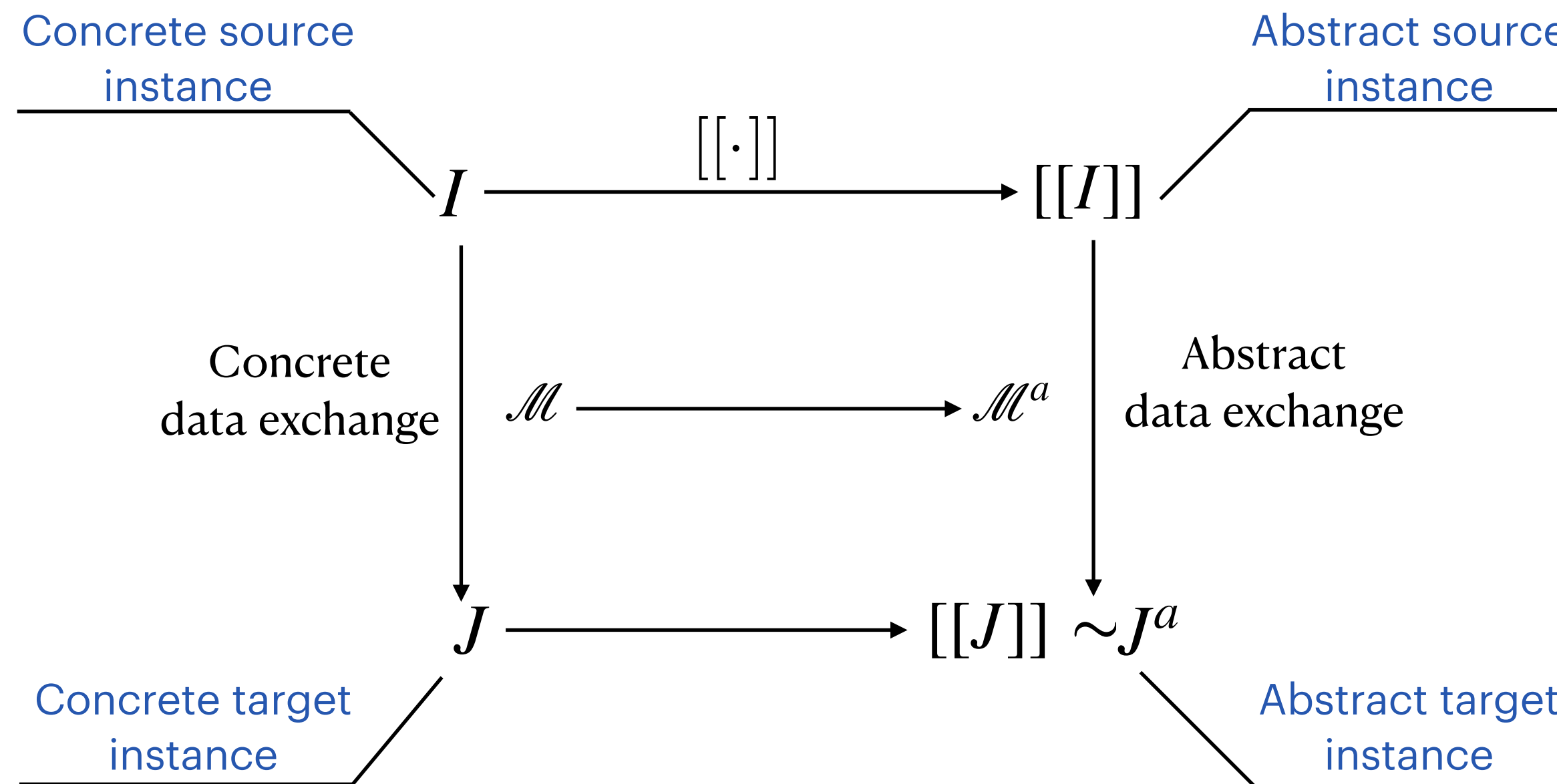
Temporal Data Exchange

Temporal Schema Mapping $\mathcal{M} = (\mathbf{S}, \mathbf{T}, \Sigma_{st}, \Sigma_t)$

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Temporal s-t tgds
 $\forall \mathbf{x}, \mathbf{t}(\phi(\mathbf{x}, \mathbf{t}) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}, \mathbf{t}))$

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 $\forall \mathbf{x}, \mathbf{t}(\theta(\mathbf{x}, \mathbf{t}) \rightarrow x_k = x_l)$



Semantic Adequacy: Let I be a concrete source instance. We say that a concrete target instance J is **semantically adequate** for I if the abstract target instance $[[J]]$ is a universal solution for $[[I]]$ w.r.t. \mathcal{M}^a .

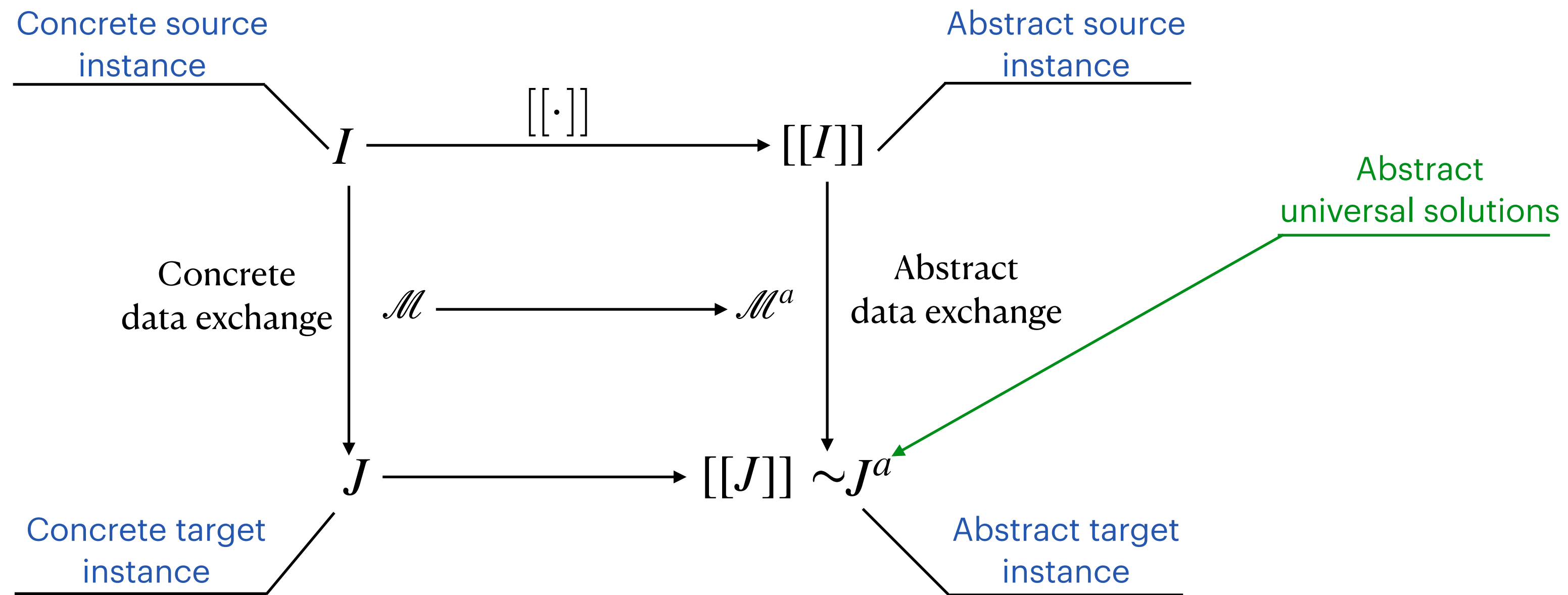
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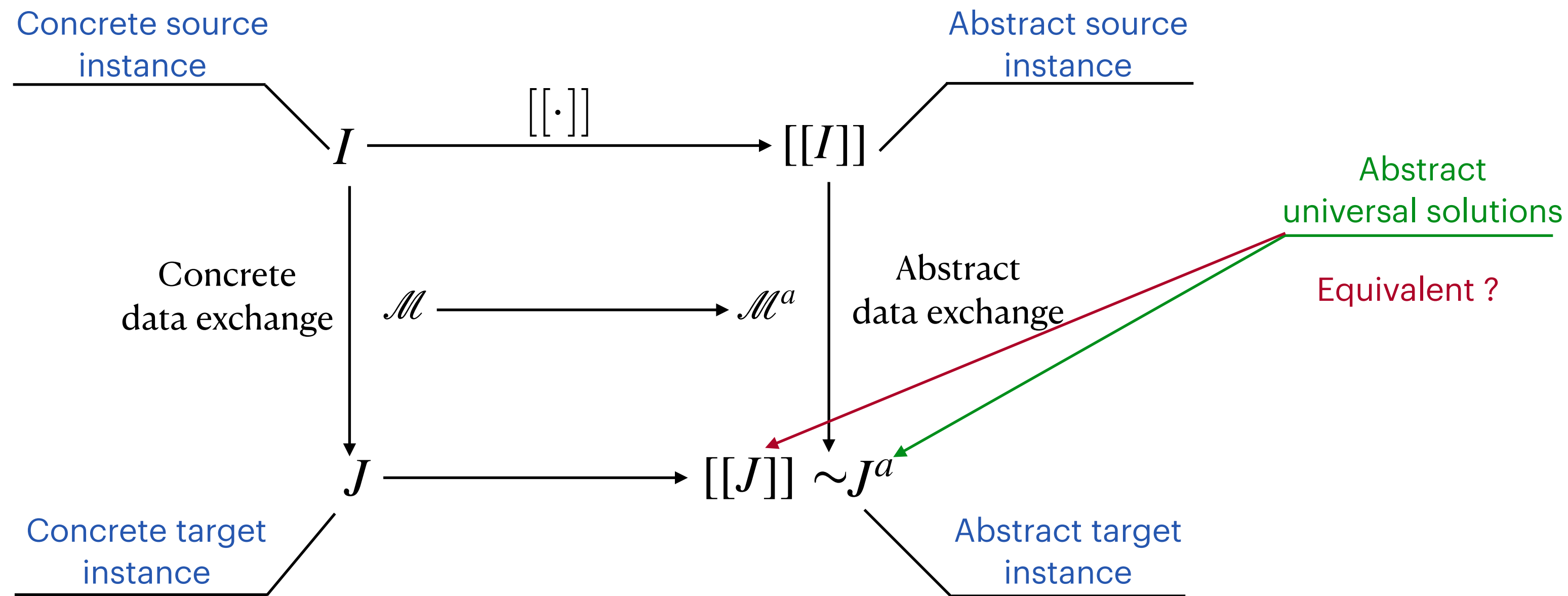
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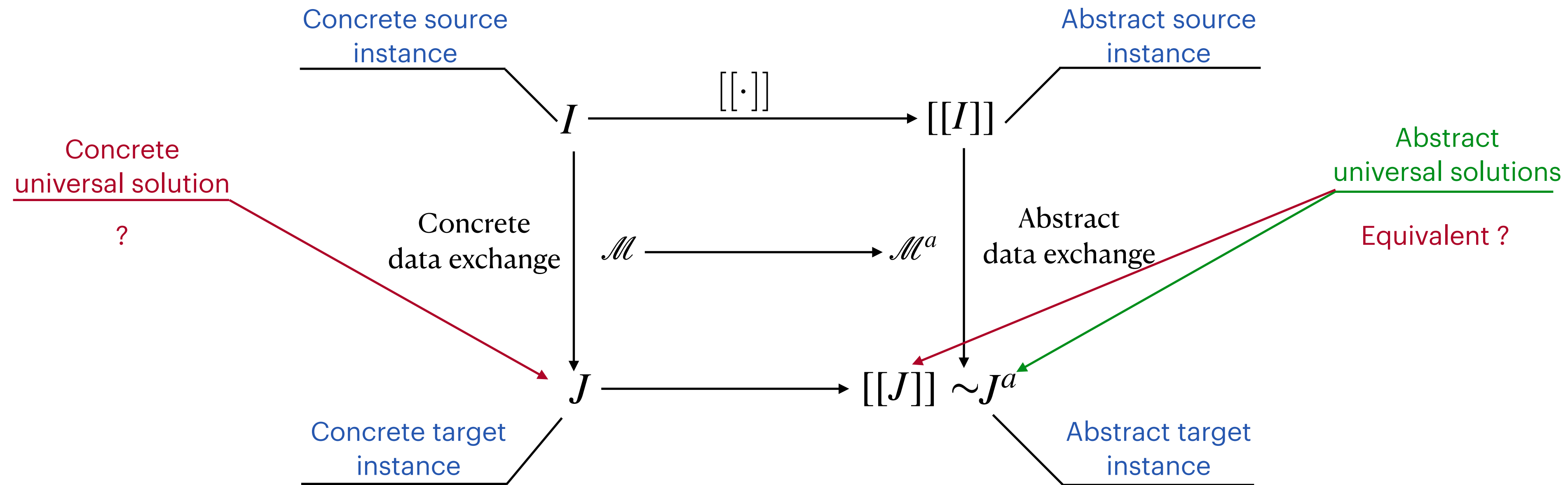
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Challenges in Temporal Data Exchange

- In data exchange, universal solutions are produced using the chase algorithm which introduce **labelled nulls** N_j to witness $\exists \mathbf{y}$ in $\forall \mathbf{x}(\phi(\mathbf{x}) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}))$.
- In **temporal** data exchange, **time-stamped nulls** N_j^t need to be introduced to witness $\exists \mathbf{y}$ in $\forall \mathbf{x}, t(\phi(\mathbf{x}, t) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}, t))$
- Managing time-stamped nulls requires special care when it comes to target constraints $\forall \mathbf{x}, t(\theta(\mathbf{x}, t) \rightarrow x_k = x_l)$
- This becomes a challenging problem when multiple temporal variables are used in tgds.

Temporal Data Exchange: **Single Temporal Variable**

Golshanara, L. and Chomicki, J.: Temporal data exchange. *Inf. Syst.* 87 (2020)

Considered **temporal schema mappings** $\mathcal{M} = (\mathbf{S}, \mathbf{T}, \Sigma_{st}, \Sigma_t)$, in which

- **Every** relation symbol in \mathbf{S} and \mathbf{T} has **one** temporal attribute
- Each constraint in $\Sigma_{st} \cup \Sigma_t$ contains **exactly one** temporal variable
- Hence, the only temporal variable occurs in every atom of the consequent of s-t tgds; no temporal variable is existentially quantified.

$$\text{Temporal s-t tgd} \\ \forall \mathbf{x}, t(\phi(\mathbf{x}, t) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}, t))$$

$$\text{Temporal target egd} \\ \forall \mathbf{x}, t(\theta(\mathbf{x}, t) \rightarrow x_k = x_l)$$

Example:

S
E(name, company, time)
S(name, salary, time)

T
Emp(name, company, position, salary, time)

$$\text{(s-t tgd)} \quad \forall n, c, p, t(E(n, c, t) \wedge P(n, p, t) \rightarrow \exists s \text{Emp}(n, c, p, s, t))$$

$$\text{(target egd)} \quad \forall n, c, p, s_1, s_2, t(\text{Emp}(n, c, p, s_1, t) \wedge \text{Emp}(n, c, p, s_2, t) \rightarrow s_1 = s_2)$$

Theorem. Let \mathcal{M} be a temporal schema mapping as above. There is a polynomial-time algorithm such that, given a concrete source instance I ,

- a) if a solution for $[[I]]$ exists, then the algorithm produces a **semantically adequate** concrete target instance J for I w.r.t. \mathcal{M} .
- b) if there is no solution for $[[I]]$, then the algorithm fails.

Note: They did not address the question of whether there is **always** a **concrete universal solution** that is **semantically adequate** for I .

Temporal Data Exchange: **Single Temporal Variable**

Theorem 1. There are

- a temporal schema mapping $\mathcal{M}^* = (\mathbf{S}, \mathbf{T}, \Sigma_{st}^*, \Sigma_t^*)$ with one temporal variable in each constraint in $\Sigma_{st}^* \cup \Sigma_t^*$,

and

- a concrete source instance I^* ,

such that

- there is a concrete universal solution for I^* w.r.t. \mathcal{M}^* , but **no concrete universal solution** is semantically adequate for I^* ;
- there is a concrete universal solution for $\mathcal{N}(I^*)$ w.r.t. \mathcal{M}^* , but **no concrete universal solution** is semantically adequate for $\mathcal{N}(I^*)$.

($\mathcal{N}(I^*)$ is a **normalized** version of I^* , computed in the first step of Golshanara & Chomicki's algorithm)

Hint of proof.

Schema mapping \mathcal{M}^*

$$\text{s-t tgd: } \forall n, s, c, t (E(n, c, t) \wedge S(n, s, t) \rightarrow \text{Emp}(n, c, s, t))$$

$$\text{s-t tgd: } \forall n, c, p, t (P(n, p, t) \rightarrow \exists c \text{EmpPos}(n, c, p, t))$$

$$\text{target egd: } \forall n, c_1, c_2, s, p, t (\underbrace{\text{Emp}(n, c_1, s, t)} \wedge \underbrace{\text{EmpPos}(n, c_2, p, t)} \rightarrow c_1 = c_2)$$

Source instance I^*

(a) E

Name	Company	Time
Ada	IBM	(2013, 2018)
Bob	IBM	(2012, 2015)

(b) S

Name	Salary	Time
Ada	18000	(2014, 2018)
Bob	13000	(2013, 2015)

(c) P

Name	Position	Time
Ada	Manager	(2015, 2017)
Bob	Consultant	(2012, 2015)

Temporal Data Exchange: **Single Temporal Variable**

Theorem 2. Let $\mathcal{M} = (\mathbf{S}, \mathbf{T}, \Sigma_{st}, \Sigma_t)$ be a temporal schema mapping such that

- (a) each s-t tgd contains **at most one** temporal variable;
- (b) if an s-t tgd contains a temporal variable, then that temporal variable occurs in **every atom** of its consequent;
- (c) each target egd contains **at most one** temporal atom in its antecedent (it may contain non-temporal atoms).

There is a version of chase algorithm such that, given a concrete source instance I ,

- if a solution for $\mathcal{N}(I)$ exists, then the algorithm produces a **semantically adequate concrete universal solution** for $\mathcal{N}(I)$;
- if the algorithm fails, then there is no solution for $[[I]]$ (note $[[I]] = [[\mathcal{N}(I)]]$).

Temporal Data Exchange: Multiple Temporal Variables

Allen's relations on time intervals: m (meets), o (overlaps), <(before), > (after) , and =(equals).

For instance, [2010, 2013) o [2011, 2014)

Concrete s-t tgds $\forall \mathbf{x}, \mathbf{t}(\phi(\mathbf{x}, \mathbf{t}) \wedge \pi(\mathbf{t}) \rightarrow \exists \mathbf{y}\psi(\mathbf{x}, \mathbf{y}, \mathbf{t}))$

Concrete target egds $\forall \mathbf{x}, \mathbf{t}(\theta(\mathbf{x}, \mathbf{t}) \wedge \rho(\mathbf{t}) \rightarrow x_k = x_l)$

Theorem 3. Let $\mathcal{M} = (\mathbf{S}, \mathbf{T}, \Sigma_{st}, \Sigma_t)$ be a concrete schema mapping such that each s-t tgd is **full** and each target egd contains **at most one temporal atom**. There is a polynomial-time algorithm such that given a concrete source instance I ,

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Concrete target egds $\forall \mathbf{x}, \mathbf{t}(\theta(\mathbf{x}, \mathbf{t}) \wedge \rho(\mathbf{t}) \rightarrow x_k = x_l)$

(full s-t tgd) $\forall x_1, x_2, x_3, x_4, t_1, t_2(R_2(x_1, x_2, x_3, t_1) \wedge R_3(x_1, x_4, t_2) \wedge (t_2 \text{ m } t_1) \rightarrow T_2(x_1, x_3, t_2))$

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- if the algorithm fails, then there is no solution for $[[I]]$.

Concluding Remarks

- We showed that **semantically adequate universal solutions** may **not exist** even for temporal schema mappings with single temporal variable.
- We identified classes of schema mappings with **single temporal atom** in each target egd, for which semantically adequate universal solutions exist.
- We expanded the original framework of temporal data exchange studied by Golshanara and Chomicki via considering temporal schema mappings **with multiple temporal variables**.
- **Important Open Problem**: Study temporal schema mappings with existentially quantified temporal variables.

Thank you for your attention