

# Handling Fuzzy Unification and Generalization of First-Order Terms over Similar Signatures with Non-Aligned Argument Positions and *Partial* Argument Position Maps

**A Preliminary Overview**

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- ▶ Please beware: **this presentation is a set of working notes that have not yet been thoroughly formally refined**
- ▶ **We extend** our **recent results** on fuzzy *FOT* **unification and generalization** when signatures may have **similar pairs not involving *all* the arguments of either functors**

*OK... And why should we care?...*

- ▶ This applies in *Fuzzy IR* when database **records have no guarantee that the fields of a pair of similar objects are aligned nor that *all* contribute to the similarity in either side**

## Our previous work

*(we assume known all notions and notation defined there)*

Recently, we presented 3 lattice structures over  $FOTs$  (1 crisp and 2 fuzzy), gave declarative axioms and rules and expressed the 6 corresponding dual lattice operations as constraints:

### ▶ Conventional signature

● Unification *(Herbrand–Martelli&Montanari’s)*

✓ Generalization *(declarative version of Reynolds–Plotkin’s)*

### ▶ Signature with aligned similarity

● “Weak” fuzzy unification *(Sessa’s)*

✓ “Weak” fuzzy generalization *(dual to Sessa’s)*

### ▶ Signature with misaligned similarity

✓ Full fuzzy unification *(different/mixed arities)*

✓ Full fuzzy generalization *(different/mixed arities)*

(✓ indicates original contribution)

# Unifying similar functors w/ different arg. number/order

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## GENERIC WEAK TERM DECOMPOSITION

$$( E \cup \{ f(s_1, \dots, s_m) \doteq g(t_1, \dots, t_n) \} )_\alpha$$

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$$( E \cup \{ s_1 \doteq t_{p(1)}, \dots, s_m \doteq t_{p(m)} \} )_{\alpha \wedge \beta}$$

$$[\text{s.t. } f \sim_\beta^p g; 0 \leq m \leq n ]$$

## FUZZY EQUATION REORIENTATION

$$( E \cup \{ f(s_1, \dots, s_m) \doteq g(t_1, \dots, t_n) \} )_\alpha$$

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$$( E \cup \{ g(t_1, \dots, t_n) \doteq f(s_1, \dots, s_m) \} )_\alpha$$

$$[\text{s.t. } 0 \leq n < m ]$$

# Generalizing similar functors w/ different arg. number/order

## FUNCTOR/ARITY SIMILARITY LEFT

$$\frac{\begin{array}{c} \left( \begin{array}{c} \sigma_1^0 \\ \sigma_2^0 \end{array} \right)_{\alpha_0} \vdash \left( \begin{array}{c} s'_1 \\ t'_1 \end{array} \right) u_1 \left( \begin{array}{c} \sigma_1^1 \\ \sigma_2^1 \end{array} \right)_{\alpha_1} \quad \dots \quad \left( \begin{array}{c} \sigma_1^{m-1} \\ \sigma_2^{m-1} \end{array} \right)_{\alpha_{m-1}} \vdash \left( \begin{array}{c} s'_m \\ t'_m \end{array} \right) u_m \left( \begin{array}{c} \sigma_1^m \\ \sigma_2^m \end{array} \right)_{\alpha_m} \end{array}}{\left( \begin{array}{c} \sigma_1^0 \\ \sigma_2^0 \end{array} \right)_{\alpha} \vdash \left( \begin{array}{c} f(s_1, \dots, s_m) \\ g(t_1, \dots, t_n) \end{array} \right) f(u_1, \dots, u_m) \left( \begin{array}{c} \sigma_1^m \\ \sigma_2^m \end{array} \right)_{\alpha_m}}$$

$$[\text{s.t. } f \sim_{\beta}^p g; \quad 0 \leq m \leq n; \quad \alpha_0 \stackrel{\text{def}}{=} \alpha \wedge \beta]$$

where, for  $i = 1, \dots, m$ :

$$\left( \begin{array}{c} s'_i \\ t'_i \end{array} \right)_{\beta_i} \stackrel{\text{def}}{=} \left( \begin{array}{c} s_i \\ t_{p(i)} \end{array} \right) \uparrow_{\alpha_{i-1}} \left( \begin{array}{c} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{array} \right) \quad \text{and} \quad \left( \begin{array}{c} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{array} \right)_{\beta_i} \vdash \left( \begin{array}{c} s'_i \\ t'_i \end{array} \right) u_i \left( \begin{array}{c} \sigma_1^i \\ \sigma_2^i \end{array} \right)_{\alpha_i}$$

# Generalizing similar functors w/ different arg. number/order (ctd.)

## FUNCTOR/ARITY SIMILARITY RIGHT

$$\frac{\begin{array}{c} \left( \begin{array}{c} \sigma_1^0 \\ \sigma_2^0 \end{array} \right)_{\alpha_0} \vdash \left( \begin{array}{c} s'_1 \\ t'_1 \end{array} \right) u_1 \left( \begin{array}{c} \sigma_1^1 \\ \sigma_2^1 \end{array} \right)_{\alpha_1} \quad \dots \quad \left( \begin{array}{c} \sigma_1^{n-1} \\ \sigma_2^{n-1} \end{array} \right)_{\alpha_{n-1}} \vdash \left( \begin{array}{c} s'_n \\ t'_n \end{array} \right) u_n \left( \begin{array}{c} \sigma_1^n \\ \sigma_2^n \end{array} \right)_{\alpha_n} \end{array}}{\left( \begin{array}{c} \sigma_1^0 \\ \sigma_2^0 \end{array} \right)_{\alpha} \vdash \left( \begin{array}{c} f(s_1, \dots, s_m) \\ g(t_1, \dots, t_n) \end{array} \right) g(u_1, \dots, u_n) \left( \begin{array}{c} \sigma_1^n \\ \sigma_2^n \end{array} \right)_{\alpha_n}}$$

$$[\text{s.t. } g \sim_{\beta}^p f; \quad 0 \leq n \leq m; \quad \alpha_0 \stackrel{\text{def}}{=} \alpha \wedge \beta ]$$

where, for  $i = 1, \dots, n$ :

$$\left( \begin{array}{c} s'_i \\ t'_i \end{array} \right)_{\beta_i} \stackrel{\text{def}}{=} \left( \begin{array}{c} s_{p(i)} \\ t_i \end{array} \right) \uparrow_{\alpha_{i-1}} \left( \begin{array}{c} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{array} \right) \quad \text{and} \quad \left( \begin{array}{c} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{array} \right)_{\beta_i} \vdash \left( \begin{array}{c} s'_i \\ t'_i \end{array} \right) u_i \left( \begin{array}{c} \sigma_1^i \\ \sigma_2^i \end{array} \right)_{\alpha_i}$$

## What about similar functors w/ only **partial** non-aligned arities?

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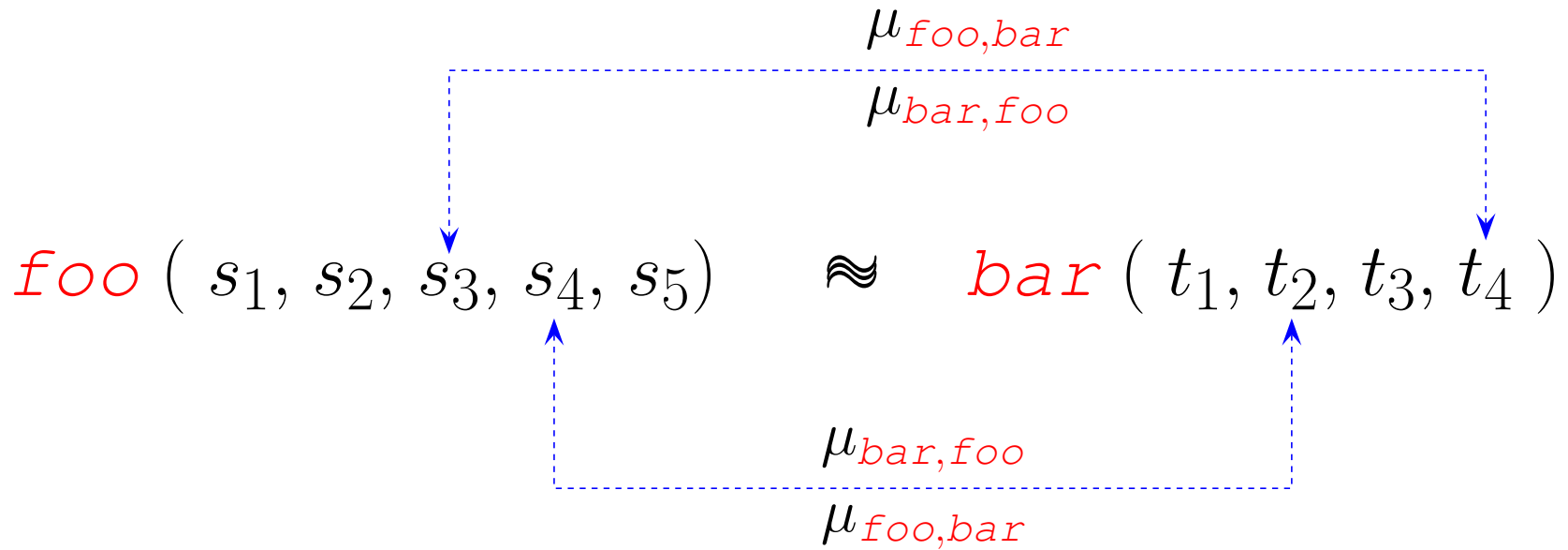
E.g.,  $foo \in \Sigma_5$  and  $bar \in \Sigma_4$  s.t.  $foo \approx bar$

but where this similarity may be homomorphically extended from these functors to terms they construct *only when*:

- $foo$ 's 3<sup>rd</sup> argument is similar to  $bar$ 's 4<sup>th</sup> argument
- $foo$ 's 4<sup>th</sup> argument is similar to  $bar$ 's 2<sup>nd</sup> argument

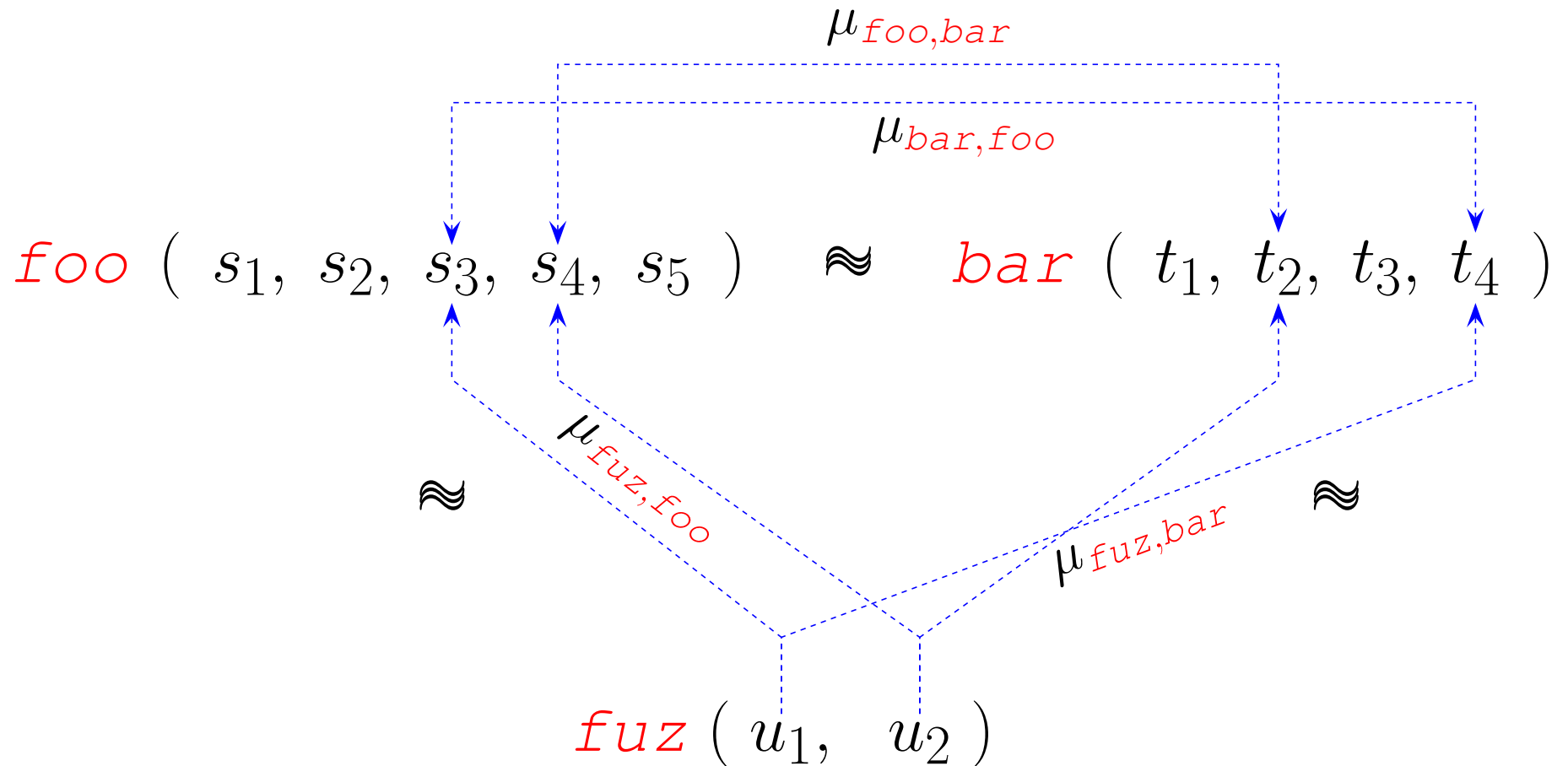
I.e.,  $\exists$  **two mutually inverse** but **partial bijective mappings** between the argument positions of functors  $foo$  and  $bar$ ; e.g.,

- $\mu_{foo,bar} : \{3, 4\} \rightarrow \{1, 2, 3, 4\} = \{3 \mapsto 4, 4 \mapsto 2\}$
- $\mu_{bar,foo} : \{2, 4\} \rightarrow \{1, 2, 3, 4, 5\} = \{2 \mapsto 4, 4 \mapsto 3\}$



$foo \approx^{\mu_{foo,bar}} bar$       and       $bar \approx^{\mu_{bar,foo}} foo$





$$\begin{array}{l}
 foo \approx^{\mu_{foo,bar}} bar \quad \text{and} \quad bar \approx^{\mu_{bar,foo}} foo \\
 fuz \approx^{\mu_{fuz,foo}} foo \quad \text{and} \quad fuz \approx^{\mu_{fuz,bar}} bar
 \end{array}$$

## Similar functors with **partial** non-aligned arities

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Two functors  $f \in \Sigma_m$  and  $g \in \Sigma_n$ , for any  $m \geq 0$  and  $n \geq 0$ , are said to have **partial non-aligned arities** at approximation degree  $\alpha \in (0, 1]$  whenever:

1. there is a set  $\mathcal{D}_{fg}^\alpha \subseteq \{1, \dots, m\}$  of argument positions of  $f$  and a set  $\mathcal{D}_{gf}^\alpha \subseteq \{1, \dots, n\}$  of argument positions of  $g$  such that  $|\mathcal{D}_{fg}^\alpha| = |\mathcal{D}_{gf}^\alpha|$ ; and,
2. there exist two mutually inverse bijections:

$$\begin{cases} \mu_{fg}^\alpha : \mathcal{D}_{fg}^\alpha \rightarrow \{1, \dots, n\} \\ \mu_{gf}^\alpha : \mathcal{D}_{gf}^\alpha \rightarrow \{1, \dots, m\} \end{cases}$$

$$\text{such that: } \begin{cases} \mathbf{ran}(\mu_{fg}^\alpha) = \mathcal{D}_{gf}^\alpha \stackrel{\text{def}}{=} \mathbf{dom}(\mu_{gf}^\alpha) \\ \mathbf{ran}(\mu_{gf}^\alpha) = \mathcal{D}_{fg}^\alpha \stackrel{\text{def}}{=} \mathbf{dom}(\mu_{fg}^\alpha) \end{cases}$$

# Consistency conditions for **total** non-aligned arities

(recall)

- for each  $\langle f, g \rangle \in \Sigma^2$ , s.t.  $f \in \Sigma_m$  and  $g \in \Sigma_n$ , with  $0 \leq m \leq n$ , and  $f \approx g$ , there is an injective (i.e., one-to-one) map  $\mu_{fg} : \{1, \dots, m\} \rightarrow \{1, \dots, n\}$  associating each of the  $m$  argument positions of  $f$  to a unique position among the  $n$  arguments of  $g$  — this is denoted as:  $f \approx^{\mu_{fg}} g$
- **alignment maps** between similar functors **must be consistent**:

– for any functor  $f/n$ :

Identity Consistency: 
$$\mu_{ff} = \mathbb{1}_{\{1, \dots, n\}}$$

– for any two functors  $f/n$  and  $g/n$ :

Inverse Consistency: 
$$\mu_{fg} \circ \mu_{gf} = \mathbb{1}_{\{1, \dots, n\}}$$

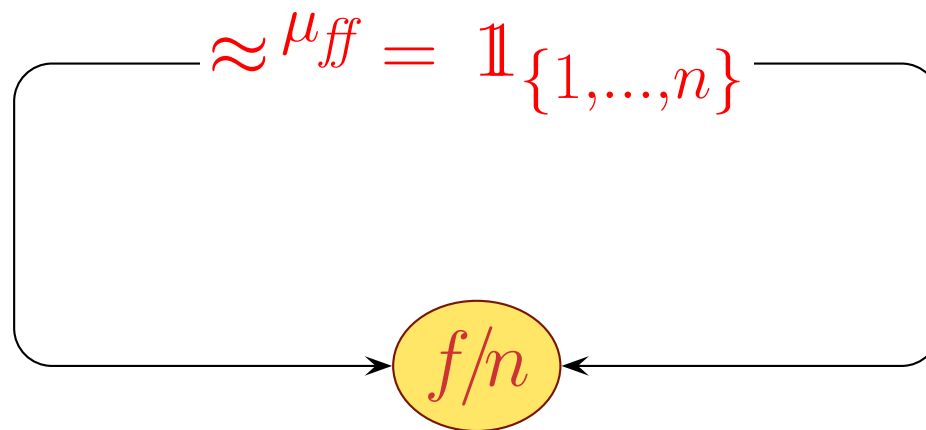
– for any three functors  $f/m$ ,  $g/n$ ,  $h/\ell$  s.t.  $0 \leq m \leq n \leq \ell$ :

Composition Consistency: 
$$\mu_{fh} = \mu_{gh} \circ \mu_{fg}$$

# Consistency conditions for **total** non-aligned arities (recall-ctd.)

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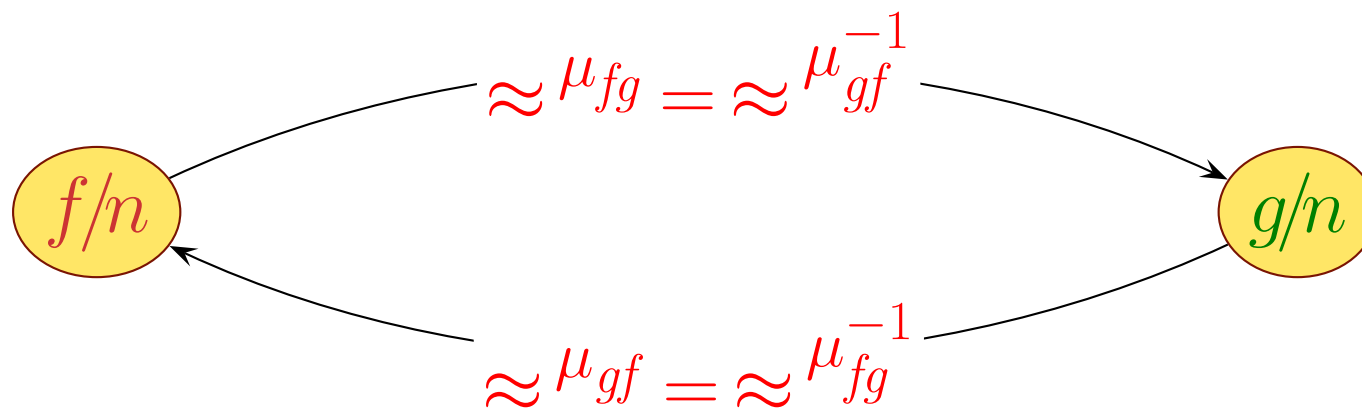
## Identity Consistency Condition



# Consistency conditions for **total** non-aligned arities (recall-ctd.)

## Inverse Consistency Condition

$$\mu_{fg} : \{1, \dots, n\} \rightarrow \{1, \dots, n\}$$



$$\mu_{gf} : \{1, \dots, n\} \rightarrow \{1, \dots, n\}$$

# Consistency conditions for **total** non-aligned arities (recall-ctd.)

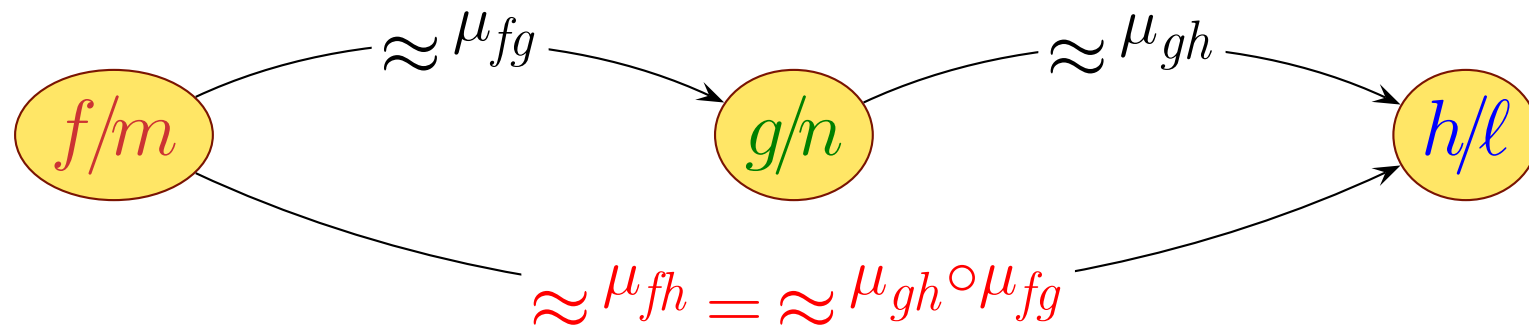
## Compositional Consistency Condition

$$m \leq n$$

$$n \leq l$$

$$\mu_{fg} : \{1, \dots, m\} \rightarrow \{1, \dots, n\}$$

$$\mu_{gh} : \{1, \dots, n\} \rightarrow \{1, \dots, l\}$$



$$m \leq l$$

$$\mu_{fh} = \mu_{gh} \circ \mu_{fg} : \{1, \dots, m\} \rightarrow \{1, \dots, l\}$$

## Consistency issues for **partial** non-aligned arities

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**Total argument-position maps are *always* composable** as *all* the positions in the range of a map are in the domain of any map from a functor to a similar one (always of greater or equal arity).

**With *partial* maps, this may no longer be possible!**

*foo/5, bar/4, biz/4*, with:

$\mu_{foo,bar}^\alpha : \{3,4\} \rightarrow \{2,4\}$  and  $\mu_{bar,biz}^\alpha : \{1,3\} \rightarrow \{1,2\}$

not composable:  $\mathbf{ran}(\mu_{foo,bar}^\alpha) \cap \mathbf{dom}(\mu_{bar,biz}^\alpha) = \emptyset$

Even if  $\mu_{bar,biz}^\alpha : \{2,4\} \rightarrow \{1,2\}$  but  $\mu_{foo,biz}^\alpha : \{3,4\} \rightarrow \{3,4\}$ :

$\mu_{bar,biz}^\alpha \circ \mu_{foo,bar}^\alpha \neq \mu_{foo,biz}^\alpha$  not consistent

These are clearly situations to be detected: **partial argument maps must always be consistently composable**

## Consistency conditions for **partial** non-aligned arities

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Now, assume all  $f \approx_{\alpha} g$  with **partial non-aligned arities** at approximation degree  $\alpha \in (0, 1]$  (*argument maps are identities by default*)

- for any  $f \in \Sigma$ ,  $g \in \Sigma$ ,  $\alpha \in (0, 1]$ ,  $\beta \in (0, 1]$ :

$$\alpha \leq \beta \Rightarrow \mathcal{D}_{fg}^{\alpha} \subseteq \mathcal{D}_{fg}^{\beta}$$

- for any  $f \in \Sigma$ ,  $g \in \Sigma$ ,  $\alpha \in (0, 1]$ ,  $\beta \in (0, 1]$ :

$$\alpha \leq \beta \Rightarrow \mu_{fg}^{\alpha} \subseteq \mu_{fg}^{\beta} \quad (\text{as sets of pairs})$$



- for all  $f \in \Sigma_m, g \in \Sigma_n, h \in \Sigma_\ell, m \geq 0, n \geq 0, \ell \geq 0$  :

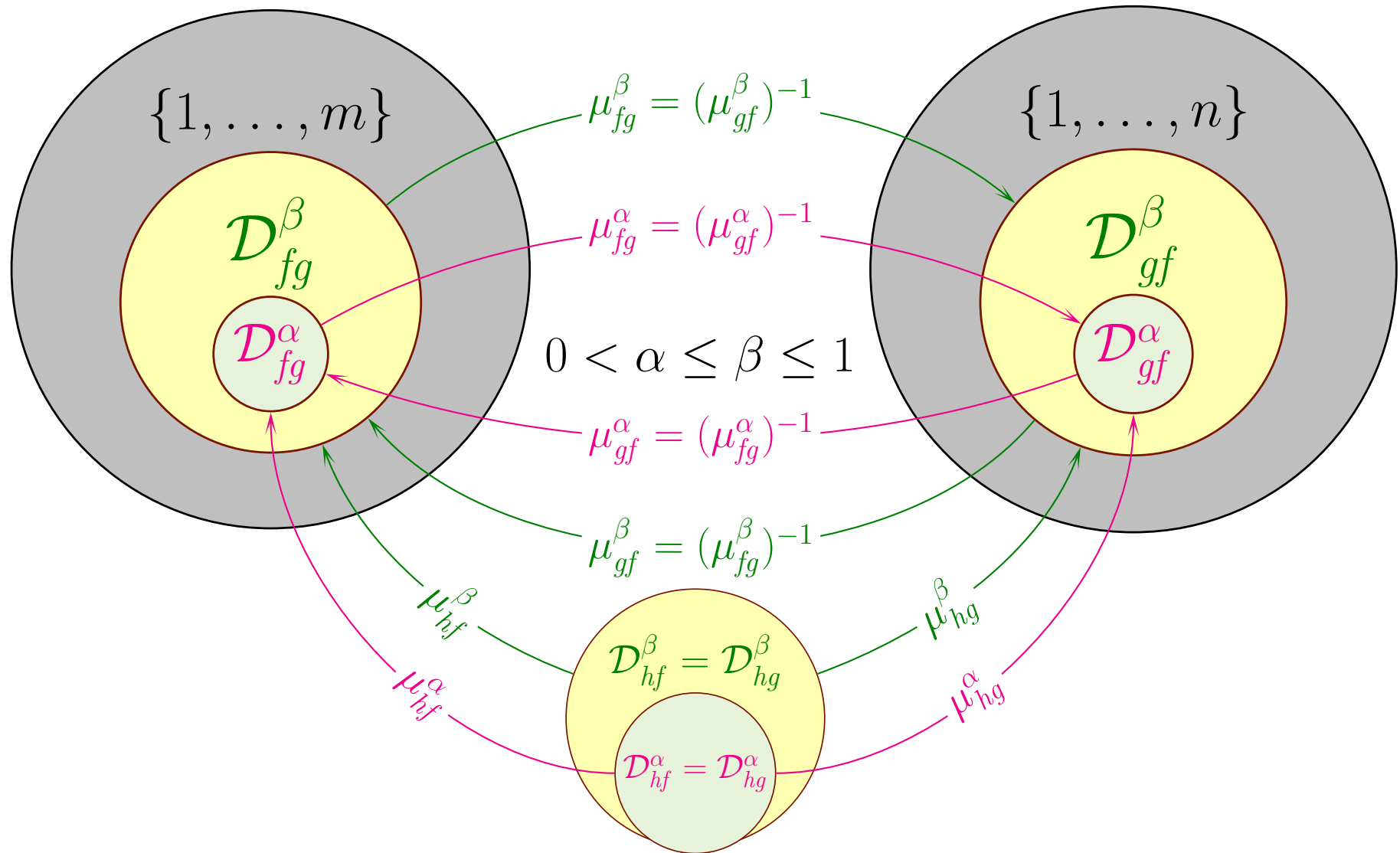
$$\begin{cases} \mathbf{ran}(\mu_{fg}^\alpha) = \mathbf{dom}(\mu_{gh}^\alpha) \quad (= \mathcal{D}_{gh}^\alpha) \\ \mathbf{ran}(\mu_{fh}^\alpha) = \mathbf{ran}(\mu_{gh}^\alpha) \end{cases}$$

and:

$$\begin{array}{ccc} \text{composition order} & & \text{application order} \\ \left\{ \begin{array}{l} \mu_{hf}^\alpha = \mu_{gf}^\alpha \circ \mu_{hg}^\alpha \\ \mu_{hg}^\alpha = \mu_{fg}^\alpha \circ \mu_{hf}^\alpha \end{array} \right. & \text{or} & \left\{ \begin{array}{l} \mu_{hf}^\alpha = \mu_{hg}^\alpha \mu_{gf}^\alpha \\ \mu_{hg}^\alpha = \mu_{hf}^\alpha \mu_{fg}^\alpha \end{array} \right. \end{array}$$

at any approximation degree  $\alpha \in (0, 1]$

# Partial non-aligned arity consistency as a commutative diagram



# Unification with **partial** non-aligned arguments

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## PARTIAL NON-ALIGNED TERM DECOMPOSITION

$$(E \cup \{ f(s_1, \dots, s_m) \doteq g(t_1, \dots, t_n) \})_\alpha$$

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$$(E \cup \{ s_{d_1} \doteq t_{\mu_{fg}^{\alpha \wedge \beta}(d_1)}, \dots, s_{d_k} \doteq t_{\mu_{fg}^{\alpha \wedge \beta}(d_m)} \})_{\alpha \wedge \beta}$$

$$[\text{s.t. } f \approx_{\beta}^{\mu_{fg}^{\beta}} g; 0 \leq |\mathcal{D}_{fg}^{\alpha \wedge \beta}| = k \leq \min(m, n); \mathcal{D}_{fg}^{\alpha \wedge \beta} = \{d_1, \dots, d_k\}]$$

**N.B.:** there is no need to re-orient a term equation as for total maps! (**Why?**)

# Generalization with **partial** non-aligned arguments

## PARTIAL FUNCTOR/ARITY SIMILARITY

$$\frac{\begin{pmatrix} \sigma_1 \\ \sigma_2 \end{pmatrix}_{\alpha_0} \vdash \begin{pmatrix} s'_1 \\ t'_1 \end{pmatrix} u_1 \begin{pmatrix} \sigma_1^1 \\ \sigma_2^1 \end{pmatrix}_{\alpha_1} \cdots \begin{pmatrix} \sigma_1^{\ell-1} \\ \sigma_2^{\ell-1} \end{pmatrix}_{\alpha_{\ell-1}} \vdash \begin{pmatrix} s'_\ell \\ t'_\ell \end{pmatrix} u_\ell \begin{pmatrix} \sigma_1^\ell \\ \sigma_2^\ell \end{pmatrix}_{\alpha_\ell}}{\begin{pmatrix} \sigma_1 \\ \sigma_2 \end{pmatrix}_\alpha \vdash \begin{pmatrix} f(s_1, \dots, s_m) \\ g(t_1, \dots, t_n) \end{pmatrix} h(u_1, \dots, u_\ell) \begin{pmatrix} \sigma_1^\ell \\ \sigma_2^\ell \end{pmatrix}_{\alpha_\ell}}$$

$$[\text{s.t. } f/m \approx_\beta g/n; \alpha_0 \stackrel{\text{def}}{=} \alpha \wedge \beta; h/\ell \in [f/m, g/n]_{\alpha_0}; |\mathcal{D}_{hf}^{\alpha_0}| = |\mathcal{D}_{hg}^{\alpha_0}| = \ell ]$$

where, for  $i = 1, \dots, \ell$ :

$$\begin{pmatrix} s'_i \\ t'_i \end{pmatrix}_{\beta_i} \stackrel{\text{def}}{=} \begin{pmatrix} s \mu_{hf}^{\alpha_{i-1}}(i) \\ t \mu_{hg}^{\alpha_{i-1}}(i) \end{pmatrix} \uparrow_{\alpha_{i-1}} \begin{pmatrix} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{pmatrix} \text{ and } \begin{pmatrix} \sigma_1^{i-1} \\ \sigma_2^{i-1} \end{pmatrix}_{\beta_i} \vdash \begin{pmatrix} s'_i \\ t'_i \end{pmatrix} u_i \begin{pmatrix} \sigma_1^i \\ \sigma_2^i \end{pmatrix}_{\alpha_i}$$

**N.B.:** there is no need to differentiate between left and right as for total maps! (**Why?**)

**But these rules work only if all consistency conditions hold!**

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**Isn't similarity consistency a lot to ask?...**

**Most certainly!...** However, **the good news is:**

- ▶ **an inconsistent signature similarity can easily be detected**
- ▶ **a consistent but incomplete signature can be completed and remain consistent s.t. similarity classes always contain a least-arity functor with total consistent composable argument maps to all other members of its class**

and **this can be done efficiently!**

# Automated completion of **partial** non-aligned signature similarity

**forall**  $\alpha \in \text{VAL}^{\approx}$  and similarity class  $c \in \Pi_{\alpha}^{\approx}$  **do**

**if**  $\nexists$  a least-arity similarity class representative in  $c$  with *total* argument-position maps to *all* members of  $c$

**then**

- add a *new* functor  $h/m$  to signature  $\Sigma_m$  such that  $m = \min\{|\mathcal{D}_{fg}^{\alpha}| \mid f \in c, g \in c\}$ , with least *total* consistent injective maps  $\mu_{hf}^{\alpha} : \{1, \dots, m\} \rightarrow \{1, \dots, n\}$  for *all*  $f/n \in c$ ; **if not possible,  $\Sigma$  is inconsistent;**
- add functor  $h/m$  to similarity class  $c$ ;

# Yet to be done...

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## 👉 **Finish formal work**

- prove formal properties and correctness
- complete report and submit for publication

## 👉 **Java implementation**

- about 50% is done (*had to be put on hold to prepare this talk!*)
- yet to be done:
  - \* partial map consistency checking
  - \* automated least partial-map completion

## 👉 **Develop convincing examples!**

- use implementation to experiment on examples

## 👉 **HAK: find a job where they like this? 😊, etc., ...**

Thank You For Your Attention !

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