



IARIA Congress 2024 June 30, 2024 to July 04, 2024 - Porto, Portugal
The 2024 IARIA Annual Congress on Frontiers in Science, Technology, Services, and Applications



Symbolic Unfolding of Similarity-based Fuzzy Logic Programs



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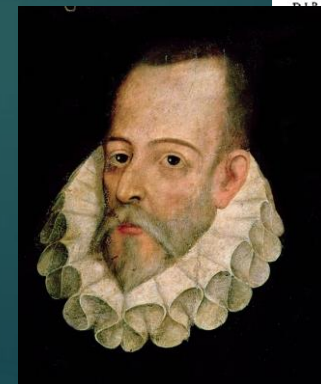
EL INGENIOSO
HIDALGO DON QUI-
XOTE DE LA MANCHA,
Compuesto por Miguel de Cervantes
Saavedra.

DEDICADO AL DVQUE DE BETANZ,
de Gibraltar, Conde de Benalcazar, y Barón
de la Puñola de Alcazar, Señori de
las villas de Capilla, Cartiel, y
Burguillos.



1605.

CON PRIVILEGIO.
M. A. D. R. I. D., Por Juan de la Cuesta,
maestro de Francisco de Rojas, librero del Rey nro Señor.





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Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

DEC-TAU research group

DECLARATIVE PROGRAMMING & AUTOMATIC PROGRAM TRANSFORMATION

- ▶ Founded in 2000 by Ginés Moreno and Pascual Julián
- ▶ History: 10 researchers (José Antonio Rianza) and 6 research projects
- ▶ Two decades with FASILL: *“Fuzzy Aggregators and Similarity Into a Logic Language”*
 - ▶ Paradigm Integration: Fuzzy Logic Programming (symbolic extensions)
 - ▶ Transformations: Partial Evaluation, Folding, Unfolding and Tuning
 - ▶ Applications: semantic web, neural networks, cloud computing...



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Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

Our work in 10 slides

- ▶ MOTIVATION I-II-III
- ▶ UNFOLDING I-II-III-IV-V-VI
- ▶ CONCLUSIONS



Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

MOTIVATION I: unfolding pure logic programs: [Tamaki & Sato, 1984]

General idea: *replace a program rule by the set of new rules obtained after applying a computational step (in all possible ways) on its body and appropriately instantiating its head.*

- ▶ Original PROLOG program: $P = \{ p(X):-q(X). \quad q(a). \}$
- ▶ Unfolded PROLOG program: $P' = \{ p(a). \quad q(a). \}$
- ▶ Goal $p(a)$ is evaluated to true in both programs:
 - ▶ by means of **TWO** resolution steps in P using the two clauses.
 - ▶ by means of just **ONE** resolution step in P' using the new fact $p(a)$.

GAINS IN EFFICIENCY!!!: *computational steps applied at unfolding time remain compiled on transformed rules FOREVER.*



Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

MOTIVATION II: unfolding fuzzy logic programs: [Journals FSS & IJAR, 2023]

- ▶ Consider the lattice of truth degrees $L = ([0,1], \leq)$ equipped with connectives $\&luka$, $\&godel$, $\&prod$, $|luka$, $|godel$, $|prod$, $@aver, \dots$ and the similarity relation $R = \{ r \sim q = 0.4 \}$
- ▶ Original FASILL program $P = \langle \pi, R, L \rangle$ s.t. $\pi = \{ p(X) :- @aver(r(X), 0.8). \quad q(a). \}$
- ▶ Unfolded FASILL program $P' = \langle \pi', R, L \rangle$ s.t. $\pi' = \{ p(a) :- @aver(0.4, 0.8). \quad q(a). \}$
- ▶ Second unfolding step $P'' = \langle \pi'', R, L \rangle$ s.t. $\pi'' = \{ p(a) :- 0.6. \quad q(a). \}$
- ▶ Goal $p(a)$ returns 0.6 in P (tree computational steps), P' (two steps) and P'' (one step).



Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

MOTIVATION III: Symbolic fuzzy logic programs: [Conf. RULEML, 2020]

- ▶ Consider the lattice of truth degrees $L = ([0,1], \leq)$ equipped with connectives $\&\text{prod}$, $|luka$, $|godel$, $@aver, \dots$ and the **SYMBOLIC** similarity relation $R\# = \{ r \sim q = \#s1 \}$
- ▶ Original **sFASILL** program $P\# = \langle \pi\#, R\#, L \rangle$ s.t. $\pi\# = \{ p(X) :- \#?s2(r(X), 0.8). \quad q(a). \}$
- ▶ Unfolded **sFASILL** program $P'\# = \langle \pi'\#, R\#, L \rangle$ s.t. $\pi'\# = \{ p(a) :- \#?s2(\#s1, 0.8). \quad q(a). \}$
- ▶ Goal $p(a)$ returns $\#?s2(\#s1, 0.8)$ in P (two computational steps) and P' (one step).

WHY USING SYMBOLIC PROGRAMS? \rightarrow tune fuzzy truth degrees/connectives and similarity relations accordingly to users preferences!!! [Conf. IWANN, 2021: *tuning engine*], [Journal IJAR, 2024, *semantic web*], [Conf. RULEML, 2019: *neural networks*]

USER1: if 0.48 \rightarrow $p(a)$ then $\#s1=0.6$ and $\#?s2=\&\text{prod}$

USER2: if 0.9 \rightarrow $p(a)$ then $\#s1=0.9$ and $\#?s2=|godel$



Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

UNFOLDING I: Formalization of symbolic unfolding

FORMAL DEFINITION: Let $P\# = \langle \Pi\#, R\#, L \rangle$ be a sFASILL program and $R: (H \leftarrow B) \in \Pi\#$ be a rule (with non-empty body B). Then, the symbolic unfolding of rule R in program $P\#$ is the new sFASILL program $P'\# = \langle \Pi'\#, R\#, L \rangle$, where $\Pi'\# = (\Pi\# - \{R\}) \cup \{H\sigma \leftarrow B' \mid \langle B; id \rangle \rightsquigarrow \langle B'; \sigma \rangle\}$.

- ▶ **BASIS** of many techniques for **OPTIMIZING**, specializing, debugging,...
- ▶ Transformed programs **RUN FASTER** but **TAKE CARE** with:
 - ▶ **SIZE OF UNFOLDED PROGRAMS:** could grow more and more when repeatedly unfolding recursive rules...
 - ▶ **APPLICABILITY CONDITIONS:** some replacements of symbolic constants before/after unfolding a program could produce different answers...



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UNFOLDING II:

[HTTPS://DECTAU.UCLM.ES/FASILL/SANDBOX](https://dectau.uclm.es/fasill/sandbox)

[JOURNAL IJAR, 2020]

Downloads Documentation **Sandbox**

 **FASILL**
Fuzzy Aggregators and Similarities Into a Logic Language



</> Program

```
1 vanguardist(ritz) <- 0.9.
2 elegant(hydropolis) <- #s3.
3 close(hydropolis,taxi) <- 0.7.
4 good_hotel(X) <- #@s4(elegant(X),@very(close(X, metro))).
5
```

Linearize program Extend program Unfold program

● Lattice

```
17 and_prod(X,Y,Z) :- Z is X*Y.
18 and_godel(X,Y,Z) :- Z is min(X,Y).
19 and_luka(X,Y,Z) :- Z is max(X+Y-1.0,0.0).
20 or_prod(X,Y,Z) :- U1 is X*Y, U2 is X+Y, Z is U2-U1.
21 or_godel(X,Y,Z) :- Z is max(X,Y).
22 or_luka(X,Y,Z) :- Z is min(X+Y,1).
```

bool unit real

= Similarity Relation

```
1 elegant/1 ~ modern/1 = #s0.
2 modern/1 ~ vanguardist/1 = 0.9.
3 metro ~ bus = 0.5.
4 bus ~ taxi = #s1.
5 ~tnorm = #s2.
6
```




Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

UNFOLDING III: SYMBOLIC PROGRAM RULES

Program

```
1 vanguardist(ritz) <- 0.9.  
2 elegant(hydropolis) <- #s3.  
3 close(hydropolis,taxi) <- 0.7.  
4 good_hotel(X) <- #@s4(elegant(X),@very(close(X, metro))).  
5
```

Linearize program

Extend program

Unfold program

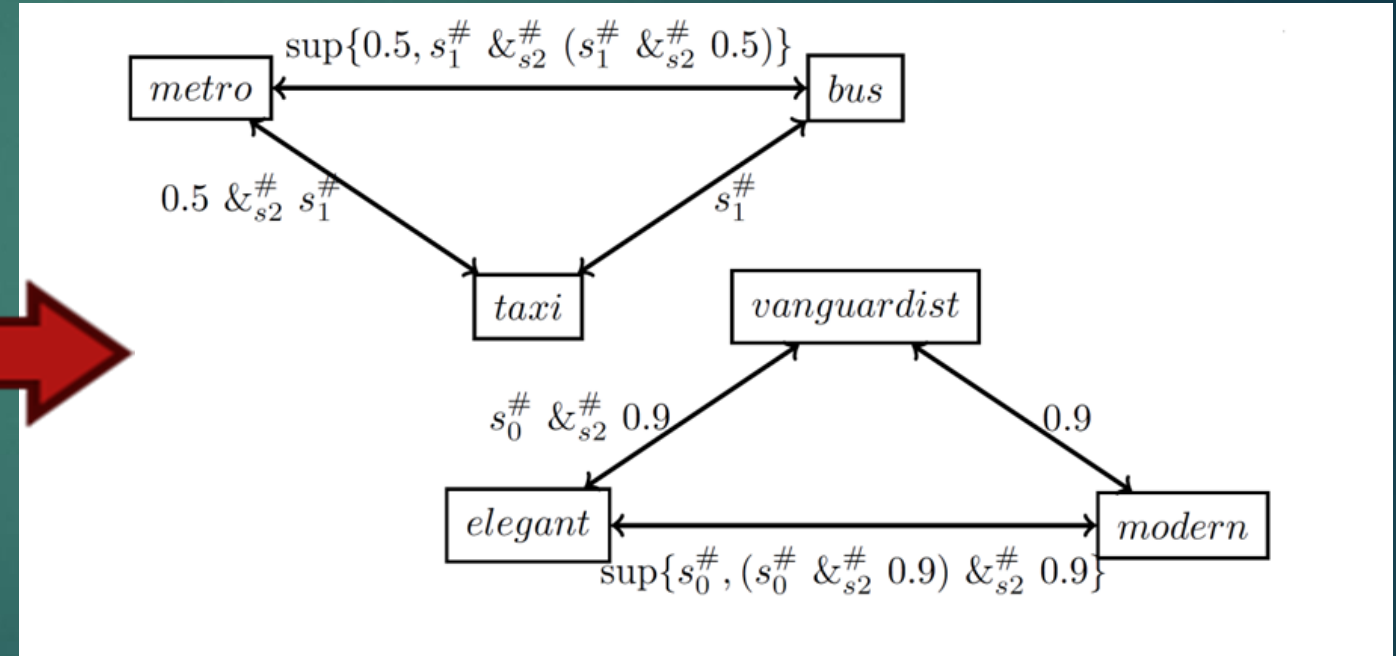


Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

UNFOLDING IV: SYMBOLIC SIMILARITY RELATION [RULEML, 2020]

Similarity Relation

- 1 elegant/1 ~ modern/1 = #s0.
- 2 modern/1 ~ vanguardist/1 = 0.9.
- 3 metro ~ bus = 0.5.
- 4 bus ~ taxi = #s1.
- 5 ~tnorm = #s2.
- 6





Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

UNFOLDING V: TRANSFORMATION SEQUENCE BASED ON FOUR UNFOLDING STEPS

Original program P #

```

1 vanguardist(ritz) <- 0.9.
2 elegant(hydropolis) <- #s3.
3 close(hydropolis,taxi) <- 0.7.
4 good_hotel(X) <- #@s4(elegant(X), @very(close(X, metro))).

```

Linearize program Extend program Unfold program

1 vanguardist(ritz) <- 0.9.

2 elegant(hydropolis) <- #s3.

3 close(hydropolis,taxi) <- 0.7.

4 good_hotel(X) <- #@s4(elegant(X),@very(close(X,metro))).

Final program P' #

```

vanguardist(ritz) <- 0.9.
elegant(hydropolis) <- #s3.
close(hydropolis,taxi) <- 0.7.
good_hotel(hydropolis) <- #@s4(#s3,@very(#&s2(#&s2(0.5,#s1),0.7))).
good_hotel(ritz) <- #@s4(#&s2(#&s2(#s0,0.9),0.9),0.0).

```

```

vanguardist(ritz) <- 0.9.
elegant(hydropolis) <- #s3.
close(hydropolis,taxi) <- 0.7.
good_hotel(hydropolis) <- #@s4(#s3,@very(#&s2(#&s2(0.5,#s1),0.7))).
good_hotel(ritz) <- #@s4(#&s2(#&s2(#s0,0.9),0.9),@very(0.0)).

```

```

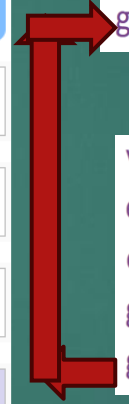
vanguardist(ritz) <- 0.9.
elegant(hydropolis) <- #s3.
close(hydropolis,taxi) <- 0.7.
good_hotel(hydropolis) <- #@s4(#s3,@very(close(hydropolis,metro))).
good_hotel(ritz) <- #@s4(#&s2(#&s2(#s0,0.9),0.9),@very(close(ritz,metro))).

```

```

vanguardist(ritz) <- 0.9.
elegant(hydropolis) <- #s3.
close(hydropolis,taxi) <- 0.7.
good_hotel(hydropolis) <- #@s4(#s3,@very(close(hydropolis,metro))).
good_hotel(ritz) <- #@s4(#&s2(#&s2(#s0,0.9),0.9),@very(0.0)).

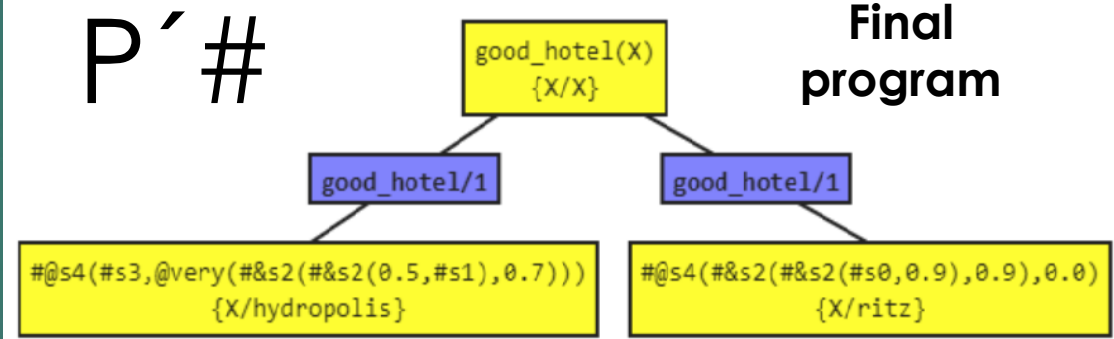
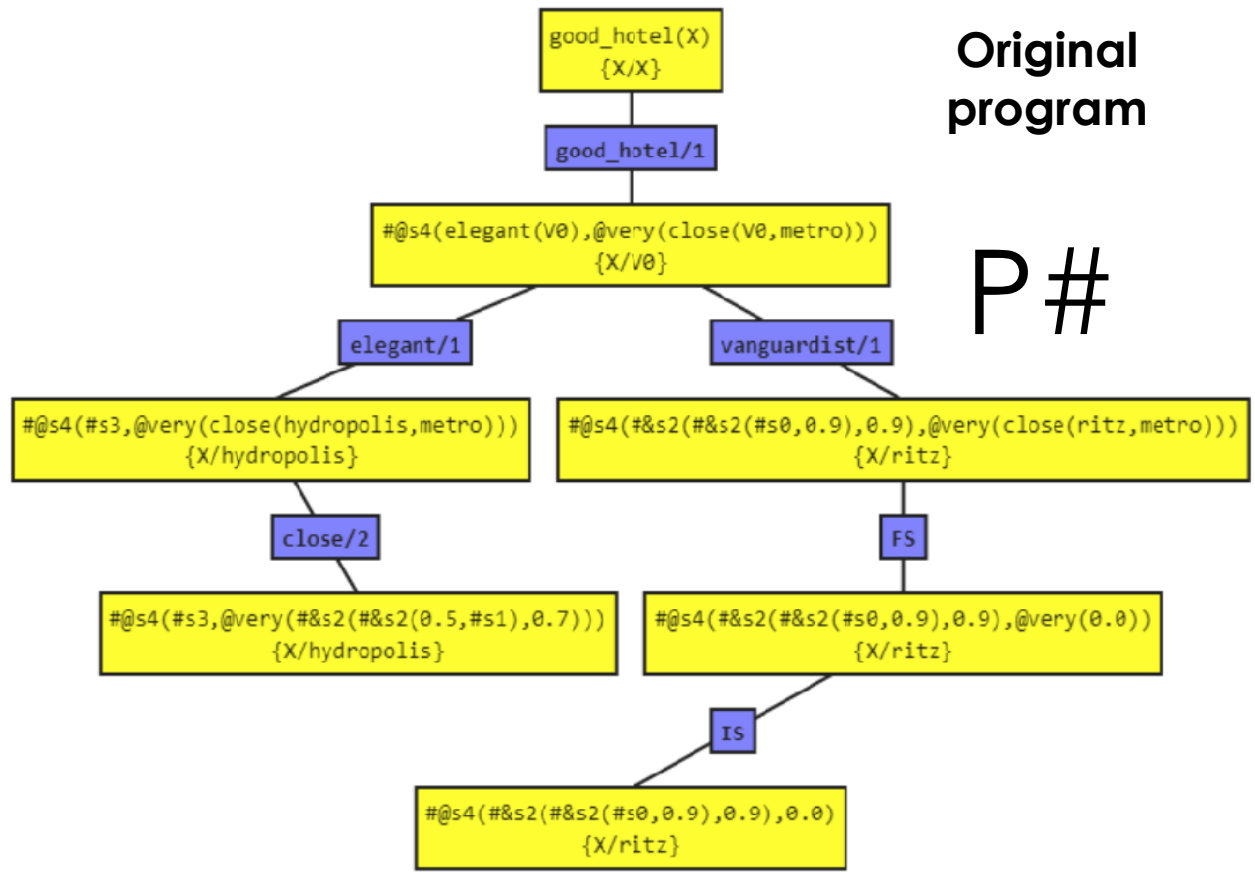
```





Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

UNFOLDING VI: EXECUTION TREES FOR A GOAL W.R.T. $P\#$ AND $P'\#$





Symbolic Unfolding of Similarity-based Fuzzy Logic Programs

CONCLUSION AND FURTHER RESEARCH

- ▶ Unfolding transformation for optimizing fuzzy logic programs:
 - ▶ [Conf. IWANN, 2019] Symbolic but **not similarity-based**
 - ▶ [Journal IJAR, 2023] Similarity-based but **not symbolic**
 - ▶ [Conf. IARIA, 2024] **BOTH SYMBOLIC AND SIMILARITY-BASED** 😊
- ▶ **Ongoing work:** safe applicability conditions and correctness proofs (soundness, completeness, efficiency...)