



UNIVERSITÀ DEGLI STUDI DI NAPOLI
FEDERICO II

itee^{PhD}
information technology
electrical engineering



Marco Grazioso

Building task-oriented dialogue systems for industry: a graph-based framework

Tutor: Prof. Francesco Cutugno

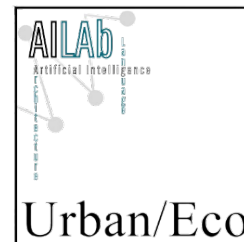
Cycle: XXXVI

co-Tutor: Ph.D. Valentina Russo

Year: Third

Background information

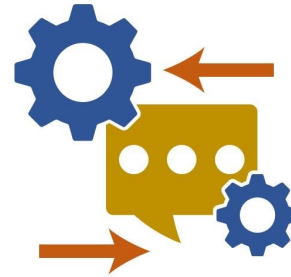
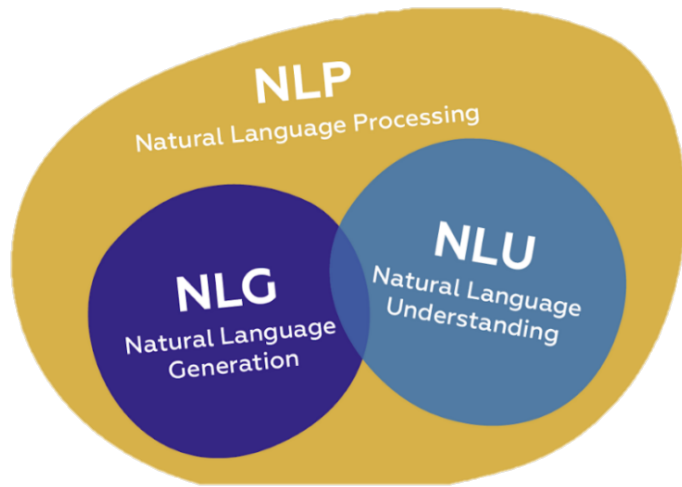
- **Master Degree:** Computer Science
- **Research group/laboratory:** Urban/Eco Research center
- **PhD start- end dates :** 01/11/2020 – 31/01/2024
- **Scholarship type:** company funded scholarship
- **Partner company:** Logogramma s.r.l
- **Period abroad:** Heriot-Watt University, Edinburgh,UK
from 04/02/2023 to 31/07/2023



Summary of study activities

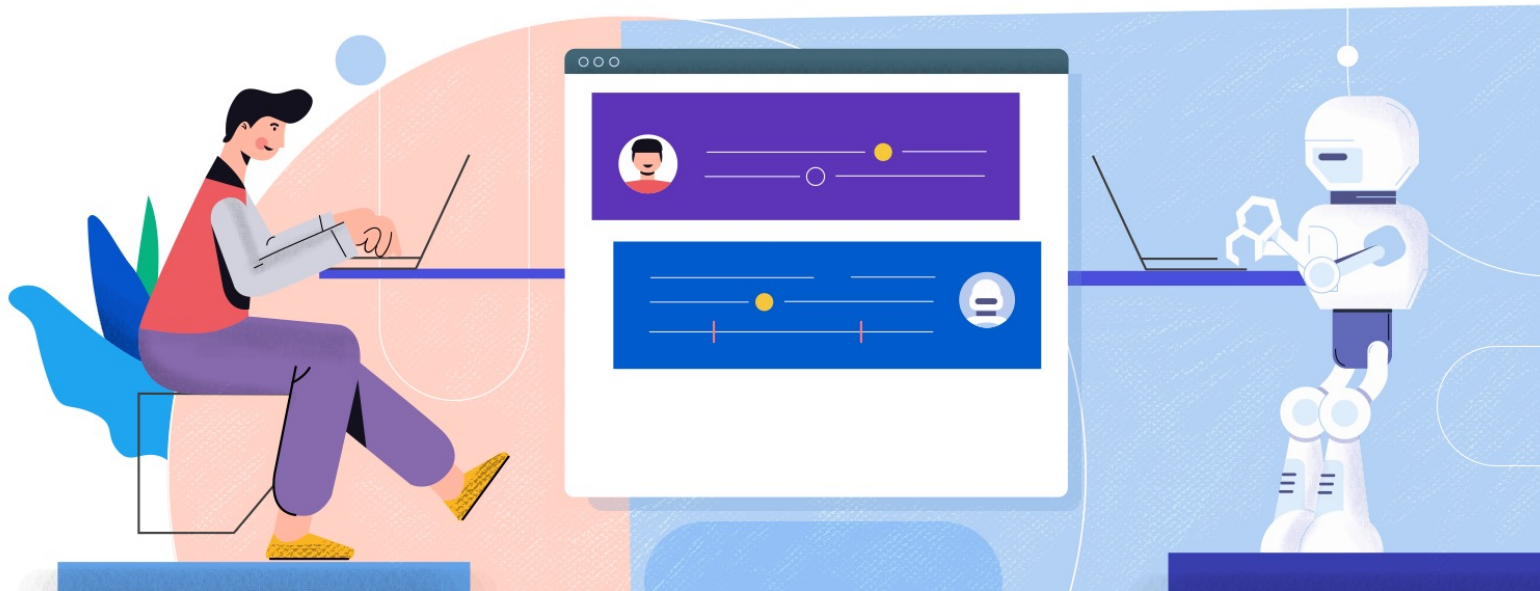
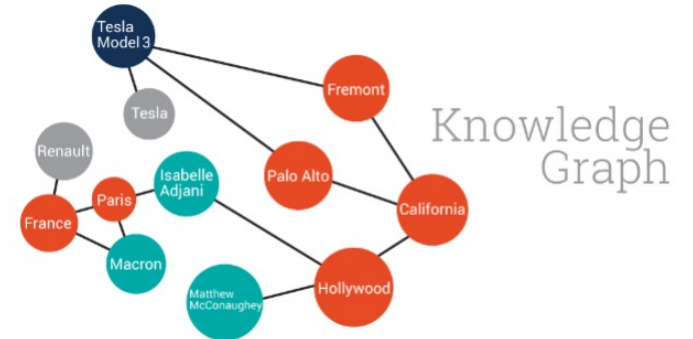
- **7 courses** (or PhD school).
 - Human Language Technologies
 - Game Engine Architectures and Interactive Experiences
 - Neural networks and deep learning
 - Lectures on Computational Linguistics 2022
 - Lectures on Computational Linguistics 2023
- **63 seminars.** most of them on AI, DNN, NLP, and Dialogue systems
- **Last conferences**
 - Italian Conference on Computational Linguistics (CLIC-it), Venice, November 30 - December 2, 2023 (poster presentation)

Dialogue Systems



Dialogue manager

- Dialogue state tracking
- Dialogue policy



Research results

- Implementation of a domain-independent dialogue management graph structure handling complex dialogue flows
- *Implementation of a graph structure supporting the training of stat-of-the-art intent and entity recognition models*
- *Implementation of a graph structure for the dialogue state tracking task*
- *Company distributed the solution obtaining positive results*

Research products

[P1]	M. Grazioso, A. Suglia, An Analysis of Visually Grounded Instructions in Embodied AI Tasks, 9th Italian Conference on Computational Linguistics , Venice, Italy, Nov.-Dec. 2023, CEUR-WS
[P2]	M. Grazioso, A. S. Podda, S. Barra, F. Cutugno Natural interaction with traffic control cameras through multimodal interfaces, International Conference on Human-Computer Interaction Washington DC, USA, Jul. 2021, pp. 501 - 515, Springer, DOI: 10.1007/978-3-030-77772-2_33.
[P3]	V. Russo, A. Mancini, M. Grazioso, M. Di Bratto, Graph-based representations of clarification strategies supporting automatic dialogue management, Italian Journal of Computational Linguistics , vol. 8 (1), pp. 1013-1062, 2022, DOI: 10.4000/ijcol.984
[P4]	A. Origlia, M. Grazioso, M. L. Chiacchio, F. Cutugno 3d avatars and semantic models annotations for introductory cultural heritage presentations, 2022 AVI-CH Workshop on Advanced Visual Interfaces for Cultural Heritage , Rome, Italy, Jun. 2022, Vol-3243, CEUR-WS
[P5]	A. Origlia, M. L. Chiacchio, M. Grazioso, F. Cutugno, Increasing visitors attention with introductory portal technology to complex cultural sites, International Journal of Human-Computer Studies , vol. 180, 2023, DOI: 10.1016/j.ijhcs.2023.103135.

Research products

[P6]	F. A. D'Asaro, L. Raggioli, S. Malek, M. Grazioso, S. Rossi, An application of a runtime epistemic probabilistic event calculus to decision-making in e-health systems, Theory and Practice of Logic Programming , vol. 23(5), pp. 1013-1062, 2023, DOI:10.1017/S1471068422000382.
[P7]	M.Campi, V.Cera, F.Cutugno, A. Di Luggo, P. Giulierini, M. Grazioso, A. Origlia, D. Palomba, Virtual Canova: a Digital Exhibition Across MANN and Hermitage Museums, Representation Challenges - New Frontiers of AR and AI Research for Cultural Heritage and Innovative Design , vol. 1, pp. 253-260, 2022, DOI: 10.3280/oa-845-c219.

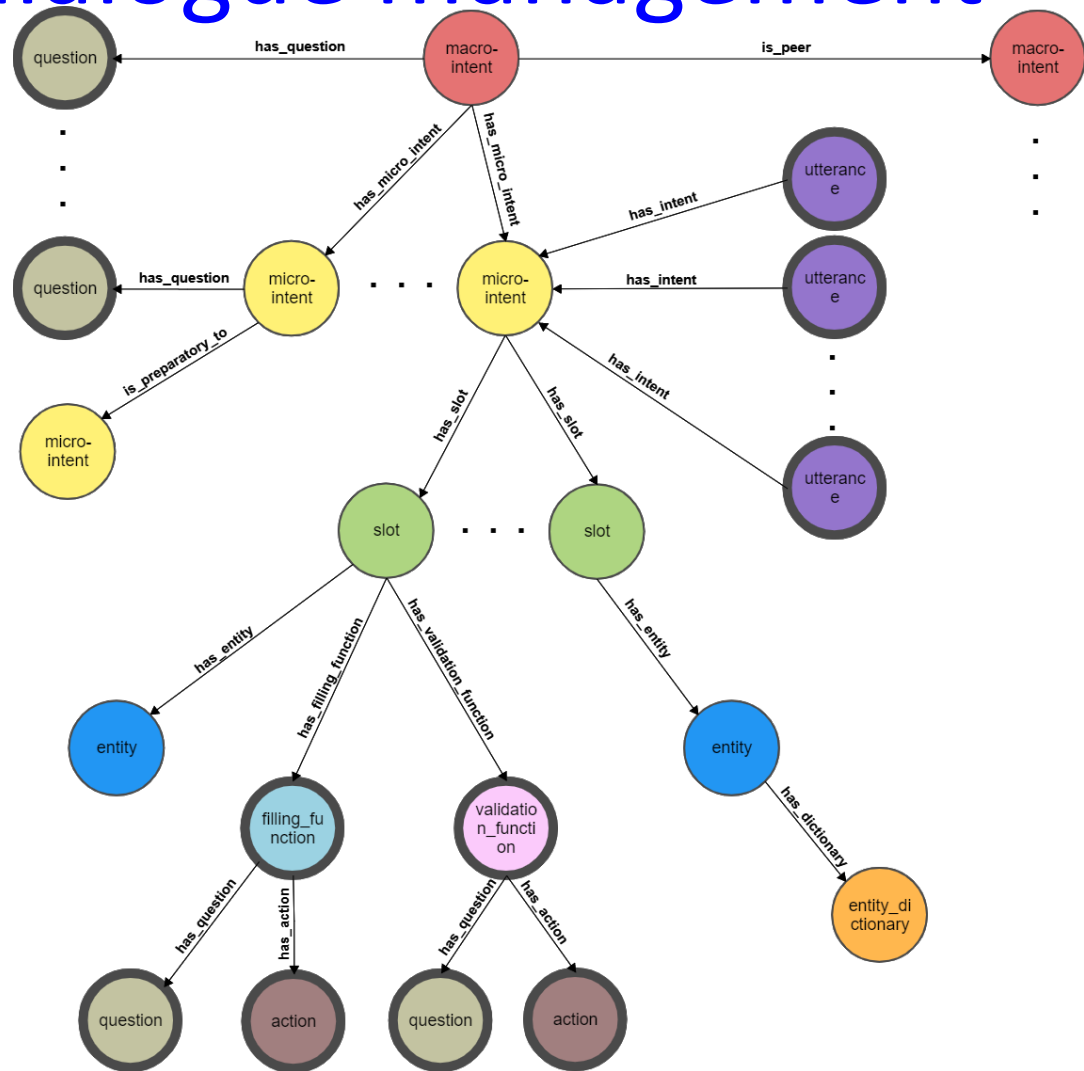
The company adopted the framework as the base for their solutions.

PhD thesis overview

Development of a joint structure supporting dialogue management, model training, and complex dialogue scenarios

- Objective
 - *domain-independent dialogue management*
 - *domain-specific language understanding*
 - *management of different pragmatic scenarios*
- Methodology
 - *graph-based representation*
 - *Pre-trained language models for domain adaptation*

Graph-based dialogue management

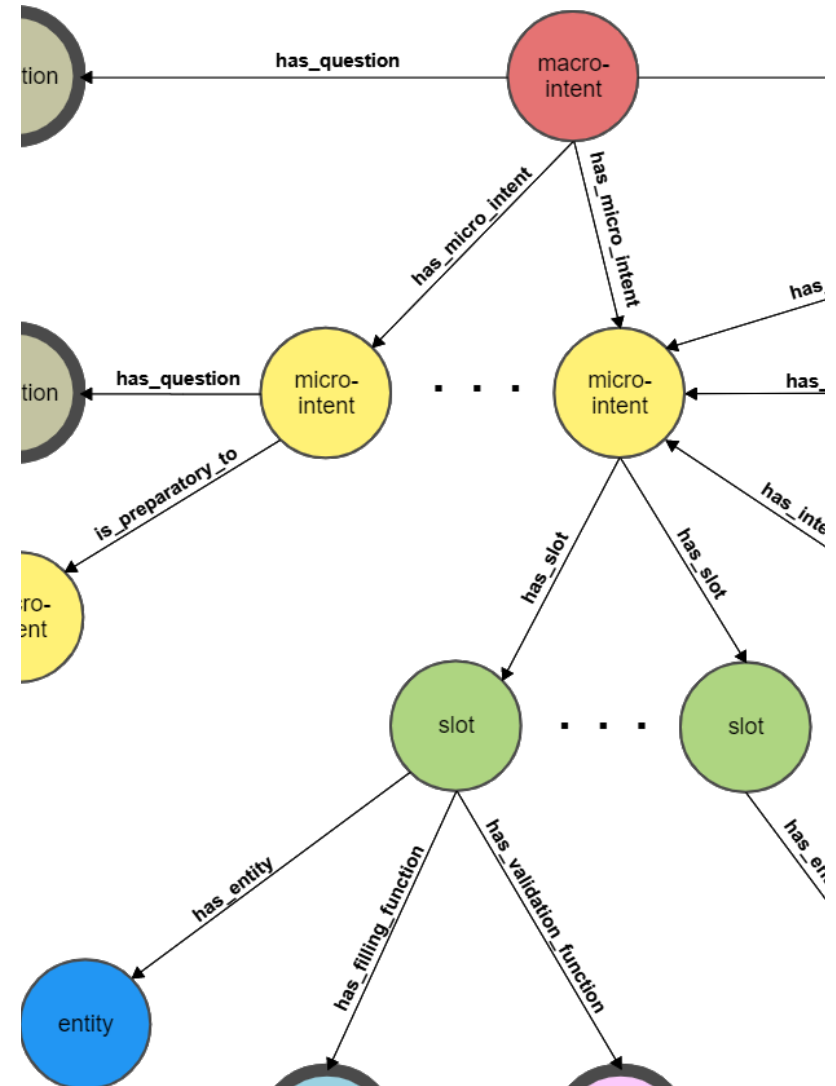


- Overall graph representation[1]

[1] Russo, V., Mancini, A., Grazioso, M., & Di Bratto, M. (2022). Graph-based representations of clarification strategies supporting automatic dialogue management. *IJCoL. Italian Journal of Computational Linguistics*, 8(8-1).

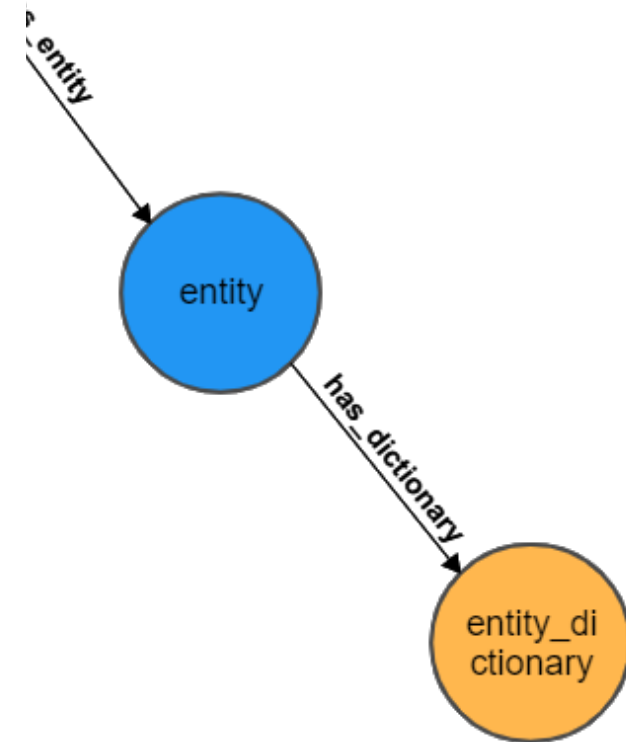
Domain modelling

- *Intents represent user intention*
- *They could be specialised into micro-intents*
- *Each intent has his own slots*
- *Slots are related to an entity type*



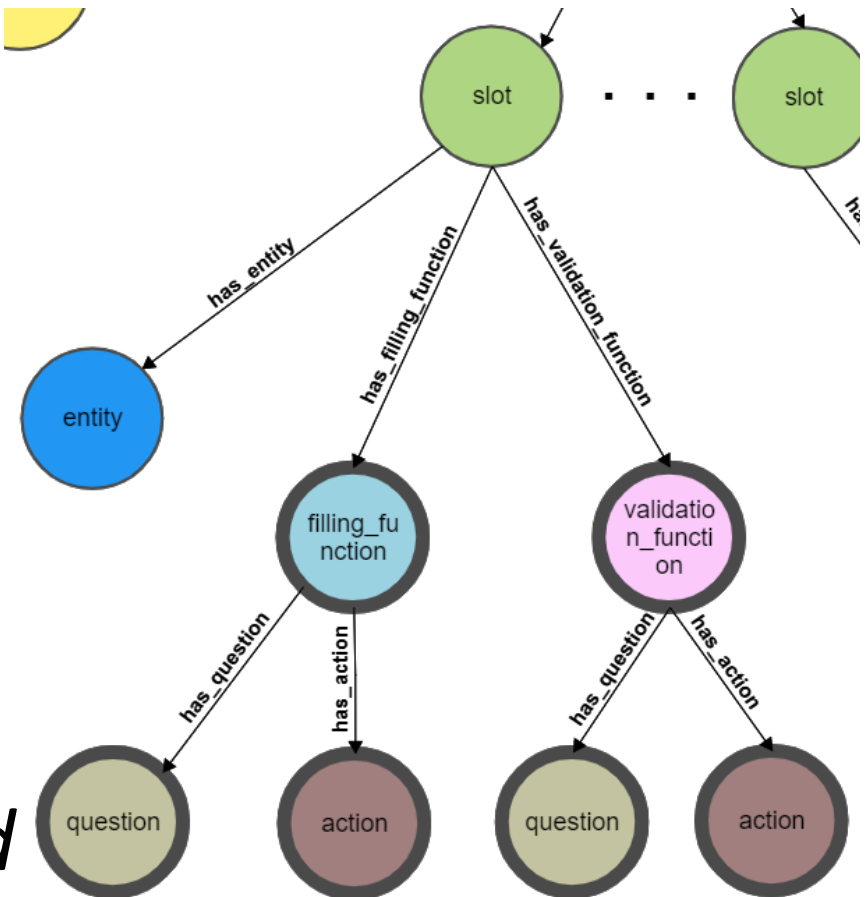
Domain modelling

- *Entities can be related to dictionaries*
- *Dictionaries can be populated from different sources*

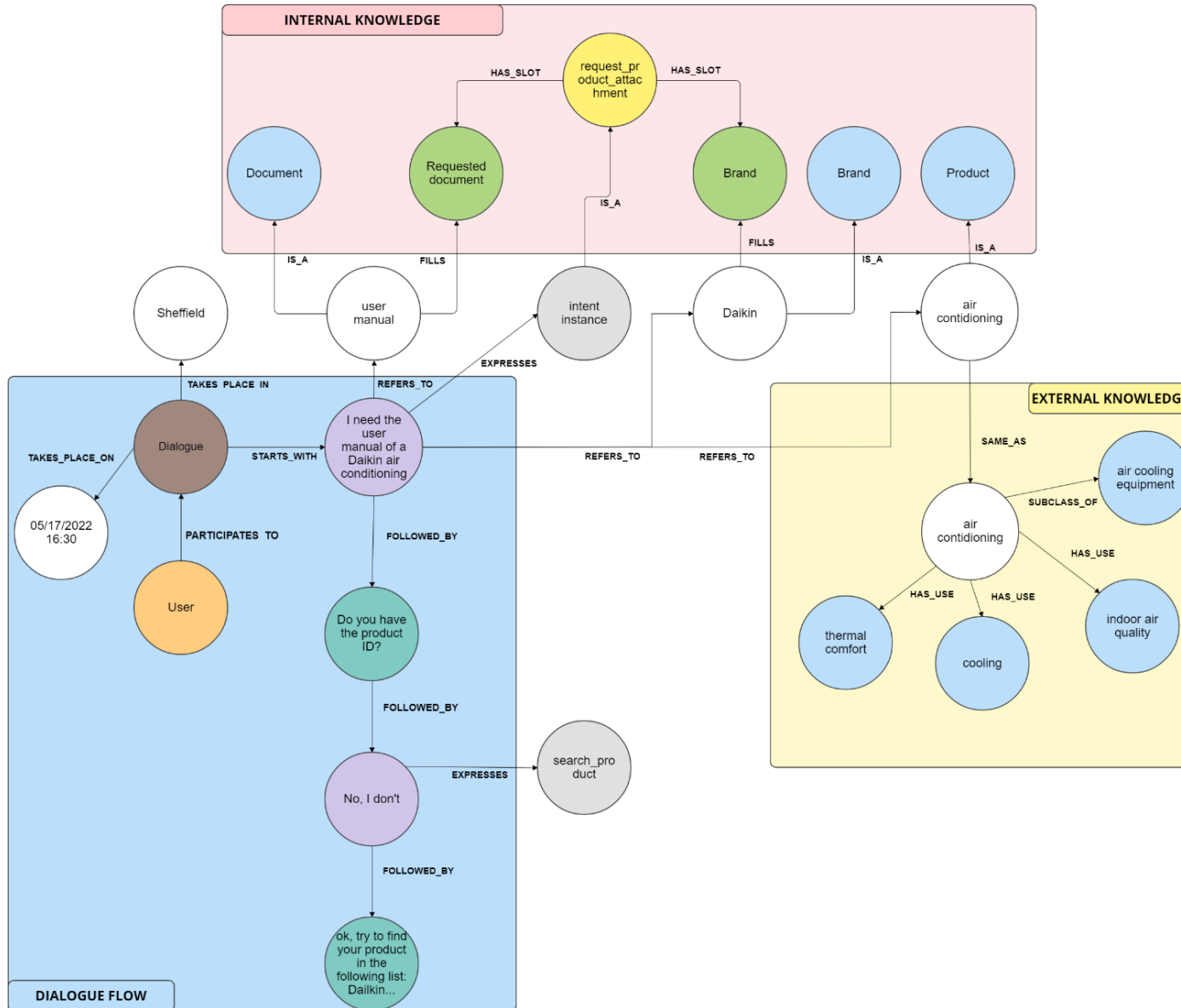


Dialogue modelling

- *Filling functions define how the slot must be filled*
- *Validation functions define how the value must be validated*
- *Actions define the operations to be performed*

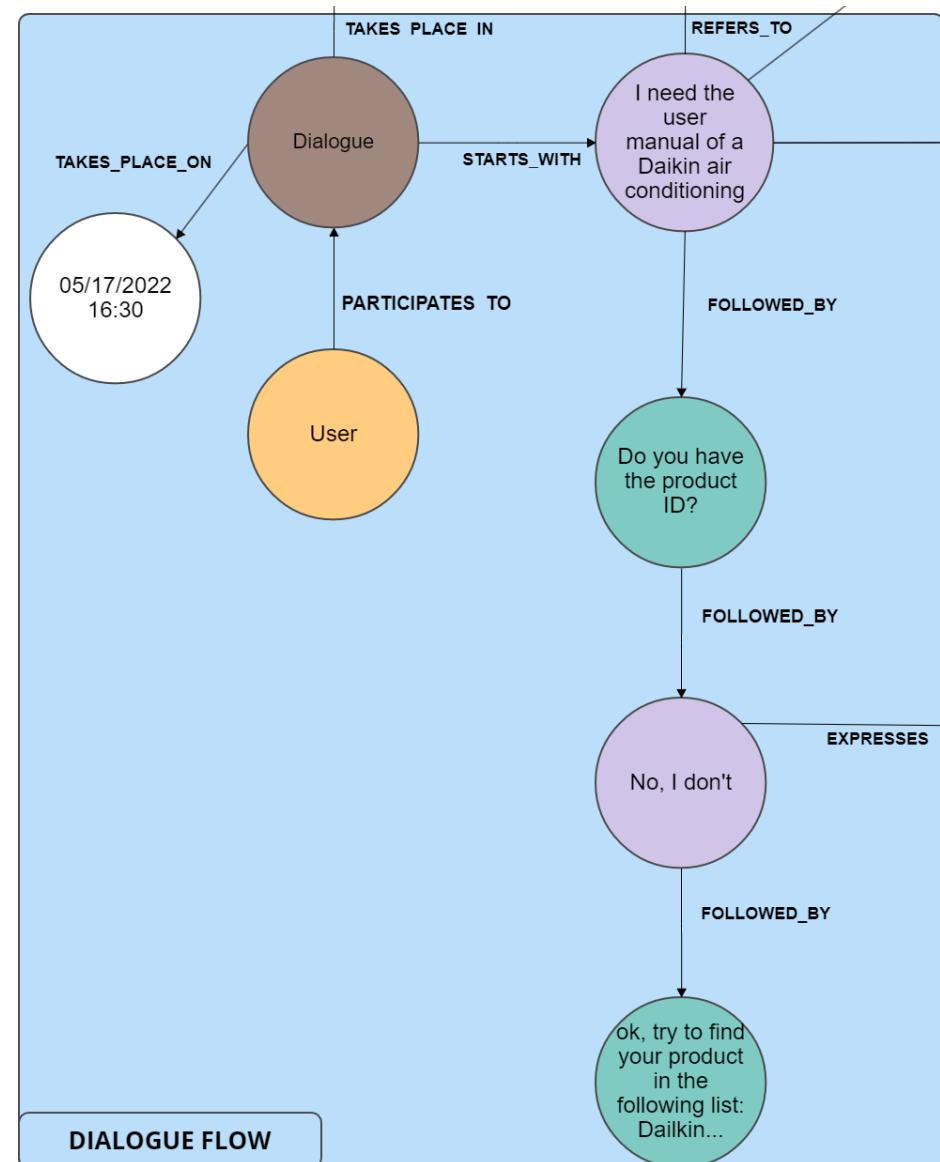


Dialogue state modelling



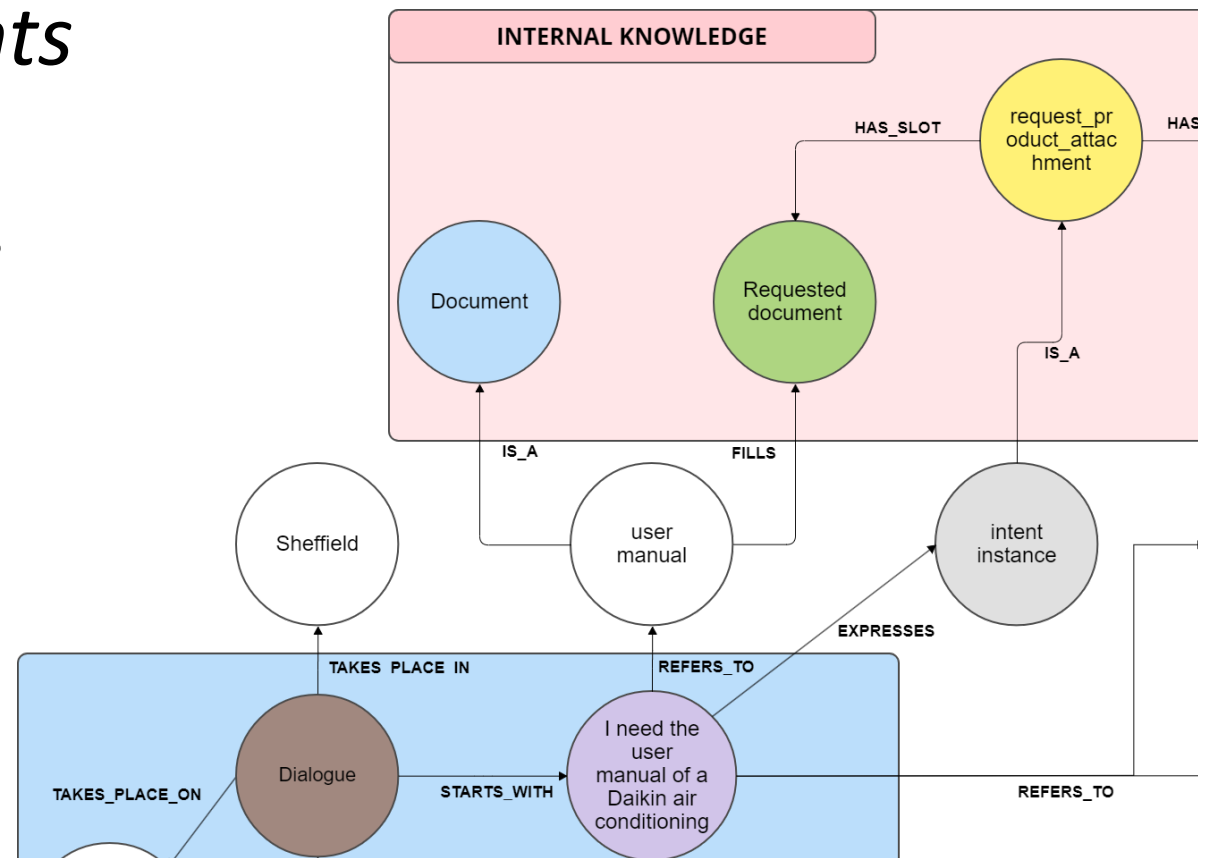
Dialogue flow

- *The dialogue is represented through a chain of nodes*



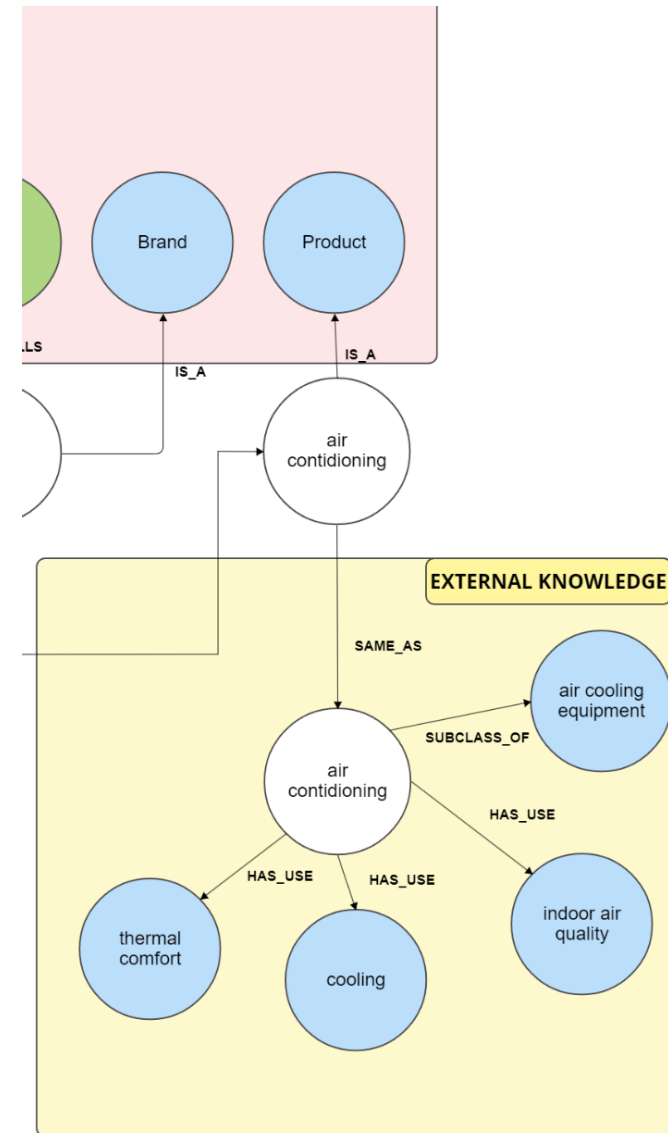
Domain connection

- *Recognised intents and entities are connected to the domain nodes*



External knowledge

- *Recognised entities can be in a relationship with data coming from other sources (WikiData and similar) (Entity Linking)*



Dialogue state enabled task

- *Previously mentioned items through the FOLLOWED_BY relationship*
- *Knowledge about the user through User node*
- *Knowledge about the world through the external knowledge connection*
- *Conflict search by navigating the utterances sequence*
- *Pattern search. Recurrent conversation patterns can be found and then used to instantiate specific dialogue policies.*

On field results

- *Human-human conversation in retail field*

Total conversations time (minutes)	Total number of conversations	Average turns per conversation
204:34:00	72	29.40

- *Human-machine conversation in retail field*

Total number of conversations	Average turns per conversation
656	6.12

Next step: situational dialogue

Goal: "Rinse off a mug and place it in the coffee maker"

1 "walk to the coffee maker on the right" $t=0$ visual navigation

2 "pick up the dirty mug from the coffee maker" $t=10$ object interaction

3 "turn and walk to the sink" $t=21$ visual navigation

4 "wash the mug in the sink" $t=27$ object interaction
state changes

5 "pick up the mug and go back to the coffee maker" $t=36$ visual navigation
memory

6 "put the clean mug in the coffee maker" $t=50$ object interaction

Preliminary results

- *Starting from a state-of-the-art model*
- *We trained a NLU model*
- *We conducted an error analysis to investigate situational issues*

Model	Language processing error rate
FILM	0.196
Ours	0.117

Error rate on all language processing tasks on unseen validation set.

Preliminary results

Challenges

- **Commonsense knowledge**
- **Visual context**
- **Multi-modality**
- **Interactive skills**

Error type	Subtype	Rate
Referential ambiguity	Mismatching	40/821
	Underspecification	24/821
	Others	32/821
Target object search	Object not visible	171/821
	Spatial understanding	106/821
Others interaction errors		218/821



**Thanks
For
Your
Attention**