

#### NATIONAL PH.D. PROGRAM IN AUTONOMOUS SYSTEMS

# **Interconnected Digital Twins**

Enabling advanced human-machine interaction in autonomous robotic navigation

#### Ph.D. candidate

Antonello LONGO

### Cycle

XL

#### **Tutors**

Prof. Cataldo Guaragnella

Prof. Giuseppe Piro

#### 1. Description of the research program

The research program focuses on the development of techniques and software architectures to enable a human-machine interaction paradigm based on natural language, in complex autonomous robotic navigation scenarios. In the field of robotic autonomy, robotic agents are usually designed to accomplish given tasks without the human supervision, however, state-of-the-art paradigms usually struggle to encode complex and semantic-rich instructions to guide robots during the mission.

Multi-modal neural networks, along with Large Language Models (LLMs) allow nowadays to merge mission-oriented information and semantic-information to enhance the capabilities of the robotic agents to understand the surrounding environment and perform complex, dynamic tasks. Moreover, LLMs enable the use of natural language, allowing machines to capture structured instructions in the input sentences.

Digital twins, in the form of interconnected software and hardware robotic agents, are a powerful tool to interact with autonomous agents and supervise all of their activities during the operations. They allow to create a development environment thanks to which the human operator can easily interact with the real robot and monitor the mission development. LLM-powered prompts can also be exploited to send dynamic commands to the robot while operating. Moreover, a simulated version of the real robot allows to test the behavior before the actual deployment on the hardware platform.

The project aims therefore at enabling an advanced human-machine interaction based on natural language, via digital twins. The first goal is to implement multi-modal neural networks to achieve a semantic-aware autonomous navigation in complex environments. The idea is to give a command to a robot in natural language and have a system on board the agent to make it understand and execute the instruction. In the literature, although recent developments have significantly enhanced the accuracy and robustness of mapping and planning algorithms, there is still a notable gap in autonomous navigation with semantic understanding. Classic algorithms are still based on spatial distribution of information, without any semantic awareness of the surrounding environment.

The development of multi-modal neural networks (e.g. text-vision models) is required to capture the semantics of the surrounding environment and mix this information with semantic-rich input commands, to perform a complex planning process to accomplish the input task.

The second goal of the project regards the creation of interconnected digital twins to: create a human-machine interaction prompt based on LLMs, test the behavior of the system before the actual deployment on real hardware and create a real-time monitoring environment to visualize data gathered by the robot while operating.

Moreover, the research field of text-vision models is quite new, so there is still a lack of appropriate datasets to train such models. The idea is therefore to overcome this limitation by using digital twins to generate complex data in simulation that can be used to train AI models. In this way their robustness and accuracy can also be investigated and enhanced.

### 2. Schedule of the research activities

First academic year (planned)

| Ţ.                                   | Description  | Period             | Activity abroad                                     |
|--------------------------------------|--|--------------------|---|
| Background and related work analysis | Survey on digital twins in autonomous robotics   | 11/2024<br>02/2025 | NO  |
| Semantic representation              | Study state-of-the-art deep-learning models for:   | 02/2025<br>03/2025 | NO  |
| Text-vision<br>navigation models     | Multi-modal neural networks mixing perception data and natural language  • Complete preliminary results  • Improve model performance via data generation and re-training  Target-driven predictive trajectory using transformers  • Extend model's ability to perceive complex behaviors  • Real hardware testing and optimization | 03/2025<br>11/2025 | YES<br>Activity to be<br>conducted with<br>NASA JPL |
| Publications                         | Transformer-based systems for predictive trajectory in cluttered environments     (conference: IROS)   |                    |   |

Second academic year (planned)

|                              | Description   | Period             | Activity abroad                                     |
|------------------------------|---|--------------------|---|
| System implementation        | Background analysis update Setup of first Digital Twin  Legged and wheeled robotic platforms ROS Gazebo + transformation tree  Automatic setup of different worlds and scenarios for complex data generation  Implementation of cross-modal perception systems in simulation (camera, LiDAR, sonar)  Implementation of first AI-model for LLM-based human-machine interaction | 11/2025<br>06/2026 | NO  |
| Data gathering in simulation | Setup of different scenarios in simulation  • create a unique and large dataset to be open-sourced  | 06/2026<br>08/2026 | YES<br>Activity to be<br>conducted with<br>NASA JPL |

|                          | Model deployment  • test on software version of the digital twin  Data acquisition  |                    |   |
|--------------------------|---|--------------------|---|
| Testing and optimization | <ul> <li>Performance analysis</li> <li>Check the behavior of the robotic agent in simulation</li> <li>Model optimization</li> <li>Re-training using augmented data from digital twin in simulation</li> </ul>   | 08/2026<br>11/2026 | YES<br>Activity to be<br>conducted with<br>NASA JPL |
| Publications             | <ol> <li>Text-vision architectures for object-goal navigation         (conference: ICRA)</li> <li>Survey on digital twins in robotic autonomy         (conference: IROS or other)</li> <li>Survey on multi-modal architectures for semantic-aware autonomous navigation         (journal: RAL)</li> </ol> |                    |   |

Third academic year (planned)

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|---|--|--------------------|---|
|   | Description  | Period             | Activity abroad   |
| System integration                          | Real-hardware implementation  • Setup perception and planning logic on real robotic platform  Full system Digital twin connection  • Check full interaction between real and simulated robotic agents  | 11/2026<br>02/2027 | YES Activity to be conducted with NASA JPL / Field AI for model deployment on Spot or Alpha |
| Performance<br>analysis and<br>optimization | <ul> <li>Model structure and performance analysis</li> <li>Check real-world behavior</li> <li>Sym-to-real gap analysis</li> <li>Optimization via re-training</li> <li>Mix data gathered during real-world explorations with simulation data</li> </ul> | 02/2027<br>05/2027 | YES<br>Activity to be<br>conducted with<br>NASA JPL /<br>Field AI                           |
| Testing                                     | <ul> <li>Full system testing</li> <li>Test the behavior of real-world and simulated agent in complex case scenarios</li> <li>(Optional) code optimization for performance constraints</li> </ul>   | 05/2027<br>09/2027 | YES<br>Activity to be<br>conducted with<br>NASA JPL /<br>Field AI                           |
| Thesis writing                              | -  | 06/2027<br>11/2027 | YES   |
| Publications                                | • Full system paper (journal: RAL or conference: ICRA)   |                    |   |

## 3. Training and research activities plan

First academic year (planned)

|    |   | Description  | Period                   | Final<br>Exam | ECTS         |
|----|---|--|--------------------------|---------------|--------------|
| A. | Ph.D. courses   | Numerical methods for Big Data   | 14/01/2025<br>13/02/2025 | Yes           | 2            |
|    |   | Deep Learning  | 11/02/2025<br>20/02/2025 | Yes           | 2            |
| B. | Master's degree courses   | Sistemi elettronici digitali (1st module)  | 01/11/2024<br>31/12/2025 | Yes           | 6            |
| C. | Soft skill courses  |  |                          |               |              |
| D. | Participation to seminars                                       |  |                          |               |              |
| E. | Participation to international                                  | 2024 IEEE IHTC<br>1 day  | 27/11/2024<br>30/11/2024 |               | 1            |
|    | congresses or<br>workshops                                      | 2025 IROS<br>3 days  | 19/10/2025<br>25/10/2025 |               | 3            |
| F. | Presentation of research products at international              | 2024 IEEE IHTC Research work with post-lauream scholarship (already accepted for conference)   | 27/11/2024<br>30/11/2024 |               | 2            |
|    | congresses or<br>workshops                                      | 2025 IROS Target-driven predictive trajectory using transformers   | 19/10/2025<br>25/10/2025 |               | 2            |
|    | TOTAL OF ECTS FOR TRAINING ACTIVITIES                           |  |                          |               | 18           |
| G. | Individual research activity                                    | Background & related work analysis  • AI models for semantic space representation  • Multi-modal navigation models (and object-goal)  • Digital twins in autonomous navigation | 01/11/2024<br>31/03/2025 |               | 12 (300h)    |
|    |   | Implementation  Transformer architectures for target-driven predictive trajectory  Text-vision navigation  | 01/04/2025<br>31/10/2025 |               | 22<br>(550h) |
|    |   |  |                          |               | 6<br>(150h)  |
| Н. | students  |  |                          |               |              |
| I. | Integrative teaching activities                                 |  |                          |               |              |
| J. | Preparation of<br>manuscripts for<br>conferences or<br>journals | Transformer-based systems for predictive trajectory in cluttered environments (target: 2025 IROS + journal)  | 01/09/2025<br>31/10/2025 |               | 2<br>(50h)   |
|    |   | TOTAL OF ECTS FOR RESEARCH ACT   | VITIES                   |               | 42           |
|    |   | TOTAL OF ECTS  |                          |               | 60           |

Second academic year (planned)

|                |   | Description   | Period                   | Final<br>Exam | ECTS         |
|----------------|---|---|--------------------------|---------------|--------------|
| A.             | Ph.D. courses   | Linear and Nonlinear Kalman filtering: theory and applications  | 10/02/2026<br>18/02/2026 | Yes           | 2            |
|                |   | Optimization theory   | 24/03/2026<br>07/04/2026 | Yes           | 2            |
|                |   | Exploring latest cybersecurity technologies and trends  | 11/02/2026<br>18/02/2026 | Yes           | 2            |
|                |   | Non-linear control  | 09/06/2026<br>20/06/2026 | Yes           | 2            |
| В.             | Master's degree courses   |   | 20/00/2020               |               |              |
| $\overline{C}$ | Soft skill courses  |   |                          |               |              |
|                | Participation to seminars                                       | MIT Robotics seminar (5h)  • Multi-robot mission optimization   |                          |               | 1.5          |
|                | semmars   | Stanford Intelligent Systems seminar (5h)  Partially Observable Markov  |                          |               | 1.5          |
|                |   | Decision Process (POMDP) for path planning under uncertainty  |                          |               |              |
| E.             | Participation to international                                  | 2026 ICRA<br>3 days   | TBD                      |               | 3            |
|                | congresses or<br>workshops                                      | 2026 IROS (or other)<br>1 day   | TBD                      |               | 1            |
| F.             | Presentation of research products at international              | 2026 ICRA Text-vision architectures for object-goal navigation  | TBD                      |               | 2            |
|                | congresses or workshops   | 2026 IROS (or other) Survey on digital twins in robotic autonomy  | TBD                      |               | 2            |
|                | •   | TOTAL OF ECTS FOR TRAINING ACTIV  | VITIES                   |               | 19           |
| G.             | Individual research activity                                    | Update Background analysis  • Multi-modal navigation models • Digital twins in autonomous   | 01/11/2025<br>31/12/2025 |               | 5<br>(125h)  |
|                |   | navigation  | 01/11/0007               |               | 2.4          |
|                |   | Implementation  • Setup of first Digital twin (ROS gazebo + transformation tree)  • First version of multi-modal architecture incorporating LLMs  | 01/11/2025<br>31/05/2026 |               | 24<br>(600h) |
|                |   | Data gathering  • Create open-source dataset with simulation data  • Model optimization   | 01/06/2026<br>31/07/2026 |               | 4<br>(100h)  |
|                |   | Testing and optimization  | 01/08/2026<br>31/10/2026 |               | 4<br>(100h)  |
| Н.             | Supervision of students   |   |                          |               |              |
| I.             | Integrative teaching activities                                 |   |                          |               |              |
| J.             | Preparation of<br>manuscripts for<br>conferences or<br>journals | Text-vision architectures for object-goal navigation (target: ICRA) Survey on digital twins in robotic autonomy (target: IROS) Survey on multi-modal architectures for semantic-aware autonomous navigation (target: RAL) | 01/01/2026<br>31/03/2026 |               | 4<br>(100h)  |
|                |   | TOTAL OF ECTS FOR RESEARCH ACT  | VITIES                   |               | 41           |
|                |   | TOTAL OF ECTS   |                          |               | 60           |

#### Third academic year (planned)

|    |  | Description  | Period                   | Final<br>Exam | ECTS         |
|----|--|--|--------------------------|---------------|--------------|
| Α. | Ph.D. courses  |  |                          |               |              |
| В. | Master's degree courses  |  |                          |               |              |
| C. | Soft skill courses   |  |                          |               |              |
|    | Participation to seminars  |  |                          |               |              |
| E. | Participation to<br>international<br>congresses or<br>workshops                        |  |                          |               |              |
| F. | Presentation of<br>research products at<br>international<br>congresses or<br>workshops |  |                          |               |              |
|    |  | TOTAL OF ECTS FOR TRAINING ACTIVITIES  |                          |               | 0            |
| G. | Individual research activity   | <ul> <li>Integration and testing</li> <li>Real-hardware implementation</li> <li>Sym-to-real gap analysis</li> <li>Full system integration (simulation and real robot)</li> <li>Performance analysis</li> </ul> | 01/11/2026<br>31/01/2027 |               | 16<br>(400h) |
|    |  | System optimization  • Re-training using mixed data gathered via digital twin (simulation and real-world)  Final testing   | 01/02/2027<br>31/08/2027 |               | 20<br>(500h) |
|    |  | Thesis writing   | 01/06/2027<br>31/10/2027 |               | 20<br>(500h) |
| Н. | Supervision of students  |  |                          |               |              |
| I. | Integrative teaching activities  |  |                          |               |              |
| J. | Preparation of<br>manuscripts for<br>conferences or<br>journals                        | Full system paper (target: RAL or ICRA)  | 01/07/2027<br>31/08/2027 |               | 4<br>(100h)  |
|    |  | TOTAL OF ECTS FOR RESEARCH ACTI  | VITIES                   |               | 60           |
|    |  | TOTAL OF ECTS  |                          |               | 60           |

|            | LONGO Antonello     |
|------------|---------------------|
|            |                     |
| Prof. GUAR | AGNELLA Cataldo     |
| F          | Prof. PIRO Giuseppe |