#### Nuno FERREIRA DUARTE

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nuno.ferreiraduarte@epfl.ch

A Personal Website

Google Scholar profile

GitHub account

#### RESEARCH Interests

Integrating in robots human action/intention capabilities: Human-Robot Interaction, Bio-inspired systems, Motion Planning, Learning; My work focuses on human action understanding from neurological, psychological, and physiological behaviour. The importance non-verbal communication behaviour has on decoding human action intention. Using non-verbal cues as a communication language between humans and robots with the goal of having robots that understand actions and are understood by humans.

#### **EDUCATION**

Instituto Superior Técnico (IST), Portugal École Polytechnique Fédérale de Lausanne (EPFL), Switzerland

IST-EPFL Joint-Doctoral Program Ph.D., Electrical and Computer Engineering, April 2023

- Thesis Topic: Non-verbal Communication between Humans and Robots: Imitation, Mutual Understanding and Inferring Object Properties
- Summa cum laude, Pass with Distinction and Honour
- Advisers: Professor José Santos-Victor, Professor Aude Billard

#### Instituto Superior Técnico (IST), Portugal

M.S., Electrical and Computer Engineering, August 2016

- Cum laude, 16/20
- Thesis Topic: Multi-UAV Mission Coordination using Signal Temporal Logic Specifications
- Adviser: Professor Pedro U. Lima
- Area of Study: Systems, Decision and Control

B.S., Electrical and Computer Engineering, August 2014

- Systems, Decision and Control specialization (emphasis on control, modelling and simulation)
- Minor in Computers (programming and algorithms)

# REFEREED JOURNAL PUBLICATIONS

- [1] Nuno F. Duarte, Aude Billard, and José Santos-Victor. The role of object physical properties in human handover actions: Applications in robotics. *IEEE Transactions on Cognitive and Developmental Systems*, pages 1–1, 2022a
- [2] Mirko Raković, Nuno Ferreira Duarte, Jorge Marques, Aude Billard, and José Santos-Victor. The gaze dialogue model: Nonverbal communication in hhi and hri. *IEEE Transactions on Cybernetics*, pages 1–0, 2022
- [3] R. Sanchez-Matilla, K. Chatzilygeroudis, A. Modas, Nuno Ferreira Duarte, A. Xompero, P. Frossard, A. Billard, and A. Cavallaro. Benchmark for human-to-robot handovers of unseen containers with unknown filling. *IEEE Robotics and Automation Letters*, 5(2):1642–1649, 2020
- [4] Nuno Ferreira Duarte, Mirko Raković, Jovica Tasevski, Moreno Ignazio Coco, Aude Billard, and José Santos-Victor. Action Anticipation: Reading the Intentions of Humans and Robots. *IEEE Robotics and Automation Letters*, 3(4):4132–4139, October 2018

#### Conference Publications

- [5] Seyed S Mohammadi, Nuno F Duarte, Dimitris Dimou, Yiming Wang, Matteo Taiana, Pietro Morerio, Atabak Dehban, Plinio Moreno, Alexandre Bernardino, Alessio Del Bue, et al. 3dsgrasp: 3d shape-completion for robotic grasp. In 2023 International Conference on Robotics and Automation (ICRA), 2023
- [6] Linda Lastrico, Nuno Ferreira Duarte, Alessandro Carfí, Francesco Rea, Fulvio Mastrogiovanni, Alessandra Sciutti, and José Santos-Victor. If you are careful, so am i! how robot communicative motions can influence human approach in a joint task. In Social Robotics: 14th International Conference, ICSR 2022, Florence, Italy, December 13–16, 2022, Proceedings, Part I, pages 267–279. Springer, 2023
- [7] Nuno Ferreira Duarte, Mirko Raković, and José Santos-Victor. Robot learning physical object properties from human visual cues: A novel approach to infer the fullness level in containers. In 2022 International Conference on Robotics and Automation (ICRA), pages 10375–10381, 2022b
- [8] Nuno Ferreira Duarte, Mirko Raković, and José Santos-Victor. Learning motor resonance in human-human and human-robot interaction with coupled dynamical systems. In 2021 IEEE International Conference on Robotics and Automation (ICRA), pages 3662–3668. IEEE, 2021
- [9] Nuno Ferreira Duarte, Konstantinos Chatzilygeroudis, José Santos-Victor, and Aude Billard. From human action understanding to robot action execution: how the physical properties of handled objects modulate non-verbal cues. In 2020 Joint IEEE 10th International Conference on Development and Learning and Epigenetic Robotics (ICDL-EpiRob), pages 1–6, Valparaiso, Chile, October 2020. IEEE
- [10] Nuno Ferreira Duarte, Mirko Raković, Jorge Marques, and José Santos-Victor. Action Alignment from Gaze Cues in Human-Human and Human-Robot Interaction. In Computer Vision ECCV 2018 Workshops, volume 11131, pages 197–212. Springer International Publishing, 2019a
- [11] Nuno Ferreira Duarte, Mirko Rakovic, and José Santos-Victor. Coupling of Arm Movements during Human-Robot Interaction: the handover case. In 2019 28th IEEE International Conference on Robot and Human Interactive Communication (RO-MAN), pages 1–6, New Delhi, India, October 2019d. IEEE
- [12] Nuno Ferreira Duarte, Mirko Raković, and José Santos-Victor. Biologically inspired controller of human action behaviour for a humanoid robot in a dyadic scenario. In IEEE EUROCON 2019-18th International Conference on Smart Technologies, pages 1–6. IEEE, 2019b
- [13] Danilo Nikić, Nikola Ilić, Darko Todorović, Nuno Ferreira Duarte, José Santor-Victor, Branislav Borovac, and Mirko Raković. Eye gaze and body motion synchronization in dyadic interaction
- [14] Mirko Raković, Nuno Duarte, Jovica Tasevski, Joé Santos-Victor, and Branislav Borovac. A dataset of head and eye gaze during dyadic interaction task for modeling robot gaze behavior. MATEC Web of Conferences, 161:03002, 2018
- [15] Hugo Simão, João Avelino, Nuno Duarte, and Rui Figueiredo. Geebot: A robotic platform for refugee integration. In *Companion of the 2018 ACM/IEEE International Conference on Human-Robot Interaction*, pages 365–366, 2018
- [16] João Avelino, Hugo Simão, Ricardo Ribeiro, Plinio Moreno, Rui Figueiredo, Nuno Duarte, Ricardo Nunes, Alexandre Bernardino, Martina Čaić, Dominik Mahr, et al. Experiments with vizzy as a coach for elderly exercise. In Companion

of the 2018 ACM/IEEE International Conference on Human-Robot Interaction, 2018

#### Conference Talks

- [17] N. Ferreira Duarte. "Robot Learning physical object properties from Human Visual Cues: A novel approach to infer the fullness level in containers", in *IEEE 2022 ICRA* in Philadelphia. May 23 27.
- [18] N. Ferreira Duarte. "Learning Motor Resonance in Human-Human and Human-Robot Interaction with Coupled Dynamical Systems", in *IEEE 2021 ICRA* in China (Online). May 30 June 5.
- [19] N. Ferreira Duarte. "From human action understanding to robot action execution: how the physical properties of handled objects modulate non-verbal cues", in *IEEE 2020 RO-MAN* in Chile (Online). October 26–30.
- [20] Nuno Ferreira Duarte, Mirko Raković, and José Santos-Victor. Should robots behave like humans? an approach to analyse non-verbal gaze cues in human-robot interaction. In ICDL-EpiRob 2019 Workshops. Presented but no publication, 2019c in Olso, Norway. August 19–22
- [21] N. Ferreira Duarte. "Coupling of Arm Movements during Human-Robot Interaction: the handover case", in *IEEE 2019 RO-MAN* in New Delhi, India. October 14–18.
- [22] N. Ferreira Duarte. "Biologically Inspired Controller of Human Action Behaviour for a Humanoid Robot in a Dyadic Scenario", in *IEEE 2013 EUROCON* in Novi Sad, Serbia. July 1–4.
- [23] N. Ferreira Duarte. "Studying the human behavior in dyadic interactions and applications to human-robot interactions", 2018 Mind Brain College in Lisbon, Portugal. November 14–15.
- [24] N. Ferreira Duarte. "Action Alignment from Gaze Cues in Human-Human and Human-Robot Interaction", The 2018 Computer Vision (ECCV) 2018 Workshops in Munique, Germany. September 8–14.
- [25] N. Ferreira Duarte. "Studying the human behavior in dyadic interactions and applications to human-robot interactions", The 2018 LARSys Meeting in Lisbon, Portugal. June 14–15.
- [26] N. Ferreira Duarte. "A dataset of head and eye gaze during dyadic interaction task for modeling robot gaze behavior", The 2018 Conference in Saint Petersburg, Russia. April 18–21.
- [27] N. Ferreira Duarte. "GeeBot: A Robotic Platform for Refugee Integration", The 2018 ACM/IEEE International Conference on Human-Robot Interaction in Chicago, USA. March 5–8.
- [28] N. Ferreira Duarte. "Experiments with Vizzy as a Coach for Elderly Exercise", The 2018 ACM/IEEE International Conference on Human-Robot Interaction in Chicago, USA. March 5–8.

#### INVITED TALKS

- [29] Ferreira Duarte, N. From human action understanding to robot action execution: how the physical proper-ties of handled objects modulate non-verbal cue. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, April 14, 2020.
- [30] Ferreira Duarte, N. A Dataset Design for Human-Human and Human-Robot Collaboration. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, March 12, 2019.

- [31] Ferreira Duarte, N. On going work of my Ph.D. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, January 29, 2019.
- [32] Ferreira Duarte, N. Studying the human non-verbal communication behavior in dyadic interactions and applications to human-robot interactions. In: *LASA*, *EPFL*, *Lausanne*, *Switzerland*, September 21, 2018.
- [33] Ferreira Duarte, N. Action Alignment from Gaze Cues in Human-Human and Human-Robot Interaction. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, September 4, 2018.
- [34] Ferreira Duarte, N. A Dataset of Head and Eye Gaze during Dyadic Interaction Task For Modeling Robot Gaze Behavior. In: *Vislab*, *Institute Systems and Robotics (ISR)*, *University of Lisbon* May 8, 2018.
- [35] Ferreira Duarte, N. GeeBot A robotic platform for refugee integration. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, January 16, 2018.
- [36] Ferreira Duarte, N. Action Anticipation: Reading the Intentions of Humans and Robots. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, October 17, 2017.
- [37] Ferreira Duarte, N. "Facilitating Intention Prediction for Humans by Optimizing Robot Motions" paper by Manuel Lopes. In: Vislab, Institute Systems and Robotics (ISR), University of Lisbon, March 28, 2017.

## OTHER PUBLICATIONS

- [38] Ferreira Duarte, N. Non-verbal Communication between Humans and Robots: Imitation, Mutual Understanding and Inferring Object Properties. PhD thesis, École Polytechnique Fédérale de Lausanne, Lausanne, Switzerland, 2023.
- [39] Ferreira Duarte, N. Non-verbal Communication between Humans and Robots: Imitation, Mutual Understanding and Inferring Object Properties. PhD thesis, Instituto Superior Técnico, Lisbon, Portugal, 2023.
- [40] Ferreira Duarte, N. Multi-UAV Mission Coordination using Signal Temporal Logic Specifications. Master's thesis, Instituto Superior Técnico, Lisbon, Portugal, 2016.

#### Papers in Preparation

- [41] Linda Lastrico, Nuno Ferreira Duarte, Alessandro Carfí, Francesco Rea, Fulvio Mastrogiovanni, José Santos-Victor, Alessandra Sciutti. Like Robots, Like Humans: Pupil Dilation during Collaborative Object Manipulation
- [42] Linda Lastrico, Nuno Ferreira Duarte, Alessandro Carfí, Francesco Rea, Fulvio Mastrogiovanni, Alessandra Sciutti, José Santos-Victor. Expressing and Inferring Action Carefulness in Human-to-Robot Handovers

#### TEACHING EXPERIENCE

## École Polytechnique Fédérale de Lausanne, Switzerland

 $Teaching\ Assistant$ 

#### February 2020 to October 2020

- Assisted Applied Machine Learning instructional team.
- Provided support to fourth-year engineering students (MICRO-455).
- Assisted students in Practical and Lab sessions.

#### Professional SERVICE

#### Referee Service

- IEEE International Conference on Advanced Intelligent Mechatronics
- IEEE International Symposium on Intelligent Systems and Informatics
- IEEE International Conference on Robotics and Automation
- IEEE/RSJ International Conference on Intelligent Robots and Systems
- IEEE International Conference on Development and Learning
- IEEE International Conference on Human Robot Interaction
- The International Journal of Robotics Research
- Journal of Frontiers in Robotics and AI
- Journal John Benjamins Interaction Studies
- Journal of Interaction Studies
- International Journal of Social Robotics

#### Professional Memberships

Institute for Electrical and Electronics Engineers (IEEE), Member, 2016-present

• IEEE Robotics and Automation Society (2021–present)

#### OTHER MEETING Invited Participant

#### ATTENDANCE

- LarSys Annual Meeting 2022, July, 2022
- LarSys Annual Meeting 2022, July, 2019
- LarSys Annual Meeting 2022, July, 2018
- 3rd Meeting Mind-Brain College Lisbon, October 19–20, 2017

#### APPLICATION Areas

Human-Human Interaction, Human-Robot Interaction, Non-verbal Communication, Eyetracking, Motion-tracking, Grasping, Physical Human-Robot Interaction, Human-inspired Modelling

#### Hardware and

Computer Programming:

SOFTWARE SKILLS • C++, Python, UNIX shell scripting, GNU make

#### Robot Programming:

• ROS, YARP

#### Numerical Analysis:

• Matlab

#### Matlab skill set:

• Linear algebra, Monte Carlo analysis, nonlinear numerical methods, polynomials, statistics, N-dimensional filters, visualization

#### Information/Internet Technology:

• Networking (UDP, TCP)

### Desktop Editing and Productivity Software:

- Vim, PyCharm, Gedit
- T<sub>F</sub>X (L<sup>A</sup>T<sub>F</sub>X, BIBT<sub>F</sub>X),
- Microsoft Office, LibreOffice, Apple iWork
- GIMP, Mathcha.io

#### Operating Systems:

• Microsoft Windows family, Apple OS X, Linux, Ubuntu, Fedora, and other UNIX variants

#### EXPERTISE

#### Mathematics:

• Applied Mathematics, Differential Equations, Linear Algebra, Calculus,

Sensors and Actuators:

- Pupil-Labs Eye-tracker glasses, Pupil Capture, Pupil Record
- OptiTrack 12 camera system, OptiTrack bar, OptiTrack Motive,
- Myo EMG

#### Robots:

- KUKA iiwa
- Kinova gen-3
- iCub

Control Theory and Engineering:

• Linear and Nonlinear Systems Theory, Dynamic Optimization, Multivariable Control Theory, Biomimicry, Bioinspiration

Communications and Signal Processing:

• Probability, Random Variables, Stochastic Processes, Estimation, Networks

Machine Learning and Engineering:

• Clustering, Component Analysis, Gaussian Mixture Modelling Regression, Markov Models, Neural Networks, among others

#### AWARDS

FCT: Foundation for Science and Technology (Portugal)

• PhD Scholarship, 2016–2020

Research Intern at Caltech (United States)

• SURF: Summer Undergraduate Research Fellowships, 2015

#### REFERENCES AVAILABLE TO CONTACT

Dr. José Santos-Victor (e-mail: jasv@isr.tecnico.ulisboa.pt; phone: +351 21.8418.294)

- Full Professor, Department of Electrical and Computer Engineering, Instituto Superior Técnico
- Instituto Superior Técnico, ISR Torre Norte Av. Rovisco Pais, 1049-001 Lisboa, Portugal
- \* Dr. Santos-Victor was my PhD co-supervisor.

Dr. Aude Billard (e-mail: aude.billard@epfl.ch; phone: +41 21 693 54 64)

- Full Professor, Institute of Electrical and Micro Engineering, EPFL
- ♦ EPFL STI IMT LASA, ME A3 393 (Bâtiment ME) Station 9, CH-1015 Lausanne
- \* Dr. Billard was my PhD co-supervisor.