## DR. GIACOMO FRISONI

I'm a PhD Student in Computer Science and Engineering at the University of Bologna. I investigate how to combine language models and structured knowledge for Natural Language Processing and Understanding in Health domains.



## // CONTACT

- giacomo.frisoni@unibo.it
- Via dell'Università, 5047522 Cesena (FC), Italy
- +39 0547 338820 (office) +39 331 2718059 (personal)
- Personal website

#### Research and academy

- D 0000-0003-1104-2014
- DBLP
- Scholar
  Scholar
- Scopus
- University of Bologna
- DISI UniBo NLP Research Group

#### Development

- @GiacomoFrisoni
- @gfrisoni

#### Social and misc

in Giacomo Frisoni

#### // CITIZENSHIP

**■** Italy

#### // LANGUAGES

■ Italian Mother language

English B2 level

## // RESEARCH INTERESTS

Neuro-Symbolic Learning

**Natural Language Processing** 

Natural Language Understanding

**Text Mining** 

**Semantic Parsing** 

Explainable AI

**Knowledge Graphs** 

Knowledge Representation and Reasoning

**Graph Neural Networks** 

Deep Representation Learning

Al for Health informatics

## // EDUCATION

10/2020 - 10/2023

CESENA (FC), ITALY

Ph.D., Computer Science and Engineering Department of Computer Science and Engineering, University of Bologna

- Ministerial scholarship
- Supervisor: Gianluca Moro
- Tutor: Antonella Carbonaro
- Area of study: Natural Language Understanding

# M.S., Computer Science and Engineering University of Bologna

- Cumulative GPA: 4.0 (transcript)
- Graduation score: 110/110 cum Laude
- Graduation class: Computer Engineering
- Thesis topic: A new unsupervised methodology of descriptive text mining for knowledge graph learning
- Supervisor: Gianluca Moro
- Co-Supervisor: Antonella Carbonaro
- · Area of study: Text Mining

# B.S., Computer Science and Engineering University of Bologna

- Cumulative GPA: 4.0 (transcript)
- Graduation score: 110/110 cum Laude
- Graduation class: Computer Engineering
- Thesis topic: Design and development of a software system for studying and researching rare diseases
- Supervisor: Dario Maio
- Area of study: Databases

**6** 09/2014 - 10/2017

CESENA (FC), ITALY

## Scientific High School

ITIS Leonardo Da Vinci

- Final score: 100/100 cum Laude
- Member of the National Register of Excellence
- Focus on Cryptography (Bletchley Park Visitor)

## // 🗱 EXPERIENCE

03/2020 - 10/2020 CESENA (FC), ITALY

Pre-doctoral Researcher

▶ Univerisity of Bologna

Program Attendee at The Cornell, Maryland, Max-Planck Pre-doctoral Research School

 $\blacktriangleright$  Max Planck Institute for Software Systems I was granted the opportunity to be one of  $\approx\!100$ 

I was granted the opportunity to be one of ≈100 students internationally selected to participate in the Cornell, Maryland, Max Planck Pre-doctoral Research School in 2020, Saarbrücken, Germany (moved online due to COVID-19 pandemic). During this period, I attended lectures conducted by the top scientists and faculty members from participating institutions on various cutting-edge topics, including scalable machine learning and deep learning adversarial attacks. Certificate.

**1** 01/2017 - 01/2020

SMART WORKING ROME (RM), ITALY

#### Software Developer

CSEN, National Educational Sports Center

Designed, developed, and deployed the software system used in Italy by CSEN for judging taekwondo Poomsae during national competitions. Main use of C# and Kotlin.

03/2017 - 05/2017 CESENA (FC), ITALY

#### **Trainee Student**

Smart City Laboratory

Designed, developed, and deployed a Microsoft Azure SQL database for supporting the investigation of rare diseases on the national territory.

**6** 06/2013 - 08/2013 02/2013 - 02/2013 06/2012 - 08/2012 RIMINI (RN), ITALY

#### **Trainee Student**

▶ Esa Software (now Team System)

Advanced use of .NET. Windows Presentation Foundation, and C#.

## // ACHIEVEMENTS, HONOURS AND AWARDS

#### **▼ Con.Scienze 2020 Award Winner** (02/2021)

National Conference of the Presidents and Directors of Science and Technology National award—with only one nomination per university department for having written one of the ten best scientific research works during the master's thesis.

#### PhD Call First Position (07/2020)

First position in the ranking out of 132 participants for the PhD call in Computer Science and Engineering, University of Bologna.

#### **P** Best Paper Award (03/2020)

9th International Conference on Data Science, Technology and Applications (DATA 2020) The DATA conference series is a reference venue for researches in data/text mining. In 2020, my first co-authored paper "Learning Interpretable and Statistically Significant Knowledge from Unlabeled Corpora of Social Text Messages: A Novel Methodology of Descriptive Text Mining" has been selected as the best contribution among the 70 papers that got past the peer review (14% acceptance rate). The award included an invitation to submit an extended version on Springer Volume. Certificate.

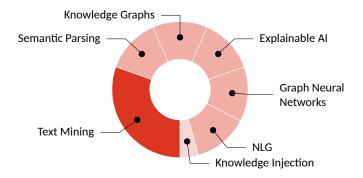
#### ₱ High School Awards (2014)

Awards as the best student of ITIS Leonardo Da Vinci Scientific High School according to career results:

- winner of the Guido Paolucci Scholarship, BCC of Gradara;
- certificate of Merit and Scholarship, Banca Malatestiana;
- winner of the "Talent Search" project, a training course concerning the programming of microcontrollers, Confindustria Rimini;
- winner of the "ITIS-CNA CAR competition: young inventors", best industrial project, educational software about Cryptography.

### // PUBLICATIONS

Author of 7 papers. Citations: 27, h-Index: 4 (Google Scholar metrics as of 2022-05-07). Main keywords and research areas are reported below.



## $^{\prime\prime}$ PRE-SKILLS $^*$

Leadership **Team Work** Communication Organizing Creativity Motivation **Problem Solving** 



## // PRO-SKILLS\*,†

## **Programming Languages**

**Python** R Scala Java C# Bash Prolog



#### Other Languages

LaTeX Markdown HTML, (S)CSS



#### **ML Frameworks**

**PyTorch** Jax/Flax **TensorFlow** Keras



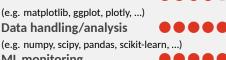
## **Operating Systems**

Windows Linux **MacOS** 



#### Software & Tools

Visualization (e.g. matplotlib, ggplot, plotly, ...) Data handling/analysis



ML monitoring (e.g. W&B, TensorBoard, ...)

**NLP libraries** 



(e.g. HuggingFace, spaCy, ...) Docker

\* Average on anonymous scores (from 0 to 5, rounded down) requested from the people I collaborated with (colleagues, teachers, supervisors, and professionals outside the IT context)

#### † The proficiency skill evaluation scale has the following meaning

No Experience Can read and make small changes to existing programs Can utilize basic features without much help 

Can develop medium programs and do nontrivial troubleshooting Can develop large programs using all basic and advanced features

Understanding and (appropriate) usage of most lesser-known features

## // CERTIFICATES

**Natural Language Processing** Specialization

Coursera, 10/2020 - /

ID NV29J2BMGADP

**Natural Language Processing with Attention Models** 

Coursera, 10/2020 - /

ID VMQSUQBGQJPM

**Natural Language Processing with Classification and Vector Spaces** 

Coursera, 08/2020 - /

% ID QK8EQ2GF87YN

Natural Language Processing with **Probabilistic Models** 

Coursera, 08/2020 - /

ID QPALRXRLYWW5

Natural Language Processing with Sequence Models

Coursera, 08/2020 - /

ID 276YSYDTCSLH

## // REFEREES

List of references available to contact:

#### Prof. Gianluca Moro

gianluca.moro@unibo.it

1 M.S. and Ph.D. Thesis Supervisor

#### **Prof. Antonella Carbonaro**

antonella.carbonaro@unibo.it

1 M.S. Thesis Co-Supervisor and Ph.D. Tutor

## // VOLUNTERRING

AMAE Onlus - National Association for

Esophageal Achalasia, 2019 - today

In September 2016 I discovered I have a rare disease called "Esophageal Achalasia". Since then I have dedicated myself to merging my NLP skills and patient-centered experiences for creating tools in medical and biomedical domains finalized to research advancement.

- Member of the board of directors
- · Representative of the IT sector
- Data Scientist

## // MOTTOS

- **66** While technology is important, it's what we do with it that truly matters.
  - Muhammad Yunus, Nobel Peace Prize Winner
- **66** Language is at the heart of human intelligence. It therefore is and must be at the heart of our efforts to build artificial intelligence. No sophisticated AI can exist without mastery of language.

- Rob Towes, Forbes

## **Contributions in Conference Proceedings Sorted By Time**

Learning Interpretable and Statistically Significant Knowledge from Unlabeled Corpora of Social Text Messages: A Novel Methodology of Descriptive Text Mining @

G. Frisoni, G. Moro, A. Carbonaro

₩ 2020

Proceedings of the 9th International Conference on Data Science, Technology and Applications, DATA 2020, Lieusaint, Paris, France, July 7-9, 2020, pp. 121-134, SciTePress (14% acceptance rate)

Unsupervised Descriptive Text Mining for Knowledge Graph Learning 🚭

**G. Frisoni**, G. Moro, A. Carbonaro

**2020** 

Proceedings of the 12th International Joint Conference on Knowledge Discovery, Knowledge Engineering and Knowledge Management, IC3K 2020, Volume 1: KDIR, Budapest, Hungary, November 2-4, 2020, vol. 1,

pp. 316-324, SciTePress (21% acceptance rate)

Phenomena explanation from text: Unsupervised learning of interpretable and statistically significant knowledge 🚳

**G. Frisoni**, G. Moro

DATA (Revised Selected Papers), Communications in Computer and Information Science, vol. 1446, pp. 293-318, Springer

## **Journal Publications Sorted By Time**

A Survey on Event Extraction for Natural Language Understanding: Riding the Biomedical Literature Wave

G. Frisoni, G. Moro, A. Carbonaro

2021 **I** IEEE Access, vol. 9, pp. 160721-160757

Unsupervised event graph representation and similarity learning on biomedical literature 🚭

G. Frisoni, G. Moro, G. Carlassare, A. Carbonaro

🗎 2021 **3** Sensors, vol. 22 (1)

Human Being Detection from UWB NLOS Signals: Accuracy and Generality of Advanced Machine Learning Models 🚭

G. Moro, F. Di Luca, D. Dardari, G. Frisoni

## 2021 Sensors, vol. 22 (4)

## **Contributions in Forums Sorted By Time**

Towards rare disease knowledge graph learning from social posts of patients

👺 G. Frisoni, G. Moro, A. Carbonaro

**#** 2020

Research and Innovation Forum 2020 - Disruptive Technologies in Times of Change, RIIFORUM 2020, Athens, Greece, 15-17 April 2020, pp. 577-589, Springer

#### **Planned**

Event-Augmented Summarization of Biomedical Scientific Reviews

G. Frisoni, P. Italiani, F. Boschi, G. Moro

Next to be submitted to DATA 2022 (12th May)

Efficient Cross-Modal Retrieval in Fashion Domain Decoupling Caption and Image Embeddings

G. Moro, S. Salvatori, G. Frisoni

Next to be submitted to Neurocomputing (May)

Abstract: In this paper, we address the problem of cross-modal retrieval of fashion products. State-of-the-art (SOTA) solutions proposed in literature use vision-and-language transformers to assign similarity scores to joint text-image pairs, then used for sorting the result during a retrieval phase. However, this approach is inefficient since it requires coupling a query with every record in the dataset and computing a forward pass for each sample at runtime, precluding scalability to large-scale datasets. We thus propose a solution that overcomes the above limitation by combining transformers and deep metric learning to create a latent space where text and images are separately embedded and their spatial proximity translates into semantic similarity. We improve SOTA results on the benchmark dataset FashionGen, also showing that, unlike existing solutions, ours enables the adoption of multi-dimensional indices, with which cross-modal retrieval scales in logarithmic time up to millions, and potentially billions, of texts and images.

Text-to-Text Extraction and Verbalization of Biomedical Event Graphs

👺 G. Frisoni, G. Moro, L. Balzani

Next to be submitted to COLING 2022 (17th May)

Abstract: Biomedical events represent complex, graphical, and semantically rich interactions expressed in the scientific literature. Almost all contributions in the event realm orbit around semantic parsing, usually employing discriminative architectures and cumbersome multi-step pipelines limited to a small number of target interaction types. We present the first lightweight framework to solve both event extraction and event verbalization with a unified text-to-text approach, allowing to fuse all the resources so far designed for different tasks. To this end, we present a new event graph linearization technique and release highly comprehensive event-text paired datasets, covering more than 150 event types from multiple biology subareas. By streamlining parsing and generation to translations, we propose baseline transformer model results according to multiple biomedical text mining benchmarks and NLG metrics. Our extractive models achieve greater state-of-the-art performance than single-task competitors and show promising capabilities for the controlled generation of coherent natural language utterances from structured data.

NLG-Metricverse: An End-to-End Library for Evaluating Natural Language Generation

👺 G. Frisoni, A. Carbonaro, G. Moro, A. Zammarchi, M. Avagnano

Next to be submitted to COLING 2022 (17th May)

Abstract: Driven by deep learning breakthroughs, natural language generation (NLG) models have been at the center of steady progress in the last few years, with a ubiquitous task influence. However, since our ability to generate human-indistinguishable artificial text lags behind our capacity to assess it, it is paramount to develop and apply even better automatic evaluation metrics. To facilitate researchers to judge the effectiveness of their models broadly, we introduce NLG-Metricverse — an end-to-end open-source library for NLG evaluation based on Python. Our framework provides a living collection of NLG metrics in a unified and easy-to-use environment, supplying tools to efficiently apply, analyze, compare, and visualize them. This includes (i) the extensive support to n-gram- and embedding-based metrics with n-arity management, (ii) the meta-evaluation upon time performance, CO2 emissions, metric-metric and metric-human correlations, (iii) graphical interpretations for helping humans better gain score intuitions, (iv) formal categorization and convenient documentation to accelerate metrics understanding. NLG-Metricverse aims to increase the comparability and replicability of NLG research, hopefully stimulating new contributions in the field.

Bio-QA-GNN: Interpretable Biomedical Question Answering Combining Language Models and Knowledge Graphs

👺 G. Frisoni, G. Moro, A. Carbonaro, F. Boschi, E. Gnagnarella

Next to be submitted to Oxford Bioinformatics (June)

Abstract: *Motivation*: Injecting world or domain-specific structured knowledge into pre-trained language models (PLMs) is becoming an increasingly popular approach for solving problems such as biases, hallucinations, huge architectural sizes, and explainability lack—critical for real-world natural language processing applications in sensitive fields like bioinformatics. One recent work that has garnered much attention in Neuro-symbolic AI is QA-GNN by Yasunaga et al. (2021), an end-to-end model for multiple-choice open-domain question answering (MCOQA) tasks via interpretable text-graph reasoning. Unlike previous publications, QA-GNN mutually informs PLMs and graph neural networks (GNNs) on top of relevant facts retrieved from knowledge graphs (KGs). However, taking a more holistic view, existing PLM+KG contributions mainly consider commonsense benchmarks and ignore or shallowly analyze performances on biomedical datasets. *Results*: This paper proposes a deep investigation of QA-GNN for biomedicine, comparing existing or brand-new PLMs, KGs, edge-aware GNNs, preprocessing techniques, and initialization strategies. By combining the insights emerged in our study, we introduce Bio-QA-GNN, a new state-of-the-art MCOQA model on biomedical/clinical text, largely outperforming the original one (+8% accuracy on MedQA). Our findings also contribute to a better understanding of the explanation degree allowed by joint text-graph reasoning architectures and their effectiveness on different medical subjects and reasoning types.

Cogito Ergo Summ: Event-Augmented Abstractive Summarization of Biomedical Papers

G. Frisoni, G. Moro, P. Italiani

Next to be submitted to EMNLP 2022 (July)

Abstract: In abstractive summarization tasks, most neural models purely rely on the source document text, tending to suffer from fabricated, near-extractive, and poorly informative generations typically non-admissible in medical science. The latest research trends call attention to incorporating semantic parsing for boosting salient content selection, interpretation, and compression. Still, current works are limited to static graphical representations based on shallow triples derived from off-the-shell open IE tools. This paper presents **CogitoErgoSumm**, a novel end-to-end framework for summarizing biomedical articles by jointly extracting and leveraging the structured closed-domain events mentioned within them. We propose to derive *bio-events* from raw sentences, *iteratively learn an event graph* for the entire document, use a *dual text-graph encoder*, and a *semantic-driven reward*. Automatic and human evaluations on the CDSR dataset show that our model significantly outperforms previous baselines, producing more informative outputs with fewer unfaithful errors and superior readability.

#### // SCIENTIFIC ACTIVITIES

#### **Participation in Research Groups**

☑ DISI UniBo NLP Research Group, ☐ 03/2020 - today, ⑤

The primary research group I worked with since my M.S. degree. The DISI UniBo NLP group—led by prof. Gianluca Moro—includes a team of Ph.D. students and researchers who are part of the Department of Computer Science and Engineering (DISI) of the University of Bologna, Italy. We pursue a vision focused on proposing original solutions for crucial NLP/NLU tasks, following innovative trends like XAI, memory-enhanced neural networks, graph neural networks, deep metric learning, cross-modal AI, and structured knowledge↔language model integration. Our papers have been accepted to top journals and conferences, including AAAI and ACL. We also have state-of-the-art hardware resources (e.g., +6 NVIDIA GeForce RTX 3090 Turbo 24GB) and powerful servers to support our projects.

## Selected papers from the group

- G. Moro and L. Valgimigli, "Efficient self-supervised metric information retrieval: A bibliography based method applied to COVID literature," Sensors, vol. 21, no. 19, 2021.
- G. Moro and L. Ragazzi, "Semantic Self-Segmentation for Abstractive Summarization of Long Documents in Low-Resource Regimes," In Proceedings of the 36th AAAI Conference on Artificial Intelligence, Vancouver, BC, Canada, 22 February–1 March 2022, pp. 1–9. AAAI Press, 2022.
- G. Moro, L. Ragazzi, L. Valgimigli, and Davide Freddi, "Discriminative Marginalized Probabilistic Neural Method for Multi-Document Summarization of Medical Literature," In Proceeding of the 60th Annual Meeting of the Association for Computational Linguistics. 2022.
- G. Moro, L. Ragazzi, and L. Valgimigli, "Large-sized Multi-document Summarization of Biomedical Studies with End-to-end Selective Marginalization Learning," Passed the first selection of IJCAI 2022.

#### **Research Projects**

Social media analysis centered on rare bone disease patients

Project selected for financing by the Department of Rare Skeletal Disorders, Rizzoli Orthopaedic Institute, Bologna.

## // TEACHING ACTIVITIES

#### **Seminars**

Introduction to Azure Cosmos DB \*\*

"web Services and Applications" M.S. course, Computer Science and Engineering, University of Bologna, March, 2018

Knowledge Graph Learning from Text

"Semantic Web" M.S. course, Computer Science and Engineering, University of Bologna, March 26, 2020

POIROT: Phenomena Explanation from Text

"Text Mining" M.S. course, Computer Science and Engineering, University of Bologna, December 2, 2020

A look at Knowledge Graphs, Ontologies and Semantic Similarity \*\*

"Semantic Web" M.S. course, Computer Science and Engineering, University of Bologna, March 22, 2021

A gentle introduction to Natural Language Understanding from Text:

from Phenomena Explanation to Event Extraction and Event Graph Embedding

"Data Mining, Text Mining and Big Data Analytics" M.S. course, Artificial Intelligence, University of Bologna, December 10, 2021

"Semantic Web" M.S. course, Artificial Intelligence, University of Bologna, April 4, 2022

"Data Intensive Applications" B.S. course, Artificial Intelligence, University of Bologna, April 27, 2022

#### **Co-supervision of Bachelor Students**

Extraction of medical correlations from unlabeled social posts with neural language models and data clustering

Candidate: Alessandro Lombardini, Supervisor: Gianluca Moro. October, 2020

Automatic translation of social documents shared by rare patients

Candidate: Anna Fabris, Supervisor: Antonella Carbonaro. October, 2020

Semantic similarity and clustering of concepts from the medical literature represented with language models and event-based knowledge graphs

Candidate: Giulio Carlassare, Supervisor: Antonella Carbonaro, Other Co-supervisor: Gianluca Moro. March, 2021

Time-evolving knowledge graphs based on Poirot: dynamic representation of patients' voices

Candidate: Samuele Ceroni, Supervisor: Antonella Carbonaro. March, 2021

Verbalization of biomedical events expressed in the scientific literature: controlled generation of natural language from semantic graphs by means of a text-to-tex transformer

Candidate: Lorenzo Balzani, Supervisor: Gianluca Moro. October, 2021

Study and experimentation of advanced metrics for the evaluation of natural language generation models

Candidate: Marco Avagnano, Supervisor: Antonella Carbonaro. December, 2021

Unsupervised representation and similarity learning for event graphs mentioned in the biomedical literature

Candidate: Eleonora Bertoni, Supervisor: Gianluca Moro. December, 2021

#### **Co-supervision of Master Students**

Study and implementation of the graphic interface for a health data application

Candidate: Matteo Sertori, Supervisor: Antonella Carbonaro, Other Co-supervisor: Gianluca Moro. October, 2020

Generate explanations of medical concept sets made up of correlated terms extracted from patient social posts with linear transformers

Candidate: Alessia Ventani, Supervisor: Gianluca Moro. March, 2021

## // SELECTED EXTRA-RESEARCH PROJECTS

#### Chess Multiplayer

Chess application with multiplayer features | Scala, Prolog, Akka, MongoDB. Use of Scrum as Agile software development methodology (with Product Owner role inside the team). Adoption of advanced software quality techniques and Continuous Integration.

10/2018 - 10/2018, **3**, x4 contributors

#### Drowsiness Detection System

Driver drowsiness detection system with a behavioral measure based on eyes closure | Raspberry Pi, Python, OpenGL, Computer Vision models.

### **©** Big Data and NLP models for Esophageal Achalasia Social Media Analysis

Topic modeling and phenomena explanation for food or treatment low opinion score on top of  $\approx$ 1.500.000 unlabeled posts shared by patients and caregivers in social media communities | Named Entity Recognition, Named Entity Linking, Sentiment Analysis | HDFS, MapReduce, Spark, SparkSQL YARN, Hive.

**6** 08/2019 - 10/2019

May 7, 2022

Juliena Juisemi