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About me

Dr Marian-Andrei Rizoiu is a Senior Lecturer leading the <u>Behavioral Data Science lab</u> at the University of Technology Sydney. His interdisciplinary research crosses computer and social sciences, blending psycholinguistics, digital communication and stochastic modelling to understand human attention dynamics in the online environment, the emergence of influence and opinion polarisation. Dr Rizoiu currently leads grants worth >\$2 million from the Commonwealth of Australia to detect and model the spread of mis- and disinformation and its weaponised counterparts – information and influence operations.

Marian-Andrei's research receives funding from selective funders such as Meta (Facebook) Research, Defence Science and Technology Group (DSTG), The Department of Home Affairs and the Defence Innovation Network. In addition, he publishes in the most selective venues, such as the PNAS, PLOS ONE, PLOS Computations Biology, WWW, NeurIPS, IJCAI, and CIKM. As a result, his work has received significant media attention—including Bloomberg Business Week, Nature Index, BBC, and World Economic Forum.

Marian-Andrei disseminates his research to the broader public by regularly contributing to <u>The Conversation</u>. In addition, he also leverages his research to real societal impact by, for example, serving as an expert for the NSW government's Defamation Law Reform or providing evidence for the Australian Federal Senate inquiry into media diversity.

Research interests

- Stochastic behavioural modelling; online information diffusion; online popularity modelling.
- Detecting disinformation campaigns and malicious activity, information warfare, online influence and disruptive socialbots in democratic processes.
- Labour markets in automation age, measuring skill similarity, labour upskilling, job ads data.

Employment history

08/2021 – **Senior Lecturer,** Data Science Institute, University of Technology Sydney

current: Research: information diffusion models, mis-/disinformation detection, online influence operations

Supervision: 1 postdoc, 7 PhD students, 2 Masters/Honours students.

2019: Visiting Professor, Jean Monnet University & CNRS Hubert Curien lab, Saint-Etienne, France

Research: dynamics of online polarisation

2019 – 2021: Lecturer, Faculty of Engineering and IT, University of Technology Sydney

Research: information diffusion models, online popularity prediction models, stochastic processes

Supervision: 1 postdoc, 4 PhD students, 3 Masters/Honours students/Research Assistants.

2016 – 2019 Research Fellow, Lecturer, Eng. and Comp. Science, Australian National University

Research: information diffusion models, online popularity prediction models, stochastic point

processes, machine learning and social media analysis.

Teaching: Document Analysis, Advanced Databases and Data Mining (Bachelors/Masters).

Leadership: course convener for the Document Analysis course, co-PI for two research grants,

Supervision: 4 PhD students (2 as main supervisor), 3 Masters/Honours students.

2014 – 2016 **Research Scientist,** Optimisation Research Group, National ICT Australia (NICTA)

Research: online privacy, big social data analytics, data mining.

Supervision: 2 PhD students, 1 Masters/Honours student.

2013 – 2014 **Postdoctoral Fellow,** ERIC laboratory, Lumière University Lyon, France.

Research: ontology construction from text, knowledge graphs evolution for brand management.

Teaching: Machine Learning, Software Development Methodologies, Data Mining, OOP

Supervision: 4 Honours theses, 9 industrial internships.

Leadership: developed the Machine Learning course.



Education background

- 2009 2013 **PhD in Computer Science**, Lumière University Lyon, France.
- (June 24th 2013) "Semi-supervised structuring of complex data", supervision S. Lallich and J. Velcin.
- 2008 2009 Masters Degree in Data Mining and Knowledge Engineering,
- (double diploma) Polytechnic School, Nantes University, France.
- 2004 2009 Engineer Degree in Systems and Computer Engineering

School of Computer Science, Polytechnic University of Bucharest, Romania.

Grants, Projects and Consulting – AU\$2.9M in secured funding (\$2.03M as lead-CI)

- 2023-2025: Defence Innovation Network. "Tracking Policy Influencing Pathways in Asia-Pacific",
 - AU\$500K, Lead-CI. Understanding the narratives and vectors of policy influence.
- 2023: Defence Science and Technology, IWSS. "NARRATE Narrative and Relationship Real-time
 - **Awareness Topical Explorer**", AU\$100k, Lead-CI. Identify the narratives of state-backed agents.
- 2022-2025: Department of Home Affairs. "Disinformation Defence Initiative: Delivering tools and analysis
 - **to fight the growing threat of disinformation for Australia**", AU\$1M, Lead-CI. Linking online misinformation to domestic extremism, and the importation of foreign misinformation narratives.
- 2022-2025: <u>Industrial Doctorate Program</u>. "Supervision of PhD students embedded into Australian companies",
 - AU\$30K, Lead-CI. Student supervision, commercial-oriented research.
- 2021 2023: Defence Science and Technology (DST). "Forensic analysis and real-time detection of dis
 - information campaigns", AU\$300K, Lead-CI. Real-time detection of disinformation campaigns
 - using multi-faceted social media analysis.
- 2021: <u>Polish National Science Centre OPUS grants</u>, "Streaming social data", AU\$313K, CI. Model the
 - dynamics of social interactions using data streams and complex networks theory.
- 2021: <u>UTS Cross-Faculty Scheme</u>, "The dynamics of disinformation across traditional and social
 - media", AU\$37K, Lead-CI. Understand the dynamic interaction between the traditional and social
 - media ecosystems that results in the flow of disinformation and problematic content.
- 2020-2021: <u>Facebook Research grants</u>, "Using computational modelling of user behaviour and machine
 - **learning to counter the diffusion of hate speech across social media**", US\$60k, CI. Use ethnographic methods to identify and monitor a number of persona associated with hate speech
 - diffusion targeting vulnerable populations.
- 2019 2020: National Security College's Green policy grants, "Tracking Disinformation Campaigns Across
 - Terrains: Implications for Policy", AU\$50K, CI. Quantify the scale of the problem of
 - disinformation in order to co-design responses with policy partners.
- 2019 2020: UTS Cross-Faculty Scheme, "SocialSense: Making sense of the opinions and interactions of
 - online users", AU\$20K, CI. Study the diffusion and polarization of opinions online, mixing an
 - ethnographic approach with computational modelling of behaviour.
- 2019: Science and Industry Endowment Fund, "Adaptive skills taxonomy to enable labour market
 - agility", AU\$350K, CI. Understand the change of demand and supply of skills in a timely and
 - efficient manner in order to provide information to inform employment decisions.
- 2019 Industrial consulting with a merger/acquisition. AU\$10.5k, Lead-CI.
- ANU Social Science Cross-College Grants, "Advanced tools and methods for analysing the role
 - and influence of bots in social media", AU\$50K, Lead-CI. The impact of automation in the form
 - of socialbots on deliberative democracy how socialbots hijack the public discourse.
- 2018 ANU Social Science Cross-College Grants, "Identify Hate Speech and Predict Mass Atrocities",
 - AU\$30K, Lead-CI. Can "hate speech" be reliably measured to predict political violence?

Invited talks

I gave more than 40 invited talks to varied industrial, academic and government stakeholders, such as to Silicon Valley tech companies (Facebook, Netflix), international universities and research labs, and Australian governmental institutions. See a selection: 09/2021 Occupation transition recommender systems. **LinkedIn Tech Talk Series**.

11/2020 Career transitions and managing labour supply and demand. Reserve Bank of Australia.

- 10/2020 Fighting the proliferation of problematic speech on online social networks. **Facebook Content Policy and Moderation**, Palo Alto, California, USA.
- 09/2020 Skill shortages and worker transitions. **Victoria government, Department of Jobs, Precincts and Regions**, Melbourne, Australia.
- 04/2020 Career Development Recommender System & COVID implications for employment. **New South Wales Treasury**, Sydney, Australia.
- 04/2020 Skills and employment in times of COVID-19. **Department of Education, Skills and Employment, Australian Federal Government,** Canberra, Australia.
- 11/2019 Information warfare: socialbots and Russian online trolls in the US elections. Invited talk at the **Defence Science and Technology (DST)**, Adelaide, Australia.
- 05/2019 #DebateNight: Role of Twitter Socialbots During US Presidential Debate. Invited talk at the **Computer Society of the IEEE ACT Section**, Canberra, Australia.
- 07/2019 Studying Online Video Popularity with Computational Models. Sage Research Methods.
- 06/2018 Hawkes Intensity Processes for modelling online popularity and virality. Invited talk at **Facebook Core Research**, Palo Alto, California, USA.
- 06/2018 User engagement with online video and the unpredictability of online popularity. Invited talk at **Netflix Research**, San Jose, California, USA.
- 05/2018 Scalable influence estimation from online information diffusions. Research visit at the **Max Plank Institute for Software Systems**, Kaiserslautern, Germany.
- 03/2016 Evolution of Privacy Loss in Wikipedia. Invited talk, March session of the Monthly Wikimedia Research Showcase, San Francisco, USA.

Media engagement and outreach

The Conversation – I wrote 7 articles for The Conversations, with more 161,000 reads (source: The Conversation, 04/2023), reposted on websites like <u>World Economic Forum</u> and <u>BBC</u> and with significant social media attention.

- 02/2023 Can ideology-detecting algorithms catch online extremism before it takes hold?
- 09/2022 A huge LinkedIn study just showed which connections are better when searching for a job
- 08/2021 How AI can help choose your next career and stay ahead of automation
- 04/2021 We spent six years scouring billions of links, and found the web is both expanding and shrinking
- 03/2020 Coronavirus infecting Australian jobs: vacancy rates down since early February
- 12/2019 Robot career advisor: AI may soon be able to analyse your tweets to match you to a job
- 10/2019 Can hiding likes make Facebook fairer and rein in fake news? The science says maybe

Radio

- 09/2021 **2ser radio** <u>Streamers go dark over hate raids</u>
- 09/2021 **2ser radio** How AI Is Helping Aussies Avoid Automation
- 05/2021 Radio Adelaide Breakfast show The Internet Is Massive and Small
- 10/2020 **Syn Media** News Talks #11: How social media spreads misinformation
- 11/2019 **2ser radio** Facebook and Fake News
- 10/2019 ABC radio Hiding likes make Facebook fairer
- 10/2019 Radio Adelaide Hiding the Number Of Likes On Social Media

Media coverage – My research received significant media attention – 16 of my papers were covered by 84 news and blogs, 1 policy document, 4 Wikipedia pages and 878 mentions on social media (source: Altmetric 25/05/2021). Selected examples (see **full list of media coverage here**):

- 08/2021 World Economic Forum Fancy a career change? AI could help you decide your next move
- 08/2021 LinkedIn News Australia Want to pivot careers? Ask AI

- 05/2021 World Economic Forum What these researchers discovered after studying the internet for 6 years
- 05/2021 **RT News** 60-70% of world's attention focused on just 10 online domains, according to latest research
- 05/2021 Science Alert The Same Handful of Websites Are Dominating The Web And That Could Be a Problem
- 05/2021 Canaltech Brasil Internet mundial cresce ao mesmo tempo em que está cada vez menor; entenda
- 03/2021 ABC News Facebook promised to ban anti-vaxxers. But are still up and they've been selling t-shirts
- 02/2020 **Bloomberg Businessweek** The Best Way to Change Your Job Is to Focus on Your Personality
- 02/2020 Nature Index Scientists are curious and passionate and ready to argue
- 02/2020 BBC How your Twitter feed could help find your dream job

Community Contributions

- 03/2021 My paper "Layoffs, Inequity and COVID-19" [8] was used as evidence in the <u>Senate inquiry into media diversity</u> by Marcus Strom, the president of Media Entertainment and Arts Alliance (<u>submission 26</u>).
- 10/2020 I consulted the Facebook's Content Policy and Regulation team, who is looking for means to automatise their content moderation.
- 01/2020 I served as an expert for the **Council of Attorneys General of New South Wales (NSW)** for the <u>defamation law reform</u>, helping the NSW government develop their understanding of online social networks and internet service providers. The law reform proposal voted into law in August 2020.

Honours, prizes and awards

11/2020	PitchFest award for disinformation prototype. NSW Smart Sensing Network & Klarrio Ltd.

- 03/2019 CNRS IDEXLYON award for research excellence. French National Research Agency.
- 04/2018 **Travel Awards** to travel to ECML-PKDD'15,WWW'18. ANU Early Career Researchers grants
- 01/2015 **NVIDIA Titan GPU**. NVIDIA GPU Awards Program.
- 11/2012 **Best student paper award.** International Conference on Tools with Artificial Intelligence, 2012.

Professional service

Area chair / Area Chair: ECML-PKDD'21 '22 '23;

PC member PC: WWW'20'21'22, AAAI'20'22, AAAI'19'21, ICWSM'19-'22, KDD'22

Reviewing Journal of Machine Learning Research, Computational Intelligence, Transactions on Information

Systems, Journal Transactions on Knowledge Discovery from Data

Conference 10/2012: Discovery Science 2012 and Algorithm Learning Technology 2012, Lyon.

organisation 09/2011: Web Intelligence 2011 and Intelligent Agent Technology 2011, Lyon.

Selected recent publications

Publications summary: 56 peer reviewed publications, 1699 citations, H-index 24 (source: *Google Scholar 08/2023*). Full publication list at https://www.behavioral-ds.science/publication/

- [1] Schneider, P. J., & Rizoiu, M.-A. (2023). The effectiveness of moderating harmful online content. Proceedings of the National Academy of Sciences (PNAS), 120(34), 1–3. https://doi.org/10.1073/pnas.2307360120
- [2] Calderon, P., Ram, R., & **Rizoiu, M.-A.** (2024). Opinion Market Model: Stemming Far-Right Opinion Spread using Positive Interventions. In *Proceedings of the International AAAI Conference on Web and Social Media (ICWSM'24)* (pp. 1–12). Retrieved from http://arxiv.org/abs/2208.06620
- [3] Kong, Q., Calderon, P., Ram, R., Boichak, O., & Rizoiu, M.-A. (2023). Interval-censored Transformer Hawkes: Detecting Information Operations using the Reaction of Social Systems. In *Proceedings of the ACM Web Conference* 2023 (WWW'23), pp. 1813–1821. New York, NY, USA: ACM. https://doi.org/10.1145/3543507.3583481
- [4] **Rizoiu, M.-A.**, Soen, A., Li, S., Calderon, P., Dong, L., Menon, A. K., & Xie, L. (2022). *Interval-censored Hawkes processes*. **Journal of Machine Learning Research** http://arxiv.org/abs/2104.07932
- [5] Kong, Q., Booth, E., Bailo, F., Johns, A., & **Rizoiu, M.-A.** (2022). Slipping to the Extreme: A Mixed Method to Explain How Extreme Opinions Infiltrate Online Discussions. *Proceedings of the International AAAI Conference on Web and Social Media* (ICWSM'22), 16(1), 524–535. https://doi.org/10.1609/icwsm.v16i1.19312
- [6] Dawson, N., Williams, M.-A., & Rizoiu, M.-A. (2021). *Skill-driven recommendations for job transition pathways*. PLOS ONE, 16(8), e0254722. https://doi.org/10.1371/journal.pone.0254722
- [7] McCarthy, P. X., Gong, X., Eghbal, S., Falster, D. S., & Rizoiu, M.-A. (2021). Evolution of diversity and dominance of companies in online activity. PLOS ONE, 16(4), e0249993. https://doi.org/10.1371/journal.pone.0249993

- [8] Dawson, N., Molitorisz, S., **Rizoiu, M.-A.**, & Fray, P. (2021). Layoffs, inequity and COVID-19: A longitudinal study of the journalism jobs crisis in Australia from 2012 to 2020. **Journalism**. p. 146488492199628
- [9] Kong, Q., Rizoiu, M.-A., & Xie, L. (2020). Describing and Predicting Online Items with Reshare Cascades via Dual Mixture Self-exciting Processes. In Proceedings of the 29th ACM International Conference on Information & Knowledge Management (CIKM'20), pp. 645–654, New York.
- [10] Kong, Q., **Rizoiu, M.-A.**, & Xie, L. (2020). *Modeling Information Cascades with Self-exciting Processes via Generalized Epidemic Models*. In ACM International Conference on Web Search and Data Mining **(WSDM'20).** Houston, Texas.
- [11] Zhang, R., Walder, C., & **Rizoiu, M.-A.** (2020). *Variational Inference for Sparse Gaussian Process Modulated Hawkes Process*. In the AAAI Conference on Artificial Intelligence (**AAAI'20**), 34(04), 6803–6810.
- [12] Zhang, R., Walder, C., Bonilla, E. V., Rizoiu, M.-A., & Xie, L. (2020). Quantile Propagation for Wasserstein-Approximate Gaussian Processes. In Conference on Neural Information Processing Systems (NeurIPS'20).
- [13] Kern, M. L., McCarthy, P. X., Chakrabarty, D., & Rizoiu, M.-A. (2019). Social media-predicted personality traits and values can help match people to their ideal jobs. Proceedings of the National Academy of Sciences (PNAS), 201917942.
- [14] Zhang, R., Walder, C., Rizoiu, M.-A., & Xie, L. *Efficient Non-parametric Bayesian Hawkes Processes*. In: International Joint Conference on Artificial Intelligence (IJCAI'19), Macao, China, 2019.
- [15] Rizoiu, M.-A., Mishra, S., Kong, Q., Carman, M., & Xie, L. SIR-Hawkes: Linking Epidemic Models and Hawkes Processes to Model Diffusions in Finite Populations. In: Proceedings of International Conference on World Wide Web (WWW '18), Lyon, France, pp. 1–9, 2018.
- [16] Rizoiu, M.-A., Graham, T., Zhang, R., Zhang, Y., Ackland, R. J., & Xie, L, #DebateNight: The Role and Influence of Socialbots on Twitter During the 1st U.S. Presidential Debate. In International AAAI Conference on Web and Social Media (ICWSM'18), pp. 1–10, 2018.
- [17] Rizoiu, M.-A., Xie, L., Sanner, S., Cebrian, M., Yu, H., & Van Hentenryck, P., *Expecting to be HIP: Hawkes Intensity Processes for Social Media Popularity*. In: Proceedings of International Conference on World Wide Web (WWW '17), Perth, Australia, pp. 735-744, 2017.
- [18] **Rizoiu, M.-A.**, Xie, L., Caetano, T., & Cebrian, M., *Evolution of Privacy Loss in Wikipedia*. In: Proc. International Conference on Web Search and Data Mining **(WSDM '16)**, San Francisco, USA, pp. 215-224, February 2016.