# Christopher Flathmann

# Curriculum Vitae

# Education

2019–2023 **PhD, Human Centered Computing**, Clemson University, Clemson, South Carolina.

Advisor: Nathan McNeese; Planned Defense: February 2023

2018 BS Computer Science, Clemson University, Clemson, South Carolina.

# Work Experience

- 2019–Present Clemson University Graduate Research Assistant, Team Research Analytics in Computational Environments (TRACE). Senior Lead PhD student researching human-Al teamwork and Al influence. Responsibilities include leading research projects, developing funding proposals, and leading external collaborations.
  - 2018 Clemson University Undergraduate Research Assistant, Data Intensive Computing Ecosystems Lab. Researched the effects of latency on high performance computing clusters in commercial cloud environments with Dr. Amy Apon.
  - 2018 **Amazon** Software Development Engineer Intern, Financial Technology. Created and evaluated a system for email matching payments and responses for financial collections using AWS EC2, S3, and Lambda.
  - 2017 **Clemson University** Undergraduate Teaching Assistant for Algorithms and Data Structures in C++ for **Dr. Brian Dean.** Taught labs, held office hours for undergraduate students, and helped design and proctor programming exams.
  - 2017 **Michelin** Software Development Engineer Intern for Research and Development. Designed software in C# to manage Agile Teams' members, software responsibilities, and skills.

# Research Interests

Al Influence on Humans, Human-Centered Al, Applied Human-Al Teamwork, Ethical Design of Al

# Grant and Award Contribution

As the senior Ph.D. student in TRACE Research Group, I have had the opportunity to lead and/or execute the majority of writing of multiple grant and funding opportunities. (\* denotes majority authorship and writing)

- \*Funded The Spread of Trust and Distrust in Distributed Human-Autonomy Teaming Constellations. AFOSR. \$1,302,657
- \*Funded Connecting and Leveraging Physical and Digital Dimensions to Advance Human-Autonomy Teaming. ONR DURIP. \$295,792
- **Funded** Promoting Human Interpretation and Interaction to Mitigate Bias in Artificial Intelligence Assisted Decision Aids. ONR. **\$444,368**
- **Funded** Considerations of Ethical and Unethical Behavior on Trust in Human-Autonomy Teaming. AFOSR. **\$586,538**
- Under A Multidisciplinary Approach to Improving Patient Safety in Pre-Hospital Care
  Review Settings Using Human-Centered Design and Systems Engineering Methods. AHRQ.
  \$1,999,877
- **Under** CAREER: Prioritizing the Development of Team Cognition in Human-Al Teams to **Review** Engender the Advancement and Acceptance of Al Teammates. NSF. **\$580,226**
- **Rejected** Cyber: Internet of People and Things Collaborative Intelligence through Human-Al Team Building. NSF. **\$3,000,000**
- **Rejected** Multi-head Distributional Decision Maker Modeling for Human-Off-The-Loop Algorithmic Development. DARPA. **\$1,112,701**
- **Rejected** Artificial Intelligence Institute for Advances in Human-Al Decision Making at Scale (HAIMS). NSF. **\$417,252**

# **Publications**

#### **Proposed Dissertation**

Flathmann, C. (Proposal Passed, February 2023 Expected Defense). How to Make Agents and Influence Teammates: Understanding the Social Influence Al Teammates Have in Human-Al Teams. Committee: Nathan McNeese (Dean's Professor), Brian Dean (School of Computing Director), Eileen Kraemer (Former School of Computing Director), Brygg Ullmer (Human-Centered Computing Chair), Laine Mears (BMW Endowed Chair in Automotive Manufacturing)

## **Referred Journal Articles**

- [J.3] Schelble, B., Flathmann, C., McNeese, N.J., O'Neill, T., Pak, R., & Namara, M. (2022; accepted). Investigating the Effects of Perceived Teammate Artificiality on Human Performance and Cognition. *International Journal of Human-Computer Interaction*.
- [J.2] Schelble, B.G., **Flathmann, C.**, Musick, G., McNeese, N.J., & Freeman, G. (2022). I See You: Examining the Role of Spatial Information in Human-Agent Teams. *Proceedings of the ACM on Human-Computer Interaction.* (CSCW), 1-27.
- ¶ [J.1] Schelble, B.G., Flathmann, C., McNeese, N.J., Freeman, G., & Mallick, R. (2021, January). Let's Think Together! Assessing Shared Mental Models, Performance, and Trust in Human-Agent Teams. Proceedings of the ACM on Human-Computer Interaction. 6(GROUP), 1-29. https://doi.org/10.1145/3492832 \*Honorable Mention Paper Award

#### **Under Review**

- [UR.8] Flathmann, C., McNeese, N.J., Schelble, B.G., Knijnenberg, B., & Freeman, G. (Major Revision). Understanding the Pervasive Impact of AI Teammate Assertiveness on Human-Agent Teams. Human Computer Interaction Journal.
- [UR.7] **Flathmann, C.**, B.G. Schelble, Mallic, R., & McNeese, N.J. (Under Review). Examining the Impact of Varying Levels of AI Teammate Influence on Human-AI Teams. *International Journal of Human-Computer Studies*.
- [UR.6] **Flathmann, C.**, Zhang, R., Wen, D., Hauptman, A., & McNeese, N.J. (Under Review). Understanding How and Why Humans Respond to Social Influence Exerted by AI Teammates. *ACM Transactions on Social Computing*.
- [UR.5] **Flathmann, C.**, Schelble, B.G., McNeese, N.J., Knijnenberg, B., Gramopadhye, A., & Madathil K.C. (Under Review). The Purposeful Presentation of Al Teammates: Impacts on Human Acceptance and Perception. *International Journal of Human-Computer Interaction*.
- [UR.4] Zhang, R., Wen, D., Flathmann, C., Freeman, G., & McNeese, N.J. (Under Review). Investigating AI Teammate's Communication Strategies and Their Impact in Human-AI Teams For Effective Teamwork. ACM Computer Supported Cooperative Work.
- [UR.3] Zhang, R., **Flathmann, C.**, Musick. G., Schelble, B.G., McNeese, N.J., & Knijnenberg, B. (Under Review). I Know This Looks Bad, But I Can Explain: Understanding When AI Should Explain Actions In Human-AI Teams. *ACM Transactions on Interactive Intelligent Systems*.
- [UR.2] Mallick, R., **Flathmann, C.**, Lancaster, C., Hauptman, A., McNeese, N.J., & Ihekweazu, C., (Under Review). The Power of Positive AI: Designing next generation artificial intelligence to adapt to the emotional needs of Human Teammates within Human-Agent Teams *ACM Computer Supported Cooperative Work*.
- [UR.1] Thomas, O., **Flathmann, C.**, McNeese, N.J., & Salas, E., (Under Review). Human-Autonomy Teaming: Construct Validity and A Generalizable Model for the Field *Computers in Human Behavior*.

#### **Book Chapters**

- [B.2] Flathmann, C., Schelble, B.G., & McNeese, N.J. (in press). Refocusing Human-Al Interaction Through a Teamwork Lens. Book Chapter in Handbook on Virtual Work. Edward Elgar Publishing.
- [B.1] Rapa, L. J., Marshall, J. C., Madison, S. M., Flathmann, C., Knijnenburg, B. P., & McNeese, N. J. (2022). Clemson University's Teacher Learning Progression Program: Personalized Advanced Credentials for Teachers. In Handbook of Research on Credential Innovations for Inclusive Pathways to Professions (pp. 313-334). IGI Global. http://doi.org/10.4018/978-1-7998-3820-3.ch016

### **Conference Papers**

- [C.10] Guo, L., Flathmann, C., Anaraky, R., McNeese, N., & Knijnenburg, B. (2022) The Effect of Recommendation Source and Justification on Professional Development Recommendations for High School Teachers. HT'22: 33rd ACM Conference on Hypertext and Social Media.
  - [C.9] Flathmann, C., Schelble, B. G., & McNeese, N. J. (2021, September). Fostering Human-Agent Team Leadership by Leveraging Human Teaming Principles. In 2021 IEEE 2nd International Conference on Human-Machine Systems (ICHMS) (pp. 1-6). IEEE. https://doi.org/10.1109/ICHMS53169.2021.9582649
- [C.8] Flathmann, C., Schelble, B. G., Zhang, R., & McNeese, N. J. (2021, July). Modeling and Guiding the Creation of Ethical Human-Al Teams. *In Proceedings of the 2021 AAAI/ACM Conference on AI, Ethics*, and Society (pp. 469-479). https://doi.org/10.1145/3461702.3462573
- [C.7] Schelble, B., Flathmann, C., Canonico, L. B., & Mcneese, N. (2021, January). Understanding human-Al cooperation through game-theory and reinforcement learning models. In Proceedings of the Annual Hawaii International Conference on System Sciences. Nominated for Best Paper http://dx.doi.org/10.24251/HICSS.2021.041
- ▼ [C.6] Flathmann, C., Schelble, B., Tubre, B., McNeese, N., & Rodeghero, P. (2020, November). Invoking Principles of Groupware to Develop and Evaluate Present and Future Human-Agent Teams. In Proceedings of the 8th International Conference on Human-Agent Interaction (pp. 15-24). Awarded Overall Best Paper <a href="https://doi.org/10.1145/3406499.3415072">https://doi.org/10.1145/3406499.3415072</a>
  - [C.5] Schelble, B. G., Flathmann, C., & McNeese, N. (2020, November). Towards meaningfully integrating human-autonomy teaming in applied settings. *In Proceed-ings of the 8th International Conference on Human-Agent* Interaction (pp. 149-156). https://doi.org/10.1145/3406499.3415077
  - [C.4] Musick, G., Maloney, D., Flathmann, C., McNeese, N. J., & Walton, J. (2020, December). Differentiated Instruction further Realized through Teacher-Agent Teaming. In Proceedings of the Human Factors and Ergonomics Society Annual Meeting (Vol. 64, No. 1, pp. 1318-1322). Sage CA: Los Angeles, CA: SAGE Publications. https://doi.org/10.1177%2F1071181320641315
  - [C.3] Flathmann, C., McNeese, N., & Canonico, L. B. (2019, November). Using human-agent teams to purposefully design multi-agent systems. In Proceedings of the Human Factors and Ergonomics Society Annual Meeting (Vol. 63, No. 1, pp. 1425-1429). Sage CA: Los Angeles, CA: SAGE Publications. https://doi.org/10.1177%2F1071181319631238
  - [C.2] Canonico, L. B., Flathmann, C., & McNeese, N. (2019, November). Collectively intelligent teams: Integrating team cognition, collective intelligence, and ai for future teaming. In Proceedings of the Human Factors and Ergonomics Society Annual Meeting (Vol. 63, No. 1, pp. 1466-1470). Sage CA: Los Angeles, CA: SAGE Publications. https://doi.org/10.1177%2F1071181319631278

[C.1] Canonico, L. B., Flathmann, C., & McNeese, N. (2019, November). The wisdom of the market: Using human factors to design prediction markets for collective intelligence. *In Proceedings of the Human Factors and Ergonomics Society Annual Meeting* (Vol. 63, No. 1, pp. 1471-1475). Sage CA: Los Angeles, CA: SAGE Publications. https://doi.org/10.1177%2F1071181319631282

# Workshop Papers (Refereed)

- [W.3] Beau G. Schelble, Christopher Flathmann, Scalia, M., Zhou, S., Chris Myers, Nathan J. McNeese, Jamie Gorman, Guo Freeman (2022). Addressing the Spread of Trust and Distrust in Distributed Human-AI Teaming Constellations. Workshop on Trust and Reliance in Al-Human Teams (TRAIT). 2022 ACM Conference on Computer-Human Interaction (CHI'22). New Orleans, LA. April 30th, 2022.
- [W.2] Guo, L., Anaraky, R., Flathmann, C., McNeese, N.J., Knijnenburg, B. (2021). How to Recommend Professional Development Pathways to High School Teachers. Workshop on Human-Machine Partnerships in the Future of Work: Exploring the Role of Emerging Technologies in Future Workplaces. 2021 ACM Conference on Computer Supported Cooperative Work (CSCW'21). Virtual. Oct. 23rd, 2021.
- [W.1] Schelble, B.G., Flathmann, C., McNeese, N.J. (2021). Reducing Bias by Prioritizing Multi-Cultural Human-Agent Teams. Workshop on Human-Machine Partnerships in the Future of Work: Exploring the Role of Emerging Technologies in Future Workplaces. 2021 ACM Conference on Computer Supported Cooperative Work (CSCW'21). Virtual. Oct. 23rd, 2021.

# Presentations (Invited, Conference & Program Reviews)

- [PRE.7] Reshaping Human Roles in Future Smart Manufacturing Environments. AMFG 6800. September 2022.
- [PRE.6] Connecting and Leveraging Physical and Digital Dimensions to Advance Human-Autonomy Teaming. Office of Naval Research Annual Program Review Meeting. September 2022.
- [PRE.5] The role of AI in Future Manufacturing Environments. AMFG 6800. September 2021.
- [PRE.4] Fostering Human-Agent Team Leadership by Leveraging Human Teaming Principles. IEEE ICHMS. September 2021.
- [PRE.3] Contributing to the NRT Structure and Content. NRT Annual Meeting. January 2021.
- [PRE.2] Invoking Principles of Groupware to Develop and Evaluate Present and Future Human-Agent Teams. Human-Agent Interaction. October 2020.
- [PRE.1] Using Human-Agent Teams to Purposefully Design Multi-Agent Systems. Human Factors and Ergonomics Society Annual Meeting. November 2019.

#### Research Posters

- [P.2] Flathmann, C., Schelble, B.G., & McNeese, N.J. (2020, September). Creating Human-Oriented Multi-Agent Teams. In *Insights @ BMW Manufacturing Co. LLC*. Greenville, SC.
- [P.1] Flathmann, C. and Nathan McNeese. 2020. Using Human-Agent Teams to Purposefully Design Multi-Agent Teams. Clemson 2019 Research Symposium, 12 April 2019

# Funding and Awards

- 2020-2022 2 Best Paper Nominations: HICSS & ACM GROUP
  - 2020 Human-Agent Interaction Best Paper Award
- 2019 2020 NSF/NRT Technology-Human Integrated Knowledge Education and Research Fellow
  - 2019 Clemson **Three Minute Thesis** Finalist for the College of Computing, Engineering, and Applied Science
  - 2017 DuPont Undergraduate Project of the Year: Smart Aiding Application for Travel Safety

# Skills

Research Quantitative Research (In Person Experiments, Factorial Survey Experiments, Online System A/B Testing, SEM, MLM, ANOVAs), Qualitative Research (Focus Groups, Semi-Structured Interviews, Thematic Analysis), Wizard of Oz, Experiment Design

Programming Python, C#, SQL, Java, C++, C, R, JavaScript

ML Methods Logistic Regression, Support Vector Machines, Neural Networks, Reinforcement Learning

Tools Tensorflow (Including Real-Time Computer Vision), Tensorforce, GitHub, AWS, Node.js, Qualitrics, Linux HPC Environments

# Current Funding Project

# Clemson University Teacher Learning Progression Recommender System

Collaborators: Nathan McNeese, Bart Knijenberg, Reza Anaraky, CU Education Department

 Researching, designing, and implementing an intelligent recommender system with the goal of guiding and aiding in the professional development of South Carolina middle school teachers. Main responsibilities include development of recommender system and A/B testing recommender system and its presentation. Implementation and Evaluation of system uses real-world school teachers.

# Relevant Coursework

- Artificial Intelligence (Included manual creation of neural networks and reinforcement learning systems
- Digital and Smart Manufacturing

- Measurement and Evaluation of Human Centered Computing Systems
- Research Methods for Human Centered Computing
- The Science of Teamwork and Technology
- Teamwork in Manufacturing
- Applied Data Science
- Human Perceptions and Behaviors

# Teaching Experience

### **Courses Taught**

- Repeated Guest Lecturer CPSC 4140: Human and Computer Interaction (Fall 2021)
- Guest Lecturer for HCC 8500: The Science of Teamwork and Technology (Spring 2021)
- Graduate Assistant Lecturer on Al Technology for AMFG 6200: Collaboration and Teamwork in Manufactoring Systems (Fall 2020 & Fall 2021)
- Undergraduate Teaching Assistant for CPSC 2120: Algorithms and Data Structures (Spring 2017 & Fall 2017)

### **Student Mentoring**

THINKER Mentor Program

- Geoffery Musick- PhD Human-Centered Computing, Clemson University, Fall 2021 2022
- Steven Russell- BA Computer Science, Clemson University, Fall 2020 2022

### TRACE Research Group

- Rohit Mallick- PhD Human-Centered Computing, Clemson University, Fall 2021 Present
- Jake Macdonald- BS Computer Science, Clemson University, Fall 2022 Present
- Christian Ihekweazu BS Computer Science, Clemson University, Fall 2022 Present
- Casey Hird- BS Math, Clemson University, Fall 2019 Spring 2020
- Dylan Cathapermal- BS Computer Science, Clemson University, Fall 2019 Spring 2020

### Professional Activities

### **Program Committees**

User Modeling Adaptation and Personalization (UMAP) Late Breaking Results, 2023

### Reviewing

Journals

Computers and Human Behavior, since 2022

Journal of Field Robotics, since 2022

Transactions on Human-Robot Interaction, since 2021

Journal of Cognitive Engineering and Decision Making, since 2021

Human Factors, since 2020

#### Conferences

ACM Computer-Human Interaction (CHI), since 2021

ACM/IEEE Human-Robot Interaction (HRI), since 2021

IEEE International Conference on Tools with Artificial Intelligence (ICTAI), since 2021

ACM Computer Supported Cooperative Work (GROUP), since 2020

Human Factors and Ergonomics Society Annual Meeting (HFES), since 2020 Winter Simulations Conference (WSC), since 2020 Military Health System Research Symposium (MHSRS), since 2020

# **Professional Community/National Service**

Presenter, National Research Traineeship, "Contributing to the NRT Structure and Content" *January*, 2021