# Prithviraj Ammanabrolu

Atlanta, GA

(210)-548-9006

□ raj.ammanabrolu@gatech.edu

prithvirajva.com

in linkedin.com/in/rajammanabrolu/

# Education

# **PhD Computer Science**

2018 - 2021

Georgia Institute of Technology

Advisor: Professor Mark O. Riedl

Thesis: Language Learning in Interactive Environments

Research Areas: Natural Language Processing, Reinforcement Learning, Interactive Narrative, Knowledge Graphs, and Computational Creativity

# **B.S. Computer Science**

2015 - 2018

Georgia Institute of Technology

Threads: Intelligence and Theory, Overall GPA 3.9, Dean's List 2015-2018

# **Publications**

#### **Under Review**

#### Situated Language Learning via Interactive Narratives

P Ammanabrolu and MO Riedl

Preprint. Under Review.

#### How to Avoid Being Eaten by a Grue: Structured Exploration Strategies for Textual Worlds

P Ammanabrolu, E Tien, M Hausknecht, and MO Riedl

Preprint. Under Review.

Code, VentureBeat Article, Recorded Talk

#### Conferences

#### How to Motivate Your Dragon: Teaching Goal-Driven Agents to Speak and Act in Fantasy Worlds

P Ammanabrolu, J Urbanek, M Li, A Szlam, T Rocktäschel, J Weston

Proceedings of The North American Chapter of the Association for Computational Linguistics (NAACL-HLT) 2021

Project Page, Tech Review Article, Tech Xplore Article

#### **Bringing Stories Alive: Generating Interactive Fiction Worlds**

**P Ammanabrolu**\*, W Cheung\*, D Tu, W Broniec, and MO Riedl

The 16th AAAI Conference on Artificial Intelligence and Interactive Digital Entertainment (AIIDE-20)

Code, Demo, Recorded Talk

# Automated Storytelling via Causal, Commonsense Plot Ordering

**P Ammanabrolu**, W Cheung, W Broniec, and MO Riedl *Thirty-fifth AAAI Conference on Artificial Intelligence (AAAI-21),* Code

#### **Toward Automated Quest Generation in Text-Adventure Games**

**P Ammanabrolu**, W Broniec, A Mueller, J Paul, and MO Riedl *International Conference on Computational Creativity (ICCC-20)* 

#### **Graph Constrained Reinforcement Learning for Natural Language Action Spaces**

P Ammanabrolu, M Hausknecht

International Conference on Learning Representations (ICLR-20), Addis Ababa, Ethiopia. Code, Video Presentation, Conference Site

#### **Story Realization: Expanding Plot Events into Sentences**

**P Ammanabrolu**, E Tien, W Cheung, Z Luo, W Ma, LJ Martin, and MO Riedl *Thirty-forth AAAI Conference on Artificial Intelligence (AAAI-20), New York City, NY.* Code, Slides

#### Interactive Fiction Games: A Colossal Adventure

M Hausknecht, **P Ammanabrolu**, MA Cote, and X Yuan *Thirty-forth AAAI Conference on Artificial Intelligence (AAAI-20), New York City, NY.* Code, Blog

#### Playing Text-Adventure Games with Graph-Based Deep Reinforcement Learning

P Ammanabrolu and MO Riedl

Proceedings of The North American Chapter of the Association for Computational Linguistics 2019, Minneapolis, MN.

Code, Slides, Blog

## **Event Representations for Automated Story Generation with Deep Neural Nets**

LJ Martin, **P Ammanabrolu**, X Wang, W Hancock, S Singh, B Harrison, and MO Riedl *Thirty-Second AAAI Conference on Artificial Intelligence (AAAI-18), New Orleans, LA.* 

Code

# **Peer-Reviewed Workshops**

#### Transfer in Deep Reinforcement Learning using Knowledge Graphs

P Ammanabrolu and MO Riedl

Text Graphs @ Empirical Methods in Natural Language Processing (EMNLP) 2019. Hong Kong. Code

# **Playing Text-Based Games with Commonsense**

S Dambekodi, S Frazier, **P Ammanabrolu,** MO Riedl Wordplay: When Language Meets Games @ NeurIPS 2020

# **Guided Neural Language Generation for Automated Storytelling**

**P Ammanabrolu**, E Tien, W Cheung, Z Luo, W Ma, LJ Martin, and MO Riedl *Proceedings of StoryTelling at the Association of Computational Linguistics 2019, Florence, Italy.* Code, Slides

#### **Bringing Stories Alive: Generating Interactive Fiction Worlds**

**P Ammanabrolu\***, W Cheung\*, D Tu, W Broniec, and MO Riedl Narrative Understanding, Storylines, and Events (NUSE) @ ACL 2020 Code, Demo, Recorded Talk

#### How To Avoid Being Eaten By a Grue: Exploration Strategies for Text-Adventure Agents

P Ammanabrolu, E Tien, Z Luo, and MO Riedl

Knowledge-based Reinforcement Learning Workshop @ International Joint Conference on Artificial Intelligence (IJCAI-20).

#### **Toward Automated Quest Generation in Text-Adventure Games**

P Ammanabrolu, W Broniec, A Mueller, J Paul, and MO Riedl

Computational Creativity in Natural Language Generation @ International Conference on Natural Language Generation 2019. Tokyo, Japan.

# Interactive Fiction Games: A Colossal Adventure

M Hausknecht, **P Ammanabrolu**, MA Cote, and X Yuan

Deep Reinforcement Learning Workshop at Neural Information Processing Systems (NeurIPS) 2019. Vancouver, CA

#### Playing Text-Adventure Games with Graph-Based Deep Reinforcement Learning

P Ammanabrolu and MO Riedl

Neural Information Processing Systems (NeurIPS) 2018 Wordplay: Reinforcement and Language Learning in Text-based Games Workshop, Montreal, QC.

#### Improvisational Storytelling Agents

LJ Martin, **P Ammanabrolu**, X Wang, S Singh, B Harrison, M Dhuliawala, P Tambwekar, A Mehta, R Arora, N Dass, C Purdy, and MO Ried

Neural Information Processing Systems (NeurIPS) 2017 Workshop on Machine Learning for Creativity and Design, Long Beach, CA.

# **Event Representations for Automated Story Generation with Deep Neural Nets**

LJ Martin, **P Ammanabrolu**, X Wang, W Hancock, S Singh, B Harrison, and MO Riedl

Conference Knowledge Discovery and Datamining (KDD) 2017 Workshop on Machine Learning for Creativity, Halifax, NS.

#### **Patent Publications**

#### Techniques for Building a Knowledge Graph in Limited Knowledge Domains

G Singaraju, P Ammanabrolu

US Patent US20200057946A1, Priority to US16/542.017

# **Teaching Experience**

**Teaching Assistant** Aug 2017 - Dec 2019

CS-3600: Intro to Artificial Intelligence, Georgia Tech - Atlanta, GA

#### Student Research Mentorship

- Wesley Cheung, MS Computer Science
- Ethan Tien, MS Computer Science
- Wai Man Si, MS Computer Science
- Ran (Renee) Jia, MS Computer Science
- William Broniec, MS Computer Science
- Alejandro Escontrela, BS Computer Science
  - o Now Research Engineer at Google Brain
- Dan Tu, MS Computer Science
  - Now Software Engineer at Microsoft Azure Al
- William Ma, MS Computer Science
  - $\circ\,$  Now Software Development Engineer at Amazon
- Jeffery Luo, BS Computer Science
  - o Now Research Analyst at Goldman Sachs
- Anush Mattapalli, BS Computer Science
  - Now Software Engineer at NCR Corporation

Aug 2018 - Present

Research Assistant | Jan 2017 - Present

Entertainment Intelligence Lab, Georgia Tech - Atlanta, GA

- Exploring the use of deep reinforcement learning with natural language state and action spaces
- Using knowledge graphs to inject domain knowledge into language-based tasks
- Finding effective data representations and evaluation metrics for training neural networks in automated story generation and procedural world & quest generation for text-games
- Mentored 10 Bachelor's and Master's students on their research theses

Research Intern May 2020 - Aug 2020

Facebook Al Research - New York City, NY

- Worked with Jason Weston, Arthur Szlam, Tim Rocktächel on the ParlAl team and LIGHT, a large-scale crowdsourced text-game
- Collected and released datasets crowdsourced by over 14,000 players of natural language quests in LIGHT and a commonsense knowledge graph ATOMIC-LIGHT
- Developed goal-driven questing agents with reinforcement learning that act and speak in LIGHT

Research Intern May 2019 - Aug 2019

Microsoft Research - Redmond, WA

- Worked with Matthew Hausknecht in the Reinforcement Learning team
- Aided in development of baseline text-game playing agents for Jericho, a text-game playing platform
- Developed SOTA RL algorithm that is able to dynamically generate language in text-games

# **Software Engineering Intern**

May 2018 - Aug 2018

Oracle Intelligent Bots Service - Redwood City, CA

- Developed a patented algorithm to create knowledge graphs for low resource natural language datasets
- Created a method that improves the natural language understanding capabilities by over 10% (classification rate) of the chatbot platform using the generated graph and graph embedding techniques

#### **Machine Learning Intern**

May 2017 - May 2018

Radix Health - Atlanta, GA

- Used machine learning and predictive analytics techniques to model patients' no-show risks for healthcare clinics
- Used natural language processing to design a chatbot to improve patient access
- Built and deployed machine learning systems for these cases from scratch to production, currently utilized by over 40 clinics and over a 1,000 doctors across America

# Skills

**Technical:** Natural Language Processing, Reinforcement Learning, Machine Learning, Knowledge Graphs, Semantic Web Technologies, Computer Vision, Predictive Analytics, Agile Methodologies, NoSQL

Programming Languages: Python, R, Java, C/C++, C#, SQL, SPARQL

Frameworks and Tools: pyTorch, scikit-learn, Tensorflow, nltk, AutoML, Couchbase, MongoDB, Spring Boot

Languages: English, Telugu, Sanskrit

# **Professional Activities**

#### Organizer

Wordplay: When Language Meets Games Workshop at NeurIPS 2020

#### **Program Committee**

- Neural Information Processing Systems (NeurIPS) 2019, 2020
- Meeting of the Association for Computational Linguistics (ACL) main and demo tracks 2020
- North American Chapter of the Meeting of the Association for Computational Linguistics (NAACL) 2019, 2021
- AAAI Conference on Artificial Intelligence (AAAI) 2019, 2020
- International Conference on Machine Learning (ICML) 2020
- International Conference on Learning Representations (ICLR) 2020
- Empirical Methods in Natural Language Processing (EMNLP) 2020
- ACM CSUR Computing Surveys
- TextGraphs Workshop at EMNLP 2020
- Language and Reinforcement Learning Workshop (LaReL) at ICML2020
- Workshop on Learning in Artificial Open Worlds (LAOW) at ICML 2020

# **Institutional Service**

Georgia Institute of Technology

- Reviewer for President's Undergraduate Research Awards (PURA) 2019
- Co-founder of the MCV PhD Student Support Group 2018-2020
- School of Computer Science's Prospective Student Visit Week, Coordinator 2019
- School of Interactive Computing's Prospective Student Visit Week, Volunteer 2019, 2020

# Hackathons and Video Game Development

2015 - 2017

- HackIllinois: Health Desk Desktop app that checks posture using computer vision
- SwampHacks: Labyrinth 3D survival maze game built with Unity engine and C#; top 10 overall
- HackGT: CorCal App to sync multiple calendars; built with Java and the Swing library
- Video Game Development Club (VG Dev) at Georgia Tech: HowRogue a Roguelike built in C++

# Selected Media Coverage

How role-playing a dragon can teach an AI to manipulate and persuade

MIT Tech Review. Will Douglas Heaven. November 20, 2020.

How to Train Your Al: Researchers Teach Al How to Move Around Fantasy Worlds

Science Times. Mark B. November 5, 2020.

Al can make your favourite game characters speak to each other

INDIAai National Al Portal of India. November 5, 2020.

Teaching Al agents to communicate and act in fantasy worlds

Tech Xplore. Ingrid Fadelli, November 3, 2020

Researchers combine reinforcement learning and NLP to escape a Grue monster

Venture Beat. Khari Johnson, June 30, 2020

Sztuczna inteligencja jako pisarz: Generowanie fabuły

(Translation from Polish: Artificial Intelligence as a Writer: Story Generation)

Zeszyty Maryny. Patrycja Świeczkowska, Oct 4, 2019.

Georgia Tech Artificial Intelligence Research Includes Collaborative Approaches with Humans, Automating Content, and More

Georgia Tech GVU Center. Joshua Preston, Feb 2, 2018.

# Changing the Conversation: Georgia Tech Researchers Provide New Approach to Automated Story Generation

Georgia Tech School of Interactive Computing. David Mitchell, Feb 4, 2020.

# References

- 1. Mark O. Riedl (PhD Advisor), Associate Professor Georgia Institute of Technology, riedl@cc.gatech.edu
- 2. Devi Parikh, Associate Professor Georgia Institute of Technology, parikh@gatech.edu
- 3. Charles Lee Isbell Jr., Professor and Dean Georgia Institute of Technology, isbell@cc.gatech.edu
- 4. Matthew Hausknecht, Senior Research Scientist, Microsoft Research, matthew.hausknecht@microsoft.com
- 5. Jason Weston, Research Scientist Facebook Al Research, jase@fb.com