## Kenneth C. Arnold

Assistant Professor of Computer Science and Data Science Calvin University, 3201 Burton St SE, Grand Rapids MI 49546, USA

kcarnold@alum.mit.edu kenarnold.org, GitHub: kcarnold ken.arnold@calvin.edu

## **Research Interests**

AI should help people think better about (and with) other people. I design and study interactive AI for thoughtful written communication and for teaching and learning.

## **Institutions**

**Calvin University** Grand Rapids, MI Assistant Professor (soon to be Associate) since August 2019

**Research**: AI for thoughtful writing, teaching, and learning

**Harvard University** Cambridge, MA USA Ph.D., Computer Science May 2020

**Research**: Impacts of Predictive Text on Writing Content

**Advisor**: Krzysztof Z. Gajos, Intelligent Interactive Systems group

Massachusetts Institute of Technology Cambridge, MA USA S.M., Media Arts and Sciences (MIT Media Lab) February 2010

**Research**: natural-language code search, commonsense reasoning Advisor: Henry Lieberman, Software Agents Group, MIT Media Lab

**Cornell University** Ithaca, NY USA **June 2007** 

B.S., Electrical and Computer Engineering, magna cum laude

### Grants

- NSF: CRII: HCC: Interactive Natural Language Technology for Supporting Writers in Structuring and Revising Documents. \$175,000. 2023-2025.
- Calvin Research Fellowship course releases (approx. \$10,000 per year), 2020–2023.

#### **Publications**

- \*Jiho Kim, \*Ray C. Flanagan, \*Noelle E. Haviland, \*ZeAi Sun, \*Souad N. Yakubu, \*Edom A. Maru, and Kenneth C. Arnold. 2024. Towards Full Authorship with AI: Supporting Revision with AI-Generated Views. In Joint Proceedings of the ACM IUI 2024 Workshops, IUI Workshop on Human-AI Co-Creation with Generative Models (HAI-GEN). https://ceur-ws.org/Vol-3660/paper17.pdf (non-archival)
- Kenneth C. Arnold. 2023. AI and Writing: Do we speak the words of stochastic parrots?. In Journal and Proceedings of the Association of Christians in the Mathematical Sciences. https://acmsonline.org/wpcontent/uploads/2023/05/journal-and-proceedings-2023.pdf
- Kenneth C. Arnold, \*April M. Volzer, and \*Noah G. Madrid. 2021. Generative Models Can Help Writers without Writing for Them. In 2nd Workshop on Human-AI Co-Creation with Generative Models -HAI-GEN 2021 (CEUR Workshop Proceedings). http://ceur-ws.org/Vol-2903/IUI21WS-HAIGEN-1.pdf (non-archival)
- Kenneth C. Arnold, Krysta Chauncey, and Krzysztof Z. Gajos. 2020. Predictive Text Encourages Predictable Writing. In Proceedings of the 25th International Conference on Intelligent User Interfaces (IUI '20), 128–138. https://doi.org/10.1145/3377325.3377523
- Kenneth C. Arnold, Krysta Chauncey, and Krzysztof Z. Gajos. 2018. Sentiment Bias in Predictive Text Recommendations Results in Biased Writing. In Graphics Interface 2018, 8-11. http://graphicsinterfac e.org/wp-content/uploads/gi2018-7.pdf

- Kenneth C. Arnold, Kai-Wei Chang, and Adam Kalai. **2017**. Counterfactual Language Model Adaptation for Suggesting Phrases. In *Proceedings of the Eighth International Joint Conference on Natural Language Processing (Volume 2: Short Papers)*, 49–54. https://aclanthology.org/I17-2009
- Katherine E. Boronow, Herbert P. Susmann, Krzysztof Z. Gajos, Ruthann A. Rudel, Kenneth C. Arnold, Phil Brown, Rachel Morello-Frosch, Laurie Havas, and Julia Green Brody. **2017**. DERBI: A Digital Method to Help Researchers Offer "Right-to-Know" Personal Exposure Results. *Environmental health perspectives* 125, 2.
- Kenneth C. Arnold, Kai-Wei Chang, and Adam T Kalai. **2017**. Learning to Suggest Phrases. In *AAAI Workshop on Human-Centered AI.* (non-archival)
- Kenneth C. Arnold, Krzysztof Z. Gajos, and Adam T. Kalai. **2016**. On Suggesting Phrases vs. Predicting Words for Mobile Text Composition. In *Proceedings of the 29th Annual Symposium on User Interface Software and Technology UIST '16*, 603–608. https://doi.org/10.1145/2984511.2984584
- Pao Siangliulue, Kenneth C. Arnold, Krzysztof Z. Gajos, and Steven P. Dow. **2015**. Toward Collaborative Ideation at Scale: Leveraging Ideas from Others to Generate More Creative and Diverse Ideas. In *Proceedings of the 18th ACM Conference on Computer Supported Cooperative Work & Social Computing* (CSCW '15), 937–945. https://doi.org/10.1145/2675133.2675239
- Kenneth C. Arnold and Krzysztof Z. Gajos. **2015**. Effective Interactions for Personalizing Spatial Visualizations of Collections. In *Adjunct Proceedings of the 28th Annual ACM Symposium on User Interface Software & Technology*. https://doi.org/10.1145/2815585.2815727 (non-archival)
- Cheng-Zhi Anna Huang, David Duvenaud, Kenneth C. Arnold, Brenton Partridge, Josiah W. Oberholtzer, and Krzysztof Z. Gajos. **2014**. Active learning of intuitive control knobs for synthesizers using gaussian processes. In *Proceedings of the 19th International Conference on Intelligent User Interfaces* (IUI '14), 115–124. https://doi.org/10.1145/2557500.2557544
- Kevin Gold, Catherine Havasi, Michael Anderson, and Kenneth C. Arnold. **2011**. Comparing Matrix Decomposition Methods for Meta-analysis and Reconstruction of Cognitive Neuroscience Results. In *Florida Artificial Intelligence Research Society Conference*. https://aaai.org/papers/flairs-2011-2561/
- Kenneth C. Arnold and Henry Lieberman. **2010**. Managing ambiguity in programming by finding unambiguous examples. In *Proceedings of the ACM International Conference on Object Oriented Programming Systems Languages and Applications* (OOPSLA '10), 877–884. https://doi.org/10.1145/1869459.1869531
- Norden E. Huang, Zhaohua Wu, Steven R. Long, Kenneth C. Arnold, Xianyao Chen, and Karin Blank. **2009**. On Instantaneous Frequency. *Advances in Adaptive Data Analysis* 1, 2: 177–229. https://doi.org/10.1142/S1793536909000096
- Robyn Speer, Jayant Krishnamurthy, Catherine Havasi, Dustin Smith, Henry Lieberman, and Kenneth C. Arnold. **2009**. An interface for targeted collection of common sense knowledge using a mixture model. In *Proceedings of the 14th International Conference on Intelligent User Interfaces* (IUI '09), 137–146. https://doi.org/10.1145/1502650.1502672

#### Others:

- K.C. Arnold and H. Lieberman. **Embracing Ambiguity**. FSE/SDP Workshop on the Future of Software Engineering Research, 2010.
- K.C. Arnold and H. Lieberman. **Scruffy Cross-Domain Inference**. *AAAI Fall Symposium on Common Sense Knowledge*, 2010.
- J.B. Alonso, K.C. Arnold, and C. Havasi. **Envisioning a Robust, Scalable Metacognitive Architecture Built on Dimensionality Reduction**. *AAAI-10 Workshop on Metacognition for Robust Social Systems*, 2010.

- C. Havasi, R. Speer, K.C. Arnold, H. Lieberman, J. Alonso, J. Moeller. **Open Mind Common Sense:** Crowd-sourcing for Common Sense. *AAAI-10 Workshop on Collaboratively-Built Knowledge Sources and Artificial Intelligence*, 2010.
- K.C. Arnold Reusing Code by Reasoning About its Purpose. Master's thesis, MIT, 2010.
- D. Smith and K.C. Arnold. Learning hierarchical plans by reading simple English narratives. *Commonsense Workshop at the ACM International Conference on Intelligent User Interfaces (IUI)*, 2009.

Indicates \*undergraduate student researcher.

### Talks and Other Publications

- "Does Data + Math = AI?" talk at Calvin Mathematics/Statistics Colloquium, February 2024
- "Redeeming the Parrots: Using Language Models Responsibly." Annual meeting of American Scientific Affiliation (professional society of Christians in science), Toronto CA, July 2023. Three student researchers contributed to the presentation and presented more details at a pre-conference workshop.
- Organized and led a one-day faculty development workshop on generative AI and Christian faith, May 2023
- Panelist at Calvin Philosophy Club roundtable discussion on AI, February 2023
- "ChatGPT is not Magic" talk at a Grand Rapids-area professional meetup ("Big Data Ignite"), January 2023
- "AI and Writing: Laziness or Thoughtfulness?" talk at Association of Christians in the Mathematical Sciences (ACMS) conference, June 2022
- Ceballos-Zapata, Abraham, Arnold, K.C., and \*McCallion, Emma, "Future Visions in Language Pedagogy", talk at Calvin World Languages Forum, Spring 2021
- Kenneth C. Arnold. *Faithful Text Prediction <a href="https://www.christiancourier.ca/faithful-text-prediction/">https://www.christiancourier.ca/faithful-text-prediction/>*. Christian Courier, September 13, 2021.
- J. Nathan Matias, Lydia Manikonda, Scott Hale, Kenneth C. Arnold. Artificial Intelligence in Christian Thought and Practice <a href="https://medium.com/ai-and-christianity/artificial-intelligence-in-christian-thought-and-practice-20ec8635a94f">https://medium.com/ai-and-christianity/artificial-intelligence-in-christian-thought-and-practice-20ec8635a94f</a>. 2017

# Software, Prototypes, and Teaching Demos

Click the links below:

- Writing Tools Prototypes <a href="https://huggingface.co/spaces/kcarnold/writing-prototypes">https://huggingface.co/spaces/kcarnold/writing-prototypes</a>:
  - **Rewrite with Predictions**: re-imagines the chatbot interface as a predictive text interface
  - Highlight Edit Locations: shows where a model thinks you should edit your text
- Softmax / Cross Entropy interactive explanation <a href="https://observablehq.com/@kcarnold/softmax">https://observablehq.com/@kcarnold/softmax</a>
- Next-Token Distribution Visualization <a href="https://huggingface.co/spaces/kcarnold/next-token">https://huggingface.co/spaces/kcarnold/next-token</a> for seq2seq translation models
- Moodle-Palette <a href="https://github.com/kcarnold/Moodle-Palette">https://github.com/kcarnold/Moodle-Palette</a>:
  - a keyboard-based interface for the Moodle LMS
  - ► a playground for incorporating privacy-sensitive AI into instructors' workflows
- zylabs-libs <a href="https://github.com/kcarnold/zylabs-libs">https://github.com/kcarnold/zylabs-libs</a>: a collection of Python shim code to help instructors develop ZyLabs questions that give students better feedback
- Calgen <a href="https://github.com/kcarnold/calgen">https://github.com/kcarnold/calgen</a>: a tool for helping instructors (and eventually students) import their course schedules into their calendars

- Livethon <a href="https://github.com/kcarnold/livethon">https://github.com/kcarnold/livethon</a>: Python in browser for in-class live coding, emphasizing comparisons between code. Uses: meteor, pyodide, ace.
- Textrec <a href="https://github.com/kcarnold/textrec">https://github.com/kcarnold/textrec</a>: software for running experiments on text recommendations (custom mobile keyboard, NLP backend, experiment management and analysis infrastructure)
- Counterfactual Language Model Learning <a href="https://github.com/kcarnold/counterfactual-lm">https://github.com/kcarnold/counterfactual-lm</a>: Code and data for counterfactual language model learning from implicit writer feedback (for the IJCNLP paper) an early example of reinforcement learning from human feedback (RLHF)
- Channel Mover <a href="https://github.com/kcarnold/channel-mover">https://github.com/kcarnold/channel-mover</a>: a Streamlit app for moving channels around on a Behringer X32 soundboard.
- Nanomixer <a href="https://github.com/nanomixer/nanomixer">https://github.com/nanomixer/nanomixer</a>: A digital audio mixer, with ADAT I/O and processing on FPGA and web-based control (Verilog, Python, TCL, HTML/CSS/JavaScript, and a custom DSP assembly language)

### Press and Media

- (2023-09-11) AI Will Shape Your Soul <a href="https://www.christianitytoday.com/ct/2023/october/artificial-intelligence-robots-soul-formation.html">https://www.christianitytoday.com/ct/2023/october/artificial-intelligence-robots-soul-formation.html</a>. Christianity Today.
- (2019-08-12) How 'smart' email could change the way we talk <a href="https://www.bbc.com/future/article/20190812-how-ai-powered-predictive-text-affects-your-brain">https://www.bbc.com/future/article/20190812-how-ai-powered-predictive-text-affects-your-brain</a>. BBC Future.

#### **Patents**

From my internship at Microsoft Research:

Interactive context-based text completions. Kenneth C. Arnold, Kai-Wei Chang, Adam Tauman Kalai. (US20180101599A1, pending).

From my internship at IBM (all list inventors as: Jacob C. Albertson, Kenneth C. Arnold, Steven D. Goldman, Michael A. Paolini, Anthony J. Sessa):

Controlling resource access based on user gesturing in a 3D captured image stream of the user. (US7971156 issued Jun, 28 2011).

Informing a user of gestures made by others out of the user's line of sight. (US7725547 issued May, 25 2010).

Tracking a range of body movement based on 3D captured image streams of a user. (US7840031 issued Nov, 23 2010).

Warning a vehicle operator of unsafe operation behavior based on a 3D captured image stream. (US7792328 issued Sep, 7 2010).

Controlling a document based on user behavioral signals detected from a 3D captured image stream. (US7877706 issued Jan 25, 2011).

Controlling a system based on user behavioral signals detected from a 3D captured image stream. (US7801332 issued Sep, 21 2010).

Warning a user about adverse behaviors of others within an environment based on a 3D captured image stream. (US8269834 issued Sep 18, 2012).

Adjusting a consumer experience based on a 3D captured image stream of a consumer response. (US8295542 issued Oct 23, 2012).

## **Teaching**

Calvin UniversityGrand Rapids, MIAssistant ProfessorAug 2019-present

#### Courses taught:

- CS 108 Introduction to Computing
- CS 106 Introduction to Scientific Computing and Modeling
- DATA 202 Data Wrangling and Predictive Analytics
- DATA 303 Applied Modeling and Visualization
- CS 375 Artificial Intelligence and CS 376 Machine Learning (formerly CS 344)
- CS 300 Human-Computer Interaction
- INFO 602 Predictive Analytics
- DATA 501 Data Wrangling
- informal "bootcamp" on deep learning and web development technology
- Senior Project mentoring
- Assisted in developing online Masters in Data Science program

**CS 109A: Introduction to Data Science**Teaching Fellow (with Pavlos Protopapas and Kevin Rader)
Harvard University
Fall 2018

CS 282r: Decision-Making Under Uncertainty

Teaching Fellow (with Prof. Finale Doshi-Velez)

Harvard University
Spring 2015

CS 179: Design of Usable Interactive Systems

Teaching Fellow (with Prof. Krzysztof Z. Gajos)

Harvard University
Spring 2013

CS 314: Computer Organization Cornell University
Head Consultant (with Prof. Sally A. McKee) Spring 2006

Johns Hopkins Center for Talented YouthSt. Mary's City, MD USAComputer Science Teaching AssistantSummer 2005

# **Work Experience**

Calvin UniversityGrand Rapids, MIAssistant ProfessorAug 2019-present

Microsoft Research New England
Research Internship
Cambridge, MA USA
Fall 2015

LuminosoCambridge, MA USACo-founder, Researcher, Developer2011 and Summer 2013

MIT Media Lab
Research Assistant
Cambridge, MA USA
August 2007–August 2011

IBM Austin, TX USA Extreme Blue Intern Summer 2006

NASA Goddard Space Flight Center Greenbelt, MD USA
Nonlinear Signal Analysis Research Programmer Summer 2003 and 2004

# Mentoring

Undergraduate Summer Researchers: 2020 (2 students), 2022 (4 students), 2023 (7 students), 2024 (4 students)

- Computer Science Senior Projects: 2024–25 (4 students across 3 projects), 2023–24 (2 students), 2022–23 (2 students), 2021–22 (7 students split into 2 projects), 2020–21: (2 students), 2019–20 (1 student)
- Academic advising: 30–40 students per year. Scope includes course selection as well as broader considerations (e.g., portfolios, internships, research projects).

An incomplete list of Calvin undergraduate students who participated substantially in research:

#### 2022-24

- Jiho Kim
- Ray C. Flanagan

#### 2024

- Daniel Kim
- Daniel Kwon
- Hannah Yoo
- Iason Chew

#### 2023

- · Edom A. Maru
- Noelle E. Haviland
- Saron Melesse
- Souad N. Yakubu
- ZeAi Sun

#### 2023-24

- Connor Broekhuizen
- Matthew Van Harn

#### 2022

- Ael Lee
- Gwendolyn Fulkerson
- Lexi Sharp
- Lucia Skuldt

#### 2020-21

- April M. Volzer
- Emma McCallion
- · Hvechan Jun
- · Noah G. Madrid

# **University Service**

- 2019-present: Data Science program steering committee
  - Undergraduate program development
  - ▶ Graduate program development
  - Faculty recruiting and hiring
- 2021-present: Computer Science department facilities committee
- 2024-present: Calvin University Gender Equity Committee
- 2024-present: Calvin University AI in the Classroom Task Force

# **Conference and Journal Reviewing**

When appropriate, I often invite students to contribute their perspectives to my reviews.

### Journals

- Technology, Mind, and Behavior (2024)
- Transactions on Intelligent Interactive Systems (2024)
- Nature Human Behaviour (2024)
- Transactions on Computer-Human Interaction (ACM ToCHI) (2021)
- IEEE Intelligent Systems (2012)
- Journal of Statistics Education (JSE) (2020)
- International Journal of Christian Education (IJCE) (2023).

#### Conferences

- ACM Technical Symposium on Computer Science Education (SIGCSE TS) (2023)
- ACM SIGCHI Conference on Computer-Supported Cooperative Work & Social Computing (CSCW) (2022)
- ACM CHI conference on Human Factors in Computing Systems (2012, 2017, 2018, 2019, 2020, 2021, 2025) (Awarded "Special recognition" for CHI 2017 reviewing.)
- ACM IUI Conference on Intelligent User Interfaces (2012, 2014, 2025)
- ACM Symposium on User Interface Software and Technology (UIST) (2019, 2020)

## Workshops

Workshop on Intelligent and Interactive Writing Assistants (2022, 2023)

#### Other

• NSF Improving Undergraduate STEM Education (IUSE) Panelist (2021)

## **Professional Organization Memberships**

- Association for Computing Machinery
  - ► ACM SIGCSE Special Interest Group for Computer Science Education
  - ▶ ACM SIGCHI Special Interest Group on Computer-Human Interaction
- American Scientific Affiliation (professional society of Christians in science)

## Miscellaneous

- Languages: Spanish (intermediate), Haitian Creole (beginner), Arabic (beginner)
- **Programming Languages**: have taught or work daily in Python, JavaScript/TypeScript, R, SQL, Java, HTML/CSS; have worked in many others.
- New City Fellowship church (Grand Rapids): lead of tech team (sound reinforcement, livestream video production), piano, singing in choir (2020–present)
- Citylife Presbyterian Church (Boston): sound reinforcement, video production, operations and logistics, diaconal service (2011–2019)
- Indigitous Global Hackathon for Christian Missions, Boston site (2016): organizer
- **Student group leadership**: Harvard Aikido club, MIT Graduate Christian Fellowship, MIT Cross Products (a cappella group)
- Teaching with MIT's Educational Studies Program (2007, 2010).
- Teaching with Clubes de Ciencia Ensenada, Summer 2016: Deep Learning and Remote Sensing
- Student Volunteer: CHI 2014