E-mail: ericwallace@berkeley.edu Scholar: scholar.google.com/ericwallace

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## Eric Wallace

EDUCATION **UC** Berkeley 2019-2023

Ph.D. in Computer Science

Research Advisors: Dan Klein, Dawn Song

Thesis: Measuring and Mitigating Vulnerabilities of Language Models

University of Maryland

2014 - 2018

Mountain View, CA

June 2023–Sep 2023

B.S. in Computer Engineering

GPA: 3.9, GRE: 170/170Q, 168/170V, 6/6W Research Advisor: Jordan Boyd-Graber

Industry EXPERIENCE Google Brain Research Intern

Research Advisors: Dustin Tran, Denny Zhou, Xinyun Chen

Facebook AI Research (FAIR)

Menlo Park, CA Research Intern June 2021-Sep 2021

Research Advisors: Robin Jia, Douwe Kiela

Allen Institute for Artificial Intelligence (AI2)

Irvine, CA Research Intern Jan 2019–Aug 2019

Research Advisors: Matt Gardner, Sameer Singh

SELECTED AWARDS

Apple Fellowship in AI/ML, 2022–2024

PET Award for Outstanding Research in Privacy Runner Up, 2023

Best Poster, NeurIPS 2021 ENLSP Workshop

Best Demo Paper, EMNLP 2019 AI2 Intern of the Year, 2019

Eagle Scout, 2012

**PUBLICATIONS** 

[1] Privacy Side Channels in Machine Learning Systems

Edoardo Debenedetti, Giorgio Severi, Nicholas Carlini, Christopher A. Choquette-Choo, Matthew Jagielski, Milad Nasr, Eric Wallace, Florian Tramér arXiv preprint, 2023.

- [2] SILO Language Models: Isolating Legal Risk In a Nonparametric Datastore Sewon Min\*, Suchin Gururangan\*, Eric Wallace, Hannaneh Hajishirzi, Noah A. Smith, Luke Zettlemoyer arXiv preprint, 2023.
- [3] The False Promise of Imitating Proprietary LLMs Arnav Gudibande\*, Eric Wallace\*, Charlie Snell, Xinyang Geng, Hao Liu, Pieter Abbeel, Sergey Levine, Dawn Song arXiv preprint, 2023.
- [4] Extracting Training Data from Diffusion Models Nicholas Carlini, Jamie Hayes, Milad Nasr, Matthew Jagielski, Vikash Sehwag, Florian Tramér, Borja Balle, Daphne Ippolito, Eric Wallace USENIX Security Symposium, 2023.
- [5] Poisoning Instruction-Tuned Language Models Alexander Wan\*, Eric Wallace\*, Sheng Shen, Dan Klein International Conference on Machine Learning (ICML), 2023.
- [6] Large Language Models Struggle to Learn Long-Tail Knowledge Nikhil Kandpal, Haikang Deng, Adam Roberts, Eric Wallace, Colin Raffel International Conference on Machine Learning (ICML), 2023.
- [7] InCoder: A Generative Model for Code Infilling and Synthesis Daniel Fried, Armen Aghajanyan, Jessy Lin, Sida Wang, Eric Wallace, Freda Shi, Ruiqi Zhong, Wen-tau Yih, Luke Zettlemoyer, Mike Lewis International Conference on Learning Representations (ICLR), 2023.

Spotlight Presentation

- [8] Measuring Forgetting of Memorized Training Examples Matthew Jagielski, Om Thakkar, Florian Tramèr, Daphne Ippolito, Katherine Lee, Nicholas Carlini, Eric Wallace, Shuang Song, Abhradeep Thakurta, Nicolas Papernot, Chiyuan Zhang International Conference on Learning Representations (ICLR), 2023.
- [9] Deduplicating Training Data Mitigates Privacy Risks in Language Models Nikhil Kandpal, Eric Wallace, Collin Raffel International Conference on Machine Learning (ICML), 2022.
- [10] Automated Crossword Solving
  - Eric Wallace\*, Nicholas Tomlin\*, Albert Xu\*, Kevin Yang\*, Eshaan Pathak\*, Matt Ginsberg, Dan Klein Association for Computational Linguistics (ACL), 2022.
- [11] Analyzing Dynamic Adversarial Training Data in the Limit **Eric Wallace**, Adina Williams, Robin Jia, Douwe Kiela Findings of the Association for Computational Linguistics (ACL Findings), 2022.
- [12] Cutting Down on Prompts and Parameters: Simple Few-Shot Learning with Language Models Robert L. Logan IV, Ivana Balažević, Eric Wallace, Fabio Petroni, Sameer Singh, Sebastian Riedel ACL Findings 2022; NeurIPS Efficient NLP Workshop. Best Poster Award
- [13] Calibrate Before Use: Improving Few-shot Performance of Language Models Tony Z. Zhao\*, Eric Wallace\*, Shi Feng, Dan Klein, Sameer Singh International Conference on Machine Learning (ICML), 2021. Long Oral Presentation (Top 3%)
- [14] Extracting Training Data from Large Language Models Nicholas Carlini, Florian Tramèr, Eric Wallace, Matthew Jagielski, Ariel Herbert-Voss, Katherine Lee, Adam Roberts, Tom Brown, Dawn Song, Úlfar Erlingsson, Alina Oprea, Colin Raffel USENIX Security Symposium, 2021.
- Runner up for PET Award (Test of Time Award for Privacy Research)

  [15] Concealed Data Poisoning Attacks on NLP Models
  - Eric Wallace\*, Tony Z. Zhao\*, Shi Feng, Sameer Singh North American Chapter of the Association for Computational Linguistics (NAACL), 2021.
- [16] Detoxifying Language Models Risks Marginalizing Minority Voices Albert Xu, Eshaan Pathak, Eric Wallace, Maarten Sap, Suchin Gururangan, Dan Klein North American Chapter of the Association for Computational Linguistics (NAACL), 2021.
- [17] Imitation Attacks and Defenses for Black-box Machine Translation Systems Eric Wallace, Mitchell Stern, Dawn Song Empirical Methods in Natural Language Processing (EMNLP), 2020.
- [18] Evaluating Models' Local Decision Boundaries via Contrast Sets
  Matt Gardner, Yoav Artzi, ... (other authors hidden) ... **Eric Wallace**, Ally Zhang, Ben Zhou
  Findings of the Empirical Methods in Natural Language Processing (EMNLP Findings), 2020.
- [19] AutoPrompt: Eliciting Knowledge from Language Models with Automatically Generated Prompts Taylor Shin\*, Yasaman Razeghi\*, Robert L Logan IV\*, Eric Wallace, Sameer Singh Empirical Methods in Natural Language Processing (EMNLP), 2020.
- [20] Gradient-based Analysis for NLP Models is Manipulable Junlin Wang\*, Jens Tuyls\*, Eric Wallace, Sameer Singh Findings of the Empirical Methods in Natural Language Processing (EMNLP Findings), 2020.
- [21] Train Large, Then Compress: Rethinking Model Size for Efficient Training and Inference of Transformers Zhuohan Li\*, **Eric Wallace\***, Sheng Shen\*, Kevin Lin\*, Kurt Keutzer, Dan Klein, Joseph E. Gonzalez *International Conference on Machine Learning (ICML)*, 2020.
- [22] Pretrained Transformers Improve Out-of-Distribution Robustness Dan Hendrycks\*, Xiaoyuan Liu\*, Eric Wallace, Adam Dziedzic, Rishabh Krishnan, Dawn Song Association for Computational Linguistics (ACL), 2020.
- [23] Universal Adversarial Triggers for Attacking and Analyzing NLP Eric Wallace, Shi Feng, Nikhil Kandpal, Matt Gardner, Sameer Singh Empirical Methods in Natural Language Processing (EMNLP), 2019.
- [24] AllenNLP Interpret: A Framework for Explaining Predictions of NLP Models Eric Wallace, Jens Tuyls, Junlin Wang, Sanjay Subramanian, Matt Gardner, Sameer Singh Demo at Empirical Methods in Natural Language Processing (EMNLP), 2019. Best Demo Award
- [25] Do NLP Models Know Numbers? Probing Numeracy in Embeddings **Eric Wallace\***, Yizhong Wang\*, Sujian Li, Sameer Singh, Matt Gardner *Empirical Methods in Natural Language Processing (EMNLP)*, 2019.

- [26] Misleading Failures of Partial-input Baselines Shi Feng, Eric Wallace, Jordan Boyd-Graber Association for Computational Linguistics (ACL), 2019.
- [27] Compositional Questions Do Not Necessitate Multi-hop Reasoning Sewon Min\*, **Eric Wallace**\*, Sameer Singh, Matt Gardner, Hannaneh Hajishirzi, Luke Zettlemoyer Association for Computational Linguistics (ACL), 2019.
- [28] Understanding Impacts of High-Order Loss Approximations and Features in Deep Learning Interpretation Sahil Singla, Eric Wallace, Shi Feng, Soheil Feizi. International Conference on Machine Learning (ICML), 2019.
- [29] Trick Me If You Can: Human-in-the-loop Generation of Adversarial Examples for Question Answering Eric Wallace, Pedro Rodriguez, Shi Feng, Ikuya Yamada, Jordan Boyd-Graber Transactions of the Association for Computational Linguistics (TACL), 2019.
- [30] Pathologies of Neural Models Make Interpretations Difficult Shi Feng, Eric Wallace, Alvin Grissom II, Mohit Iyyer, Pedro Rodriguez, Jordan Boyd-Graber Empirical Methods in Natural Language Processing (EMNLP), 2018.

## TEACHING EXPERIENCE

#### Courses:

- Co-instructor of Berkeley's graduate-level NLP (CS 288) with 90 students in Spring 2023. Taught alongside Dan Klein and Kevin Lin. I developed and taught ~10 new lectures on language models and advanced NLP topics (e.g., RLHF, retrieval, vision-language models). I also developed new homeworks, coding assignments, and mentored students.
- Teaching assistant for Berkeley's CS188: Artificial Intelligence in Summer 2023. I co-designed the midterm and final exam, led discussion sections, and held office hours.
- Recurring guest lecturer for Berkeley's CS294: Decentralized Intelligence in Fall 2023, with Dawn Song and Matei Zaharia. I lectured on privacy, security, and efficiency in large language models.

#### **Tutorials:**

• EMNLP, 2020. Interpreting Predictions of NLP Models.

#### **Guest Lectures for Courses:**

- USC CSCI 699, 2023. Security & Privacy in NLP
- Berkeley CS294/194-196, 2023. Intro & Foundations of LLMs
- Berkeley CS294/194-196, 2023. Trustworthiness: Privacy, Hallucinations, Adversarial Attacks
- Stanford CS 329X, 2023. Security & Privacy in NLP
- Washington University in St. Louis CSE 527A, 2022. Security & Privacy in NLP
- University of Minnesota CSCI 8980-06, 2022. Robustness in NLP
- UC Berkeley CS 288, 2022. Robustness in NLP
- ML @ Berkeley, 2022. Security & Privacy in NLP
- University of Stuttgart, 2022. Interpreting Predictions of NLP Models

#### Panels:

- Women in Machine Learning, 2022. PhD Fellowships Applications
- ACL Mentoring, 2022. How to Keep Up with Work in the Field
- Berkeley AI Hackathon (w/ 1500 participants), 2023. Future of LLMs—Beyond Hacking
- USENIX PEPR, 2023. Privacy Challenges and Opportunities in LLM-Based Chatbots

#### Mentoring

#### Student Research Mentoring

- Alex Wan (2022-Present), UC Berkeley Undergrad. Published [5].
- Carolyn Wang (2023), UC Berkeley Undergrad.
- Arnav Gudibande (2022–2023), UC Berkeley Masters. Published [3]. Now at PerplexityAI.
- Tony Zhao (2020–2021), UC Berkeley Undergrad. Published [13, 15]. Now PhD at Stanford.
- Albert Xu (2020–2021), UC Berkeley Undergrad. Published [10, 16]. Now PhD at USC.
- Eshaan Pathak (2020–2021), UC Berkeley Undergrad. Published [10, 16]. Now at You.com
- Jens Tuyls (2019–2020), UC Irvine Undergrad. Published [20, 24]. Now PhD at Princeton.
- Junlin Wang (2019–2020), UC Irvine Undergrad. Published [20, 24]. Now PhD at Duke.
- Nikhil Kandpal (2019), UMD Undergrad. Published [23]. Now PhD at UNC.

#### Masters Thesis Review

• Arnav Gudibande, 2023. On Imitating Proprietary Language Models. Chair: Dawn Song.

## Other Mentoring

- Women in Machine Learning (WiML), 2022–2023. PhD Application Assistance.
- Berkeley Equal Access Assistance Program (EAAA), 2022-2023. PhD Application Assistance.
- Berkeley AI4All, 2022. Instructor
- BAIR Undergraduate Mentoring, 2022–2024.

#### Presentations

#### **External Talks**

- Simons Institute, 2023. Memorization in Large Language Models
- Princeton, 2023. Memorization in Large Language Models
- Oracle Labs, 2023. Memorization in Large Language Models
- UMD, 2023. Memorization in Large Language Models
- UNC, 2023. Memorization in Large Language Models
- USC ISI, 2022. Emerging Vulnerabilities in Large-scale NLP Models
- Malicious Life Podcast, 2022. Hacking Language Models
- Stanford, 2021. What Can We Learn from Vulnerabilities of NLP Models?
- Cornell, 2021. What Can We Learn from Vulnerabilities of NLP Models?
- DeepMind, 2021. What Can We Learn from Vulnerabilities of NLP Models?
- UT Austin, 2021. What Can We Learn from Vulnerabilities of NLP Models?
- CMU, 2021. What Can We Learn from Vulnerabilities of NLP Models?

## ACADEMIC SERVICE

## Program Committee Member

- Conferences: ACL (2020, 2021, 2022), ICML (2021, 2023), NeurIPS (2020, 2021), EMNLP (2018, 2019, 2020, 2021, 2022), ACL Rolling Review (2021, 2022), ICLR (2023), NAACL (2021, 2022)
- Workshops: Distribution Shifts (NeurIPS 2022), Principles of Distribution Shifts (ICML 2022), BlackBox NLP (EMNLP 2022), RobustML Workshop (ICLR 2021), MRQA (EMNLP 2021), NLP for Positive Impact (ACL 2021), SRW (NAACL 2021), DistShift (NeurIPS 2021),

## Departmental Service

- Berkeley PhD Admissions. 2021–2024
- Berkeley Student Committee for Faculty Hiring. 2023
- Berkeley PhD Visit Days Recruitment. 2021–2024

## Academic Grants & Sponsorships

- Led successful award for ~1500 TPUs from Google TRC (\$10M+ USD value)
- Apple Fellowship in AI/ML, 2022–2024

#### Workshop Organization

• Future of Decentralization, AI, and Computing Summit. 2023, Berkeley. Led by Dawn Song.

# SELECTED MEDIA & PRESS

Extracting Training Data from Diffusion Models [4], <u>MIT Technology Review</u>, <u>TWIML Podcast</u>, <u>Gizmodo</u>, <u>Ars Technica</u>, <u>Vice</u>, <u>TechSpot</u>, <u>The Register</u>, <u>New Scientist</u>, <u>Twitter #1 (3 million views)</u>, Twitter #2, Twitter #3,

Automated Crossword Solving [10], <u>Discover</u>, <u>New Scientist</u>, <u>Wired</u>, <u>Slate</u>, <u>BBC</u>, <u>Science Friday</u>, <u>Top of Hacker News</u>, <u>The Register</u>, <u>Berkeley Engineering Magazine</u>, <u>WNPR</u>, <u>Daily Californian</u>, NVIDIA Blog, Neil deGrasse Tyson Podcast, Twitter (1M views)

Extracting Training Data from Large Language Models [14], MIT Technology Review, Wired, Google Blog, BAIR Blog, Nature News, Top of Hacker News, Twitter #1, Twitter #2, Twitter #3,