# Earlence T. Fernandes

CONTACT Information

Department of Computer Sciences (CS 7387) 1210 West Dayton Street (734) 709-4334 earlence@cs.wisc.edu earlence.com

RESEARCH INTERESTS I am a systems security researcher with a special focus on evolving and emerging areas such as: Cyber-Physical Systems/IoT, Machine Learning, Mixed Reality.

EMPLOYMENT

University of Wisconsin-Madison, Madison, WI

Assistant Professor of Computer Science

Aug 2019 - Present

University of Washington, Seattle, WA

Research Associate with Prof. Tadayoshi Kohno

June 2017 - June 2019

Microsoft Research, Redmond, WA

Research Intern with Jaeyeon Jung, Oriana Riva, Suman Nath

Summers 2014-2016

Vrije Universiteit, Amsterdam, The Netherlands

Scientific Programmer with Prof. Bruno Crispo and Prof. Mauro Conti Oct 2010 - June 2012

Accenture, Pune, India

Madison, WI 53706, USA

Senior Programmer

Aug 2009 - Aug 2010

EDUCATION

University of Michigan, Ann Arbor, MI

Ph.D., Computer Science and Engineering, April 2017

- Advisor: Prof. Atul Prakash
- Committee: Prof. Z. Morley Mao, Prof. J. Alex Halderman, Prof. Florian Schaub
- Thesis: Securing Personal IoT Platforms Through Systematic Analysis and Design

M.S.E., Computer Science and Engineering, May 2014

# University of Pune, India

B.E. (Bachelor of Engineering, Computer Engineering), 9<sup>th</sup> rank out of ~2000 students, June 2009

AWARDS

- NSF CAREER Award.
- Facebook Research Award for Trust in AR/VR (joint with Rahul Chatterjee and Yuhang Zhao).
- IEEE SecDev 2018 Best Research Paper Award.
- IEEE S&P 2016 Distinguished Practical Paper Award.
- UMich PhD Fellowship 2012.

Honors

- Invited expert DARPA ISAT Study on AI Cyber-User-In-The-Loop attacks.
- Invited to brief the JASONs (DARPA/DoD) for a summer study.
- Invited to brief U.S. Congressperson Pramila Jayapal on IoT security.
- Briefed the National Academies on AI Security.
- Briefed the FTC on AI Security.
- The U.S. Stop sign used in our experiments for the CVPR 2018 paper is on display at the Science Museum in London (and is now a part of their permanent collection on self-driving car security).
- Nominee, UW Postdoc Mentoring Award 2018.
- U.S. Qualcomm Innovation Fellowship Finalist.

## CONFERENCE Papers

Google Scholar Profile: https://scholar.google.com/citations?user=OSPeHGAAAAAJ&hl=en

- SoK: Authentication in Augmented and Virtual Reality.
   Sophie Stephenson, Bijeeta Pal, Stephen Fan, Earlence Fernandes, Yuhang Zhao, Rahul Chatterjee. 43rd IEEE Symposium on Security and Privacy (Oakland 2022), San Francisco, May 2022.
- 2. GRAPHITE: A Practical Framework for Generating Automatic Physical Adversarial Machine Learning Attacks.
  Ryan Feng, Neal Mangaokar, Jiefeng Chen, **Earlence Fernandes**, Somesh Jha, Atul Prakash.

7th IEEE European Symposium on Security and Privacy (EuroS&P 2022), Genoa, June 2022.

- 3. SkillFence: A Systems Approach to Practically Mitigating Voice-Based Confusion Attacks. Ashish Hooda, Matt Wallace, Kushal Jhunjhunwala, **Earlence Fernandes**, Kassem Fawaz. *ACM International Conference on Ubiquitous Computing*, (UbiComp/IMWUT 2022).
- Practical Data Access Minimization in Trigger-Action Platforms.
   Yunang Chen, Mohannad Alhanahnah, Andrei Sabelfeld, Rahul Chatterjee, Earlence Fernandes. 31st USENIX Security Symposium, (USENIX Sec 2022), Boston, MA, Aug 2022.
- 5. SoK: Context Sensing for Access Control in the Adversarial Home IoT. Weijia He, Valerie Zhao, Olivia Morkved, Sabeeka Siddiqui, **Earlence Fernandes**, Josiah Hester, Blase Ur. 6th IEEE European Symposium on Security and Privacy (EuroS&P 2021), Online Event, Sep 2021.
- 6. Invisible Perturbations: Physical Adversarial Examples Exploiting the Rolling Shutter Effect. Athena Sayles, Ashish Hooda, Mohit Gupta, Rahul Chatterjee, **Earlence Fernandes**. Computer Vision and Pattern Recognition (CVPR 2021), Online Event, June 2021 (arXiv:2011.13375)
- 7. Data Privacy in Trigger-Action Systems. Yunang Chen, Amrita Roy Chowdhury, Ruizhe Wang, Andrei Sabelfeld, Rahul Chatterjee, Earlence Fernandes. 42nd IEEE Symposium on Security and Privacy (Oakland 2021), Online Event, May 2021.
- 8. Sequential Attacks on Kalman filter-based Forward Collision Warning Systems. Yuzhe Ma, Jon Sharp, Ruizhe Wang, **Earlence Fernandes**, Xiaojin Zhu. 35th AAAI Conference on Artificial Intelligence (AAAI 2021), Online Event, Feb 2021.
- Tyche: A Risk-Based Permission Model for Smart Homes.
   Amir Rahmati, Earlence Fernandes, Kevin Eykholt, Atul Prakash. 3rd IEEE Cybersecurity Development Conference, (SecDev 2018), Boston, MA, Oct 2018.
   Best Research Paper Award.
- Rethinking Authentication and Access Control for the Home Internet of Things.
   Weijia He, Maximilian Golla, Roshni Padhi, Jordan Ofek, Markus Durmuth, Earlence Fernandes, Blase Ur. 27th USENIX Security Symposium, (USENIX Sec 2018), Baltimore, MD, Aug 2018, Acceptance Rate: 19%.
- 11. Robust Physical-World Attacks on Deep Learning Visual Classification. Kevin Eykholt, Ivan Evtimov, Earlence Fernandes, Bo Li, Amir Rahmati, Chaowei Xiao, Atul Prakash, Tadayoshi Kohno, Dawn Song. Computer Vision and Pattern Recognition (CVPR 2018), Salt Lake City, UT, June 2018 (supersedes arXiv:1707.08945).
- 12. Is Tricking a Robot Hacking?
  Ryan Calo, Ivan Evtimov, **Earlence Fernandes**, Tadayoshi Kohno, David O'Hair. *Proceedings of WeRobot*, Stanford, CA, April 2018 (This is an inter-disciplinary conference at the intersection of technology law and robotics).
- Decentralized Action Integrity for Trigger-Action IoT Platforms.
   Earlence Fernandes, Amir Rahmati, Jaeyeon Jung, Atul Prakash. 22nd Network and Distributed Security Symposium, (NDSS 2018), San Diego, CA, February 2018, Acceptance Rate: 21.4%.

- 14. Heimdall: A Privacy-Respecting Implicit Preference Collection Framework. Amir Rahmati, Earlence Fernandes, Kevin Eykholt, Xinheng Chen, Atul Prakash. 15th ACM International Conference on Mobile Systems, Applications, and Services, (MobiSys 2017), Niagara Falls, NY, June 2017, Acceptance Rate: 18%.
- 15. ContexIoT: Towards Providing Contextual Integrity to Applified IoT Platforms. Yunhan Jack Jia, Qi Alfred Chen, Shiqi Wang, Amir Rahmati, Earlence Fernandes, Z. Morley Mao, Atul Prakash. 21st Network and Distributed Security Symposium, (NDSS 2017), San Diego, CA, Feb 2017, Acceptance Rate: 16%.
- 16. Applying the Opacified Computation Model to Enforce Information Flow Policies in IoT Applications.
  Amir Rahmati, Earlence Fernandes, and Atul Prakash. 1st IEEE Cybersecurity Development Conference, (SecDev 2016), Boston, MA, Nov 2016, Acceptance Rate: 38.6%.
- 17. Appstract: On-The-Fly App Content Semantics With Better Privacy.

  Earlence Fernandes, Oriana Riva, and Suman Nath. 22nd Annual Intl. Conf. on Mobile Computing and Networking, (MobiCom 2016), New York, NY, Oct 2016, Acceptance Rate: 14%.
- FlowFence: Practical Data Protection for Emerging IoT Application Frameworks.
   Earlence Fernandes, Justin Paupore, Amir Rahmati, Daniel Simionato, Mauro Conti, Atul Prakash. 25th USENIX Security Symposium, (USENIX Sec 2016), Austin, TX, Aug 2016, Acceptance Rate: 15.4%.
- Security Analysis of Emerging Smart Home Applications.
   Earlence Fernandes, Jaeyeon Jung, Atul Prakash. 37th IEEE Symposium on Security and Privacy, (S&P 2016), San Jose, CA, May 2016, Acceptance Rate: 13.3%.
   Distinguished Practical Paper Award.
- Android UI Deception Revisited: Attacks and Defenses.
   Earlence Fernandes, Qi Chen, Justin Paupore, Georg Essl, J. Alex Halderman, Z. Morley Mao, Atul Prakash. 20th Intl. Conf. on Financial Cryptography and Data Security, (FC 2016), Barbados, February 2016, Acceptance Rate: 26%.
- 21. Decomposable Trust for Android Applications. Earlence Fernandes, Ajit Aluri, Alexander Crowell, Atul Prakash. 45th Annual IEEE/IFIP Intl. Conf. on Dependable Systems and Networks, (DSN 2015), Rio de Janeiro, Brazil, June 2015, Acceptance Rate: 21.8%.
- MOSES: Supporting Operation Modes on Smartphones.
   Giovanni Russello, Mauro Conti, Bruno Crispo, Earlence Fernandes. 17th ACM Symposium on Access Control Models and Technologies, (SACMAT 2012), Newark, NJ, Jun 2012, Acceptance Rate: 26%.
- 23. YAASE: Yet Another Android Security Extension.
  Giovanni Russello, Bruno Crispo, **Earlence Fernandes**, Yury Zhauniarovich. 3rd IEEE Intl.
  Conf. on Privacy, Security, Risk and Trust, (PASSAT 2011), Boston, MA, Oct 2011.
- JOURNAL PAPERS
- Program Analysis of Commodity IoT Applications for Security and Privacy: Opportunities and Challenges.
   Berkav Celik, Earlence Fernandes, Eric Pauley, Gang Tan, Patrick McDaniel. ACM
  - Z. Berkay Celik, **Earlence Fernandes**, Eric Pauley, Gang Tan, Patrick McDaniel. ACM Computing Surveys, (CSUR 2019).
- 2. Internet of Things Security Research: A Rehash of Old Ideas or New Intellectual Challenges? **Earlence Fernandes**, Amir Rahmati, Kevin Eykholt, Atul Prakash. *IEEE Security and Privacy: Systems Attacks and Defenses*, (S&P Magazine 2017), (arXiv:1705.08522)
- 3. The Security Implications of Permission Models in Smart Home Application Frameworks. **Earlence Fernandes**, Amir Rahmati, Jaeyeon Jung, Atul Prakash. *IEEE Security and Privacy Volume 15 Issue 2*, (S&P Magazine 2017).

- 4. MOSES: Supporting and Enforcing Security Profiles on Smartphones. Yury Zhauniarovich, Giovanni Russello, Mauro Conti, Bruno Crispo, **Earlence Fernandes**. *IEEE Transactions on Dependable and Secure Computing*, (TDSC 2014).
- FM 99.9 Radio Virus: Exploiting FM Radio Broadcasts for Malware Deployment.
   Earlence Fernandes, Bruno Crispo, Mauro Conti. IEEE Transactions on Information Forensics and Security, (TIFS 2013).
- CRePE: A system for enforcing fine-grained Context-related Policies on Android.
   Mauro Conti, Bruno Crispo, Earlence Fernandes, Yury Zhauniarovich. *IEEE Transactions on Information Forensics and Security*, (TIFS 2012).

## Workshop Papers

- 1. Analyzing the Interpretability Robustness of Self-Explaining Models.

  Haizhong Zheng, **Earlence Fernandes**, Atul Prakash. Security and Privacy of Machine Learning Workshop (co-located with ICML 2019), Long Beach, CA, June 2019.
- Analysis of the Susceptibility of Smart Home Programming Interfaces to End User Error.
   Mitali Palekar, Earlence Fernandes, Franziska Roesner. IEEE Workshop on the Internet of Safe Things, (SafeThings 2019), San Francisco, CA, May 2019.
- Physical Adversarial Examples for Object Detectors.
   Kevin Eykholt, Ivan Evtimov, Earlence Fernandes, Bo Li, Amir Rahmati, Florian Tramer,
   Atul Prakash, Tadayoshi Kohno, Dawn Song. 12th USENIX Workshop on Offensive Technologies (WOOT 2018), Baltimore, MD, August 2018 (supersedes arXiv:1712.08062).
- 4. The State of Physical Attacks on Deep Learning Systems.

  Earlence Fernandes. 2018 USENIX Summit on Hot Topics in Security, (HotSec 2018), Baltimore, MD, August 2018.
- Cybersecurity in the Smart City.
   Yuyi Taylor, Guy Verrier, Yuan Tian, Earlence Fernandes, Tadayoshi Kohno. 2018 USENIX Summit on Hot Topics in Security, (HotSec 2018), Baltimore, MD, August 2018.
- Securing Trigger-Action Platforms.
   Earlence Fernandes, Amir Rahmati, Jaeyeon Jung, Atul Prakash. 2017 USENIX Summit on Hot Topics in Security, (HotSec 2017), Vancouver, BC, August 2017 (arXiv:1707.00405).
- Support for Security and Safety of Programmable IoT Systems.
   Alex Gyori, Earlence Fernandes, Amir Rahmati, Atul Prakash, Darko Marinov. ISSTA 2017
   Workshop on Testing Embedded and Cyber-Physical Systems, (TECPS 2017), Santa Barbara, CA, July 2017.
- 8. My OS ought to know me better: In-app Behavioral Analytics as an OS service. **Earlence Fernandes**, Oriana Riva, Suman Nath. 15th Workshop on Hot Topics in Operating Systems, (HotOS XV), Kartause Ittingen, Switzerland, May 2015, Acceptance Rate: 31.8%.
- Practical Always-On Taint Tracking on Mobile Devices.
   Justin Paupore, Earlence Fernandes, Sankardas Roy, Xinming Ou, Atul Prakash. 15th Workshop on Hot Topics in Operating Systems, (HotOS XV), Kartause Ittingen, Switzerland, May 2015, Acceptance Rate: 31.8%.
- 10. OASIS: Operational Access Sandboxes for Information Security.

  Mauro Conti, **Earlence Fernandes**, Justin Paupore, Atul Prakash, Daniel Simionato. (alphabetical order) 4th ACM CCS Workshop on Security and Privacy in Smartphones and Mobile Devices, (SPSM 2014), Scottsdale, AZ, Nov 2014.
- Beyond Instruction Level Taint Propagation.
   Beng Heng Ng, Earlence Fernandes, Ajit Aluri, David Velazquez, James Yang, Atul Prakash.
   6th ACM European Workshop on Systems Security, (EuroSec 2013), Prague, Czech Republic, Apr 2013.

BOOKS

1. Instant Android Systems Development, Earlence Fernandes, Packt Publishers, UK, 2013.

PATENTS

- System and Method for Extracting and Sharing Application-Related User Data.
   Oriana Riva, Suman Nath, Doug Burger, Earlence Fernandes. U.S. Patent Pending 14/734,991
- De-siloing Applications for Personalization and Task Completion Services.
   Oriana Riva, Suman Nath, Doug Burger, Earlence Fernandes. U.S. Patent Pending 14/618,854

## MISCELLANY

- DEMO: Sequential Attacks on Forward Collision Warning.
   Yuzhe Ma, Jon Sharp, Ruizhe Wang, Earlence Fernandes, Jerry Zhu. AutoSec 2021 (colocated with NDSS), Feb 2021.
- tr- IFTTT vs. Zapier: A Comparative Study of Trigger-Action Programming Frameworks. Amir Rahmati, **Earlence Fernandes**, Jaeyeon Jung, Atul Prakash. Preprint (arXiv:1709.02788), Sep 2017.
- tr- Per-App Profiles with AppFork: The Security of Two Phones with the Convenience of One. Temitope Oluwafemi, **Earlence Fernandes**, Oriana Riva, Franziska Roesner, Suman Nath, Tadayoshi Kohno. *Microsoft Research Technical Report*, MSR-TR-2014-153, December 2014.
- tr- TIVOs: Trusted Visual I/O Paths for Android. **Earlence Fernandes**, Qi Alfred Chen, Justin Paupore, Georg Essl, J. Alex Halderman, Z. Morley Mao, Atul Prakash. *University of Michigan*, *Technical Report CSE-TR-586-14*.
- invited- The confinement problem: 40 years later. Alexander Crowell, Beng Heng Ng, **Earlence Fernandes**, Atul Prakash. *JIPS 9*, 2013.
- poster- Anception: Hybrid Virtualization for Android Applications.

  Earlence Fernandes, Ajit Aluri, Alexander Crowell, Atul Prakash. USENIX Security, 2013.
- poster- Demonstrating the effectiveness of MOSES for separation of execution modes. Giovanni Russello, Mauro Conti, Bruno Crispo, **Earlence Fernandes**, Yury Zhauniarovich. *ACM CCS*, 2012.

# INVITED TALKS

- "Decentralized Action Integrity for Trigger-Action Platforms," Nov 2020, at the Chalmers University of Technology, Gothenburg, Sweden, and the Ohio State University, Ohio, USA.
- "Physical Attacks on Object Detectors," June 2020, at the Workshop on Adversarial Machine Learning in Computer Vision co-located with CVPR, Seattle, WA, USA.
- "Decentralized Action Integrity for Trigger-Action IoT Platforms," Oct 2019, at the Triangle Area Privacy and Security Day, Duke University, NC, USA.
- I was invited to brief the JASON defense advisory group for the 2018 summer study. The JASONs are a group of elite scientists that the U.S. Department of Defense contracts with to solve challenging problems. JASON members include physicists, biologists, mathematicians, chemists, and computer scientists. Over the years, 11 Nobel prize winners have been members. See https://en.wikipedia.org/wiki/JASON\_(advisory\_group) for more details.
- "Physical Attacks on Deep Learning Systems," May 2018, at 2nd ARO/IARPA Workshop on Adversarial Learning, College Park, MD, USA.
- "Computer Security and Privacy for the Physical World," Nov 2017 *Keynote* at IoT Security and Privacy Workshop co-located with CCS 2017, and Sep 2017 invited talk at University of California Berkeley, USA (Host: Prof. Dawn Song).
- "Robust Physical-World Attacks on Deep Learning Models," Sep 2017, Stanford University, USA.
- "IoT Security: What, Why, and How," May 2017, IEEE Mobile Security Technologies (MoST) workshop affiliated with IEEE S&P 2017, San Jose, CA, USA.
- "Securing IoT Platforms through Systematic Analysis and Design," Nov 2016, University of Illinois at Urbana-Champaign, USA (Host: Prof. Darko Marinov).
- "Modern Cyber-Physical Systems Security: Attacks and Defenses," Aug 2016, University of Washington, Seattle, USA (Host: Prof. Yoshi Kohno).

- "FlowFence: Practical Data Protection for Emerging IoT Application Frameworks," Aug 2016, Microsoft Research, Redmond, USA.
- "Security Analysis of Emerging Smart Home Applications," May 2016, CMU Silicon Valley, USA (Host: Prof. Patrick Tague).
- "Towards a Safer IoE: Detecting and Correcting Abnormal Interactions between Things in Smart Homes," Mar 2016, University of Illinois at Urbana-Champaign, and Qualcomm Research, San Diego, USA.
- "SmartThings Security Analysis," Aug 2015, Microsoft Research, Redmond, USA.
- "Appstract: On-device behavioral analytics," Aug 2014, Microsoft Research, Redmond, USA.
- "Trusted Visual I/O Paths," Aug 2014, Microsoft Research, Redmond, USA.

- ACADEMIC SERVICE PC co-chair: IEEE Workshop on Internet of Safe Things (co-located with IEEE S&P), 2021.
  - PC Member for: CCS 2020, NDSS 2020, USENIX Security 2018-2021, IoT S&P 2018 (co-located with SIGCOMM 2018), Machine Learning and Computer Security Workshop 2017 (co-located with NIPS 2017), IoT S&P 2017 (co-located with CCS 2017), SafeThings 2017 (co-located with SenSys 2017), SecureComm 2017, IEEE MoST 2017 (co-located with S&P 2017), IEEE Security and Privacy (S&P) 2017 Shadow Committee, SecCPS Workshop 2017 (co-located with IEEE HASE 2017), SEMS 2017 (co-located with Euro S&P 2017), ICISS 2014-2016.
  - External Reviewer for: UbiComp/IMWUT 2018, USENIX Security 2017, ACM WiSec 2017, IEEE Transactions on Mobile Computing 2017, CHI 2017, NDSS 2017, IEEE DSN 2016, DIMVA 2015, IEEE Transactions on Computers 2013.
  - Publicity Co-Chair: Workshop on Security for Embedded and Mobile Systems (SEMS; co-located with EuroSP 2017).
  - Panelist: Security at University of Michigan IT (SUMIT) conference 2016.

- CURRENT STUDENTS Yunang Chen (PhD)
  - Ashish Hooda (PhD)

# GRADUATED STUDENTS

- Jon Sharp, MS (2020). Software Engineer at Amazon.
- Tyler Gu, BS (2021). PhD student at UIUC.
- Ruizhe Wang, BS (2021). Winner of the DeWitt Scholarship and honorable mention at the CRA outstanding undergraduate researcher awards.
- Luna Sayles, MS (2021).

# PAST MENTORING EXPERIENCE

- Ivan Evtimov, University of Washington Ph.D. student (adversarial deep learning).
- Mitali Palekar, University of Washington B.S. student (trigger-action programming).
- Zhi Qian Seah, University of Michigan, Bachelor Thesis Technical Advisor ("Partitioning the Android System Services").

## TEACHING

- CS 642 (UW Madison): Introduction to Computer Security.
- CS 839/782 (UW Madison): Advanced Computer Security and Privacy.
- EECS 588 (Michigan): Graduate Course in Computer and Network Security.
- CSE 590Y (UW Seattle): Graduate Seminar in Adversarial Deep Learning.

## Press Coverage

Much of my work has been covered in the media: Wired, Schneier on Security, The Verge, Gizmodo, Ars Technica, CNET, Mashable, Detroit Free Press, ZDNet, Yahoo News.