Varun Viswanath

I develop **novel machine learning techniques** to study **longitudinal time-series** in **real-world health contexts**. Currently, I am using a dataset of 60,000 real-world wearable device users to explore methods discovering longitudinal structures when detecting anomalies in wearable time series. I have broad experience in across ubiquitous computing, design research, deep learning, computer science, and bioengineering. In the future, I hope to further explore how deep learning and other statistical methods can augment wearable and ubiquitous technology to improve peoples' health and lifestyle.

	Education		
2019 - Now	University of California, San Diego Ph.D. in Electrical and Computer Engineering, Machine Learning and Data Science Advisors: Edward Wang (Design Lab, ECE), Benjamin Smarr (Halıcıoğlu Data Science Institute, Bioengineering)		
2015 - 2019	University of WashingtonSeattle, WAB.S. in Computer Science and Engineering, Paul G. Allen School of Computer Science and Engineering Senior Research Thesis: Using Confidence in Smartphone Spirometry Advisor: Shwetak Patel (Ubicomp Lab, Allen School of CSE)Seattle, WA		
	Publications		
Jun 2024	Five Million Nights: Temporal Dynamics in Human Sleep Phenotypes [PDF] Varun K. Viswanath*, Wendy Hartogenesis, Stephan Dilchert, Leena Pandya, Frederick M. Hecht, Ashley E. Mason, Edward J. Wang, Benjamin L. Smarr npj Digital Medicine		
Jul 2024	A cross-study analysis of wearable datasets and the generalizability of acute illness monitoring models [PDF] Patrick Kasl*, Severine Soltani, Lauryn Keeler Bruce, <i>Varun K. Viswanath</i> , Wendy Hartogenesis, Amarnath Gupta, Ilkay Altintas, Stephan Dilchert, Frederick M. Hecht, Ashley E. Mason, Benjamin L. Smarr Conference on Health, Information, and Learning (CHIL) 2024 – Best Paper Award		
Nov 2023	Variability of temperature measurements recorded by a wearable device by biological sex Lauryn Keeler Bruce*, Patrick Kasl, Severine Soltani, <i>Varun K. Viswanath</i> ,, Ashley E. Mason*, Benjamin L. Smarr* Biology of Sex Differences		
Aug 2023	SpecTracle: Wearable Facial Motion Tracking from Unobtrusive Peripheral Cameras [PDF] Yinan Xuan*, <i>Varun Viswanath,</i> Sunny Chu, Owen Bartolf, Jessica Echterhoff, Edward Wang ArXiv		
Apr 2023	Detecting Periodic Biases in Wearable-Based Illness Detection Models [PDF] Amit Klein*, <i>Varun Viswanath*</i> , Benjamin Smarr, Edward Wang ICLR 2023, Time-Series Representation Learning for Health (TSRL4H) – Selected for Oral Presentation		
Sep 2022	Smartphone Camera Oximetry in an Induced Hypoxemia Study Varun Viswanath*, Jason S. Hoffman*,, Eric C. Larson, Shwetak N. Patel, Edward Wang npj Digital Medicine		
Mar 2022	Detection of COVID-19 using multimodal data from a wearable device: results from the first TemPredict Study Ashley Mason*, Frederick L. Hecht, Varun Viswanath, Benjamin L. Smarr (80+ Authors) Scientific Reports		
Mar 2022	Stepping into the Next Decade of Ubiquitous and Pervasive Computing: Ubicomp & ISWC 2021 Rahul Majethia*, Shreya Ghosh, Hanna Nolasco, Farhana Shahid, <i>Varun Viswanath</i> , Ibrahim Shehi Shehu, Yiran Zhao IEEE Pervasive Computing		
Dec 2021	Dynamical clustering of U.S. states reveals four distinct infection patterns that predict SARS-CoV-2 pandemic behavior [PDF] Joseph Lane Natale, Ph.D.*., Varun Viswanath, Benjamin L. Smarr ArXiv		
Dec 2021	TemPredict: A Big Data Analytical Platform for Scalable Exploration and Monitoring of Personalized Multimodal Data for COVID-19 [PDF] Shweta Purawat*, Subhasis Dasgupta, Varun Viswanath, Benjamin Smarr, Amarnath Gupta, and Ilkay Altintas. IEEE BigData 2021		
Jul 2018	SpiroConfidence: Determining the Validity of Smartphone Spirometry using Machine Learning [PDF] Varun Viswanath*, Jake Garrison, Shwetak Patel EMBC 2018		
	Honors, Accolades, Services		

Sep 2023Organizing Committee, Student Volunteer Chair, Ubicomp 2023
Worked 48 Volunteers, organized a 5-day conference with nearly 600 attendees.Cancun, MexicoMar 2023Network Award Winner, Center for Circadian Biology Symposium 2023La Jolla, CASep 2021Student Volunteer, Ubicomp 2021, Supported Sessions in Health, Sensing, and HCI
Sep 2020Online: Gather.town
Online: Gather.townJul 2018Session Chair, Session: Deep Learning Imaging II, EMBC '18Honolulu, HICore ResearchCore ResearchKance Student Volunteer

Feb 2023 – Now Periodicity in Wearable Time-Series

Jun 2023 – Now Passive Screening for Diabetes with Non-CGM Wearables

Diabetes is chronic disorder that is goes undiagnosed in millions of people. Wearable devices tracking heart rate, skin temperature may be able to identify the physiological effects of diabetes in the nervous and cardiovascular systems. With their widespread adoption, we could passively screen over 40% of the population. We show the feasibility of a passive screening algorithm that extracts key heart rate, HRV, and circadian rhythm features, using skin temp. and sleep parameters, and achieves AUC=0.88, AUPRC 0.80 on a binary classification task. This work is in review.

Jun 2022 – Now Five Million Nights: Temporal Dynamics of Human Sleep Phenotypes

An increasing number of people are using wearable devices to monitor their sleep. However, algorithms that use wearable sleep data struggle because of how human sleep differs between people and within people over time. We develop a novel representation that uses a topological data analysis pipeline and temporal dynamics graph to better captures these differences. We characterize the temporal sleep dynamics of a population of 33,152 individuals monitored over 3-6 months and test whether temporal dynamics give us more information about individuals who have chronic or acute illnesses. We show how our model represents several key patterns in how an individual's sleep changes longitudinally and find that these changes in sleep give 2-10 times as much information about the presence of sleep apnea, diabetes, flu, fever, and COVID-19. We are submitting this manuscript to top tier journals in digital health and medicine. We published this work in Nature Publishing Journals Digital Medicine.

2020 - 2022 SpO2: Tracking Blood Oxygen Levels with a Mobile Phone

Respiratory illnesses like Covid-19 often attack our lung's ability to bring oxygen into our blood stream. People can appear unaffected until their blood oxygen reaches dangerous levels (<84%) where they can suddenly faint or lose consciousness. Tracking blood oxygen with a readily available smartphone device can bring safety and peace of mind for those with such respiratory conditions. We collect a novel dataset and develop a novel deep learning algorithm which tracks blood oxygen concentrations ranging from 70-100% within 5% mean absolute error. We published our Patented model alongside further analysis of viability of this approach in Nature Publishing Journals Digital Medicine.

2020 - 2021 TemPredict: Predicting COVID-19 from Continuous Physiological Data

Continuously measured heart rate, respiratory rate, and skin temperature provide a rich view of our internal state from illness onset to recovery. Through the TemPredict project, we collected data from 63,153 participants and developed a Gradient Boosting-based algorithm using data colleßcted by a consumer wearable (Oura Ring) that predicts the onset of COVID-19 an average of 2.75 days before participants sought diagnostic testing with receiving operating characteristic (ROC) **area under the curve (AUC) of 0.819** (95%CI [0.809, 0.830]). We published this work in the Scientific Reports Journal.

2016 - 2019 SpiroSmart: Using a Smartphone Microphone to Measure Lung Function

Access to spirometry, a noninvasive test for lung function fundamental in the diagnosis of most respiratory illnesses, is limited in rural areas where clinics are less equipped or accessible. We develop a deep learning algorithm to perform spirometry using audio clips from smartphone microphone, leveraging machine learning to clean ~40,000 spirometry audio clips and novel techniques for incorporating user metadata in the architecture. Our model regresses a Flow vs. Volume curve and achieves 98% precision and 88% recall in severity classification of the FEV1 score. This research is published in my mentor's master's thesis and the data cleaning machine learning model I developed is published at the IEEE EMBS conference.

Mentorship

2023 - 2024 Feasibility of Non-CGM Wearables for Detecting Diabetes Mellitus

Diabetes Mellitus (DM) is a common, chronic metabolic disorder that affects the cardiovascular system, autonomic nervous system, and sleep quality. These effects may manifest as differences in physiological data streams (e.g. heart rate, heart rate variability, distal body temperature). We hypothesize that machine learning algorithms can use these differences to non-invasively identify persons with a high probability of having diabetes from wearable devices not designed for continuous glucose monitoring (CGM). We (1) found statistically significant population-level differences in nightly features of physiological data streams, (2) achieved Area Under the ROC Curve (AUROC) of 0.88 and Area Under Precision Recall Curve (AUPRC) of 0.80 with our best out-of-the-box machine learning algorithm on diabetes classification using multiple-night time windows from the physiological data streams and (3) showed that

other chronic conditions minimally impacted the number of False Positive predictions, and that separability arose largely from temperature-related features. These results support the hypothesis that non-CGM wearables could fuel persistent public health efforts, and that such efforts could identify different chronic conditions ahead of the deployment of condition-specific sensors for subsequent tracking.

2022 – 2023 Detecting Periodic Biases in Wearable-Based Illness Prediction Models

Wearable health devices allow us to continuously track physiological indicators such as heart rate, enabling the development of Wearable-Based Illness Detection (W-BID) models, which aim to detect the onset of illness by identifying shifts in heart rate and other signals. While W-BID models accurately detect illness, they often over-predict illness during healthy time periods due to variance caused by seemingly random human choices. However, it is because W-BID models treat each input window as independent and identically distributed samples that we are unable to account for the weekly structure of variance that causes false positives. Towards preventing this, we proposed a system for identifying structural variance in wearable signals and measuring the effect they have on W-BID models. We demonstrate how a simple statistical model that does not account for weekly structure is strongly biased by weekly structure, with a Pearson correlation coefficient of 0.9. This work was one of six top accepted works that gave oral presentations at the ICLR Time-Series Representation Learning for Health Workshop.

2022 - 2023 Deep Learning for Fever Detection using Wavelet Transforms of Wearable Data

Continuously measured heart rate, respiratory rate, and skin temperature provide a rich view of our internal state from illness onset to recovery. Previously proposed fever detection models used small datasets on the order of a couple thousand instances across 100+ individuals. We propose performing transfer learning from pre-trained object recognition models on the wavelet power in the form of an image. We currently achieve 0.74 AUC and are working to improve the performance and interpretability this algorithm.

Oct - Feb 2022 Detecting Motherese speech in Freeform Audio

Infant reactions to Motherese, or the high-pitched voice people often use to talk to babies and infants, has been shown to be a potential early indicator of autism. Towards a potential autism detection system, my mentees develop a novel machine learning and signal processing approach to detect adult vs. motherese vs. baby or infant speech or sound production.

Jun - Nov 2021 ENLACE Summer Research Program: Dynamical clustering of U.S. states reveals four distinct infection patterns that predict SARS-CoV-2 pandemic behavior

ENLACE is a summer research program where researchers from UC San Diego closely mentor undergraduate and research students from school across Mexico and Brazil in various research projects. Our five students scraped and cleaned 8+ months of data on COVID-19 infection, mask use, vaccination across the US. They then explored hierarchical clustering models to show that states can use infection rates in geographically collocated states to guide their own public health guidelines. We published this research through ArXiv and are submitting to other venues.

Internship Experience

Mar - Sep 2024 Samsung Research America – Research Intern Mountain View, CA Designed a novel algorithm for real-time sleep staging that improved 8% balanced accuracy over prior approaches. Collaborated with researchers at MIT to help run study exploring novel applications using wearable technology.

Jun - Sep 2018 Uber Elevate Intern

Uber Elevate Intern San Francisco, CA Explored a range of novel algorithms and heuristics for finding high optimality paths for building aircraft flight plans. Showed our algorithm could find high quality solutions in 1 min while current brute force solution took 30 min.

Skills

Java | Python | Swift | JavaScript | C/C++ | SQL | R | Keras | PyTorch | FastAl | Arduino | Bash | Vim | Git | Raspberry Pi | Google Cloud Platform

Poster Presentations

Feb 2023 Center for Circadian Biology Symposium, Poster Session, RhyPredict: Detecting Periodic Biases in Wearable Time-Series La Jolla, CA

Discovered a correlation of 0.9 between weekend heart rate perturbations and heightened model predictions.

- Nov 2021 UCSD Design Innovation Building Grand Opening, Tempredict DL: Using Deep Learning to Analyze Longitudinal High Granularity Signals La Jolla, CA
 - Illustrated 12% difference in performance of CNN model on high- versus low- variance physiological data.
- Oct 2018 UW Industry Affiliates Poster Session, SpiroConfidence Seattle, WA Achieved 98% precision and 88% recall on binary classification of spirometry audio using a Gated-CRNN.
- Dec 2018 **CSE 590g1 Intro to Deep Learning,** Pneumonia Classifier Using Darknet Architecture Seattle, WA Achieved 83% accuracy on Stanford dataset of chest X-rays of normal and pneumonia patients using Darknet model.
- Dec 2018 CSE 455 Computer Vision, Puppy.CV: Classifying Puppy Breed

Achieved 85% accuracy on 6 classes of Stanford Dog Dataset using 5-layer CNN.

Relevant Coursework

UCSD Unsupervised Learning, GPU Programming, Deep Generative Models, Statistical Learning I, Probability and Statistics, Neural Networks/Pattern Recognition, Mobile Health Sensing UW Deep Learning, Natural Language Processing, Artificial Intelligence, Computer Vision, Machine Learning Software Development Side Projects Sep 2021 - Now Larry Smarr Gut-Biome Research Dashboard Earth 2.0, UCSD Developing interactive dashboard of gut microbiome organisms over 20 years to facilitate gut-biome research. March - April 2020 COVID Dashboard Earth 2.0, UCSD Helped to design and build a React/S + Node/S citizen science webservice to deliver and collect useful COVID data Facial Tracking Glasses Ubiquitous Data Computing Lab, UCSD Jan - March 2020 Constructed device that uses quad-cam Raspberry Pi setup to record wearer's facial expressions through daily living. Jun - Aug 2017 FreshAir UbiComp Lab, UW

Built Swift iOS app, asynchronous server with Tornado, and Docker system for a server and database, as well as a prediction algorithm that performs real time SpiroSmart tests, both for use in a 2-year international clinical study.

UbiComp Lab, UW

UbiComp Lab, UW

Jun - Sep 2017 SpiroSound

Ran study and analyzed data to identify polynomial relationship between audio and human breath air flow. Built visual feedback for study participant. Built data pipeline and data processing functions in python.

Aug 2017 PupilScreen

Built prototype app in Swift and tornado server for collecting and uploading video data.

<u>Extra-Curricular</u>

2015 - 2019 UW Chess Club, President Organized weekly meetings and 4 tournaments with Amazon, Microsoft, and Allen Institute of Artificial Intelligence. Grew club size from just 1 member to 60-70 members. Built website and social media platforms. [Link]

- 2016 2018 CodeDay Seattle Mentorship Team, Hackathon Mentor for iOS and Web programming
- 2015 2017 Human Powered Submarine, Embedded Systems Architect, Web Developer

Hackathons

Oct 2018	DubHacks, University of Washington	Seattle, WA
Oct 2017	DubHacks, University of Washington	Seattle, WA
Apr 2017	DefHacks, Microsoft	Redmond, WA
Feb 2016	ZooHackathon, Woodland Park Zoo	Seattle, WA
Oct 2016	DubHacks, University of Washington	Seattle, WA
Oct 2016	FishHackathon, Impact Hub	Seattle, WA
Oct 2015	DubHacks, University of Washington	Seattle, WA
May 2015	LAHacks, University of California, Los Angeles	Los Angeles, CA