## Daniel R. Kick, PhD

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# Education

2015-2021 PhD: Biological Sciences

University of Missouri

Coursework Included: Machine Learning Methods for Biomedical Informatics, Quantitative Methods in the

Life Sciences, and Grant Writing

2011-2015 BS: Biology

Truman State University

Coursework Included: Next Generation Sequence Data and Analysis, Bioinformatics, Statistics, and Economic & Medicinal Botany. Leadership role in the biological honors society Tri-Beta.

# Professional and Research Experience

#### 2021-Pres. Research Geneticist

**USDA ARS** 

### Scientific & Technical

- Secured \$225,000 to develop "Environmentally Aware Deep Learning Based Genomic Selection And Management Optimization For Maize Yield" (NIFA <u>Grant</u> 2023-67012-39485).
- Initiated and led a multi-institutional research collaboration to evaluate deep learning for trait prediction in corn, soy, fruit fly, and cattle.
- Developed python library and command line tools to train biologically informed deep neural networks.
- Published manuscripts on trait prediction with deep learning, machine learning, statistical modeling, and ensembles of the above.
- Designed and implemented machine learning system for identifying viruses with potential for cross-species infection in collaboration with domain experts.
- Contributed to development of internally used tools

### Communication, Development, & Service

- Communicated with stakeholders via 21 presentations including invited presentations at University of Michigan, Truman State University, Iowa State University, and University of Georgia's AI in Plant Breeding Symposium.
- Codified and collected protocols and tacit technical knowledge by creating a methods focused lab webpage (See <u>Washburn Lab Resources</u>)
- Authored technical blog posts (~6o available <u>here</u> and at <u>danielkick.com</u>).
- Developed conference website on behalf of the Maize Genetics Cooperation. Demonstration site using 2024 data is <a href="here">here</a>.
- Provided statistical and programming support to collaborators.

- Initiated and coordinated group of deep learning practitioners and learners and designed and led technical and professional trainings.
- Mentored 4 students.
- Designed and completed a professional development curriculum through the Bayer-University Mentoring Program and the Maize Genetics Mentoring Program.

### 2015-2021 Graduate Researcher

### University of Missouri

#### Scientific & Technical

- Author on 6 publications, one in Proceedings of the National Academy of Sciences.
- Developed novel analytical methodologies to solve intractable research questions.
- Provided statistical consulting to collaborators including biologists, physiologists, and engineers.

#### Communication, Development, & Service

- Communicated results through 18 presentations (6 national, 6 regional, 6 outreach).
- Led 4 teaching assistants in adapting teaching laboratory curriculum during COVID-19 pandemic.
- Developed statistics web application used by more than 700 students as of 2021 with shiny (<u>source</u>, <u>deployed</u>) for data visualization, testing assumptions, and fitting frequentist, non-parametric, and Bayesian models.
- Mentored 5 students, peer mentored 3 PhD students in reproducible data analysis.

| 2011-2015 | Undergraduate Researcher   | Various                   |  |
|-----------|--|---------------------------|--|
| 2014-2015 | Undergraduate Research Assistant   | Truman State University   |  |
|           | Development of hydroponic growth chamber phenotyping   | for maize root            |  |
| 2014      | NSF Research Experience for  | Univ. of Connecticut      |  |
|           | Undergraduates   |                           |  |
|           | Measurement of minor spliceosome upregula  | tion implicating role in  |  |
|           | postponing retinal cell death  |                           |  |
| 2013      | Research Experience for Undergraduates   | Univ. of Missouri         |  |
|           | Assessed motor function in mouse model of spinal muscular atrophy with and without oligonucleotide treatment |                           |  |
| 2011      | Laboratory Volunteer   | Missouri State University |  |
|           | Performed a set of genetics labs to check feas   | ibility for a course.     |  |

# Teaching & Mentoring Experience

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2020-2021 Lead Teaching Assistant University of Missouri

Coordinated and led 4 Teaching Assistants during COVID-19 pandemic in adaptation lab materials to accommodate remote learning.

**Developed statistics web application** used by more than 700 students as of 2021 with shiny (<u>source</u>, <u>deployed</u>) for data visualization and fitting frequentist, non-parametric, and Bayesian models.

2018–2020 Teaching Assistant University of Missouri

Tested additional curriculum alterations, tested grade distributions

to identify and adjust for grader effects.

2018 Curriculum Consultant University of Missouri

Updated curriculum and redesigned experiments placing a greater

focus primary literature and data analysis

2015–2016 Teaching Assistant University of Missouri

Provided weekly lectures on relevant background, ensured experiments were conducted safely, provided timely feedback on

assignments.

## Mentoring

| 2024      | Andrew Diaz     | Pilot Mentorship Program (USDA) |
|-----------|-----------------|---------------------------------|
|           |                 | Undergraduate                   |
| 2024      | Henry Bloch     | University of Missouri Student  |
|           |                 | Researcher                      |
| 2022-2024 | Madi Michell    | University of Missouri Student  |
|           |                 | Researcher                      |
| 2021-2024 | Grace Sidberry  | University of Missouri Student  |
|           |                 | Researcher                      |
| 2016-2019 | Abby Beckerdite | University of Missouri Student  |
|           |                 | Researcher                      |
| 2019      | Ayla Ross       | NSF Research Experience for     |
|           |                 | Undergraduates Student          |

| 2018 | Katlyn Sullivan      | NSF Research Experience for         |
|------|----------------------|-------------------------------------|
|      |                      | Undergraduates Student              |
| 2017 | Kelly Hiersche       | NSF Research Experience for         |
|      |                      | Undergraduates Student              |
| 2016 | <b>Rody Kingston</b> | Post baccalaureate Research Student |

# Honors & Awards

| 2023-2025 | <b>NIFA AFRI EWD</b> : \$225,000 awarded (Grant # 2023-67012-39485) to create and environmentally aware deep learning genomic selection models. |
|-----------|---|
| 2022      | First Place Poster Competition, MU Plant Research Symposium   |
| 2019      | J. Perry Gustafson Award for Outstanding Graduate Research in the   |
|           | Life Sciences: \$2,000 award granted for research quality and academic  |
|           | achievements.   |
| 2016-2018 | NIH T32 Training Grant Recipient: \$27,000 yearly stipend awarded to  |
|           | facilitate excellence in graduate research.   |
| 2015      | Cum Laude & President's Recognition, Truman State University  |

# **Professional Activities**

# Associations

| 2023-2025 | Maize Genetic Cooperation Member |
|-----------|----------------------------------|
| 2016-2019 | Society for Neuroscience Member  |

# Workshops & Trainings Conducted

| 2024-Pres. | Coordinator: Deep Learning Community of Practice                                     |  |
|------------|--|--|
|            | Developed curriculum, lectures, and <u>website</u> to develop community of           |  |
|            | USDA and University deep learning practitioners and learners.                        |  |
| 2023       | Creator: Preparing for Interviews: Behavioral, Technical, and Job                    |  |
|            | Search Preparation. Internal professional development workshop                       |  |
|            | attended by ungraduated, graduate, postdoctoral researchers and                      |  |
|            | technicians.   |  |
| 2022       | <b>Assistant</b> : Software Carpentries Data Management with SQL <u>1</u> , <u>2</u> |  |
| 2022       | <b>Instructor</b> : Software Carpentries R for Reproducible Scientific Analysis      |  |
|            | <u>1, 2</u>  |  |
| 2022       | <b>Creator</b> : Tools and Techniques for a Jupyter Based Scientific Workflow        |  |

Created and delivered a workshop on data visualization in Python for

University of Missouri Bioinformatics in Plant Science.

2022 <u>Software Carpentries</u> Certified Instructor

Received theoretical and practical instruction on leading

computational workshops.

## Other Professional Activities

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|---------------|--|
| 2025          | Designed and built the website for the 2025 Maize Genetics Meeting.                    |
|               | Contacted and proposed meeting companion website to the Maize                          |
|               | Genetics Cooperation. Demonstration site using 2024 data is <u>here</u> .              |
| 2020-Pres.    | Authored <b>over 60 technical blog posts</b> to capture and communicate                |
|               | technical knowledge. See this <u>listing</u> and <u>danielkick.com</u> . For a sample, |
|               | consider this post on <u>using simulation to assist statistical intuition</u> .        |
| 2023-Pres.    | Developed static webpage to codify and share protocols and provided                    |
|               | internal training on git and quarto for the same. See <u>Washburn Lab</u>              |
|               | Resources.   |
| 2023          | Panel Member, Non-academic research careers,   |
|               | MU Summer Undergraduate Research Program: Professional Dev.                            |
|               | Mini-Conference  |
| 2023          | Panel Member, Working with your Mentor,  |
|               | MU Summer Undergraduate Research Program: Summer Intern                                |
|               | Orientation  |
| 2022          | Next-Generation Omics Panel Member   |
|               | University of Missouri Division of Biological Sciences Retreat                         |
| 2017          | Workshop Assistant: Computational Neuroscience Models and                              |
|               | Neurobiology   |
|               | NIH BRAIN Initiative Short Course University of Missouri                               |
| 2016          | Workshop Assistant: Computational Neuroscience Models and                              |
|               | Neurobiology   |
|               | NIH BRAIN Initiative Short Course University of Missouri                               |
| 2016          | Scientific Poster Judge  |
|               | Undergraduate Research Forum University of Missouri Division of                        |
|               | Biological Sciences  |
|               |  |

# **Professional Development**

## Workshops & Training

| 2024 | MaizeGDB: Pan-genome and AI resources, Maize Genetics           |
|------|---|
|      | Cooperation   |
| 2024 | Gramene Workshop, Maize Genetics Cooperation                    |
| 2023 | Applications of AlphaFold2 for Studying Proteins, University of |
|      | Missouri  |
| 2023 | APSIM Training Course, Iowa State University                    |
| 2020 | Software Carpentry: Python, University of Missouri              |
| 2016 | Big Data in Biology, University of Austin                       |
|      |   |

#### Mentoring

| 2024 | Maize Genetics Mentoring Program (Mentee) |
|------|---|
| 2022 | MU-Bayer Mentoring Program (Mentee)       |

# **Publications**

### **Published**

- 1. Washburn JD, Varela JI, Xavier A, Chen Q, Ertl D, Gage JL, et al. Global Genotype by Environment Prediction Competition Reveals That Diverse Modeling Strategies Can Deliver Satisfactory Maize Yield Estimates. Genetics. 2024 Nov 22;iyae195.
- 2. Ruppel M, Nelson SK, Sidberry G, Mitchell M, Kick D, Thomas SK, et al. RootBot: High-throughput root stress phenotyping robot. Appl Plant Sci. 2023 Nov;11(6):e11541.
- 3. Kick DR, Washburn JD. Ensemble of best linear unbiased predictor, machine learning and deep learning models predict maize yield better than each model alone. Silico Plants. 2023 Jul 1;5(2):diado15.
- 4. Kick DR, Wallace JG, Schnable JC, Kolkman JM, Alaca B, Beissinger TM, et al. Yield prediction through integration of genetic, environment, and management data through deep learning. G3 GenesGenomesGenetics. 2023 Apr 3;13(4):jkadoo6.
- 5. Kick DR, Schulz DJ. Timing-Dependent Potentiation and Depression of Electrical Synapses Contribute to Network Stability in the Crustacean Cardiac Ganglion. J Neurosci. 2022 Aug 31;42(35):6751–60.

- 6. Northcutt AJ, Kick DR, Otopalik AG, Goetz BM, Harris RM, Santin JM, et al. Molecular profiling of single neurons of known identity in two ganglia from the crab *Cancer borealis*. Proc Natl Acad Sci. 2019 Dec 26;116(52):26980–90.
- 7. Kick DR, Schulz DJ. Studying gap junctions with PARIS. eLife. 2019 Mar 1;8:e45207.
- 8. Lane BJ, Kick DR, Wilson DK, Nair SS, Schulz DJ. Dopamine maintains network synchrony via direct modulation of gap junctions in the crustacean cardiac ganglion. eLife. 2018 Oct 16;7:e39368.
- 9. Kick DR, Schulz DJ. Variability in neural networks. eLife. 2018 Jan 18;7:e34153.
- 10. Willenbrink AM, Gronauer MK, Toebben LF, Kick DR, Wells M, Zhang B. The Hillary Climber trumps manual testing: an automatic system for studying *Drosophila* climbing. J Neurogenet. 2016 Oct 1;30(3–4):205–11.

#### In Review

- 1. Sangjan W, Kick DR, Washburn JD. Improving Plant Breeding Through AI-Supported Data Integration. Expected 2025.
- 2. Dopp D, Samarth P, Wang J, Kick DR, Schulz DJ, Nair SS. Interaction of conductances across compartments that shape output in a model of a bursting neuron in the crustacean cardiac ganglion. Expected 2025

## In Preparation

- Mitchell M, Sidberry G, Mathison M, DeSalvio A, Kick DR, Washburn JD. Drone-Based Identification of Flood-Tolerant Maize via Multispectral Imaging: A Real-World Case Study. Expected 2025
- 2. Thomas SK, Abrahams RS, Walden N, Arias T, Kick DR, McAlvay A, Harkess A, McKain MR, Al-Shehbaz IA, Lens F, Hendriks K, Koch MA, Pires JC, Washburn JD. The Mustard Mayhem: Phylogenetically localizing and dating the mesohexaploidy of the tribe *Brassiceae*. Expected 2025

#### **Published Data**

Accessed December 30th 2024

Views / Downloads

| 2023 | Genomes to Fields Genotype by Environment Prediction (2022)       | 148 / 498 |
|------|---|-----------|
|      | ( <u>Zenodo</u> )   |           |
| 2023 | Ensemble BLUP, Machine Learning, and Deep Learning Models         | 707 / 174 |
|      | Predict Maize Yield Better Than Each Model Alone (Zenodo)         |           |
| 2022 | Yield Prediction Through Integration of Genetic, Environment, and | 190 / 137 |
|      | Management Data Through Deep Learning: Computational Artifacts    |           |
|      | (Zenodo)  |           |
| 2022 | Yield Prediction Through Integration of Genetic, Environment, and | 724 / 275 |
|      | Management Data Through Deep Learning: Cleaned Data               |           |
|      | ( <u>Zenodo</u> )   |           |

## **Presentations**

### **Invited Seminars**

2024 Using AI and ensembling methods to improve plant yield predictions across diverse environments

Daniel Kick\*

University of Georgia, AI in Plant Breeding Symposium, Athens GA

The Promises and Pitfalls of Deep Learning Methods for Plant Phenotype Prediction

Jacob Washburn\* and Daniel Kick\*

Iowa State University Department of Agronomy Plant Breeding Seminar, Invited Seminar, Ames IA

2024 Greater than the Sum of Its Parts:

Better Phenotypic Prediction across Environments by Combining Deep Learning and Statistical Models

Daniel R Kick\* and Jacob D Washburn

Truman State University Biology Department Invited Seminar, Kirksville MO

The Promises and Pitfalls of Deep Learning Methods for Plant Phenotype Prediction

Jacob Washburn\* and Daniel Kick\*

Michigan State University Department of Epidemiology and Biostatistics Invited Seminar, East Lansing MI

## **National Meetings: Presentations**

Maize yield prediction accuracy increased by inclusion of genetics, environment, and management interactions with deep learning Daniel R Kick\*, Jacob D. Washburn
Maize Genetics Meeting

- Improving Maize Yield Prediction through Genetic, Environmental, and Management Factor Interactions with Deep Learning Daniel R Kick\*, Jacob D. Washburn ASA, CSSA and SSSA International Annual Meetings, Baltimore MD
- Yield Prediction Accuracy is Improved Through Incorporating Genetic, Environmental, and Management Interactions with Deep Learning, Daniel R Kick\*, Jacob D. Washburn University of Missouri Interdisciplinary Plant Group Symposium, Columbia MO
- Effects of blockade of K+ currents on membrane conductance and channel expression at 1 hour and 24 hours in motor neurons of the cardiac ganglion. Daniel R Kick\*, Brian J. Lane, David J Schulz.

  Dynamic Neural Networks: The Stomatogastric Nervous System, Virtual
- 2019 Asynchronous voltage activity regulates electrical synapse plasticity.

  Daniel R Kick\*, David J Schulz.

  Dynamic Neural Networks: The Stomatogastric Nervous System, Chicago IL
- Variability from mRNAs to network output in the C. borealis cardiac ganglion.
  Daniel R Kick\*, David J Schulz.

  Dynamic Neural Networks: The Stomatogastric Nervous System, Washington D.C

### **National Meetings: Posters**

- Leveraging Biological Theory in Phenotypic Prediction Models Daniel R Kick\*, Jacob D. Washburn National Association for Plant Breeding
- Ensembles of deep learning, machine learning, and linear models outperform individual models for maize yield prediction in diverse environments

  Daniel R Kick\*, Jacob D. Washburn

  Maize Genetics Meeting
- Maize Yield Prediction Accuracy Increased By Inclusion of Genetics, Environment, and Management Interactions With Deep Learning Daniel R Kick\*, Jacob D. Washburn Plant and Animal Genetics (PAG), San Diego CA
- Improving Maize Yield Prediction through Genetic, Environmental, and Management Factor Interactions with Deep Learning Daniel R Kick\*, Jacob D. Washburn ASA, CSSA and SSSA International Annual Meetings, Baltimore MD

- Loss of synchronous activity across gap junctions results in a phasedependent change in coupling conductance magnitude. Daniel R Kick\*, David J Schulz. Neuroscience, Chicago IL
- Variation across network output, excitatory post synaptic potentials, ionic conductances, and ion channel and receptor mRNAs within motor neurons of the crustacean cardiac ganglion.

  Daniel R Kick\*, Brian J Lane, Joseph L Ransdell, Satish S Nair, David J Schulz. Neuroscience, Washington D.C.
- What crustaceans can teach us about the workings of the nervous system.

  Virginia Garcia, Daniel R Kick\*, Cindy Kyi, Brian J Lane\*, Kwasi M Lett, Adam J
  Northcutt, Joseph L Ransdell, Simone Temporal, and David J Schulz.

  Animal Behavior Society, Columbia MO

### **Local Meetings: Presentations**

- 2024 Lightning Talk: Deep Learning Community of Practice Daniel Kick\* University of Missouri MU Biology Retreat, Columbia MO
- 2024 Lightning Talk: Biologically Informed Modeling
  Daniel Kick\*
  University of Missouri MU Biology Retreat, Columbia MO
- The Quick and Easy Way to Predict Phenotypes More Accurately Daniel R Kick\*, Jacob D. Washburn (2023)
  University of Missouri MU Plant Research Symposium, Columbia MO
- Environmentally Aware Deep Learning: Overcoming Gene by Environment Effects and Enhancing Biological Interpretability
  Daniel R Kick\*, Jacob D Washburn
  University of Missouri DBL Group Meeting, Columbia MO
- Maize Yield Prediction is Improved by Modeling Interactions between Genetic, Environmental, and Management Factors with Deep Learning Daniel R Kick\*, Jacob D Washburn Interdisciplinary Plant Group Seminar "Plant Talks", Columbia MO
- 2019 Classifying neurons from molecular data Daniel R Kick\*, David J Schulz University of Missouri <u>DataPhiles</u>, Columbia MO
- The Cancer borealis Cardiac Ganglion: a Window into Variability and Activity
  Dependent Regulation
  Daniel R Kick\*, David J Schulz
  NIH-T32 progress seminar, Columbia MO

### **Local Meetings: Posters**

- Ensembles of deep learning, machine learning, and linear models outperform individual models for maize yield prediction in diverse environments Daniel R Kick\*, Jacob D. Washburn
  - University of Missouri MU Plant Research Symposium, Columbia MO
- Maize Yield Prediction Accuracy Increased By Inclusion of Genetics, Environment, and Management Interactions With Deep Learning Daniel R Kick\*, Jacob D Washburn
  - University of Missouri MU Plant Research Symposium, Columbia MO
- Yield Prediction Through Integration of Genetic, Environment, and Management Data by Deep Learning Daniel R Kick\*, Jacob D Washburn University of Missouri MU Plant Research Symposium, Columbia MO
- Voltage Dependent Modification of Electrical Synapses and Ionic Conductances Daniel R Kick\*, David I Schulz
  - University of Missouri-Columbia Life Sciences Week, Columbia MO
- 2015 Upregulation of the Minor Spliceosome in Mouse Retinae due to Zaprinast Exposure Daniel R Kick\*, Marybeth Baumgartner, Christopher Lemoine, Devi Krishna
  - Priya Karunakaran, Nikita Sturrock, Amye Black, Rahul Kanadia Truman State University Student Research Conference, Kirksville MO
- 2014 Upregulation of the Minor Spliceosome in Mouse Retinae due to Zaprinast Exposure Daniel R Kick\*, Marybeth Baumgartner, Christopher Lemoine, Devi Krishna
  - Daniel R Kick\*, Marybeth Baumgartner, Christopher Lemoine, Devi Krishn Priya Karunakaran, Nikita Sturrock, Amye Black, Rahul Kanadia University of Connecticut Summer Undergraduate Research Conference, Storrs CT
- 2013 Effective Gene Therapy in Spinal Muscular Atrophy: Utilizing Antisense Oligonucleotides Targeting Intronic Repressor Element1
  Daniel R Kick\*, Eric Osman, Christian Lorson
  University of Missouri Summer Undergraduate Research Conference,
  Columbia MO

#### Outreach & Miscellaneous: Presentations

Rootbot, Rover, Drones, and Deep Learning 2023 Daniel R Kick\*, Shawn Thomas\* University of Missouri Biology DataBlitz, Columbia MO Maize Yield Prediction is Improved by using Deep Learning to Incorporate 2022 Interactions between Genetic, Environmental, and Management Factors. Daniel R Kick\*, Jacob D Washburn USDA-ARS AgriCulture Series, Virtual From Neurobiologist to Research Geneticist 2022 Daniel R Kick\* Beyond the PhD (beyond-the-phd.com), Virtual Spare the synapse, spoil the circuit, Public presentation 2019 Daniel R Kick\* Science on Tap, Columbia MO Can mRNA expression recapitulate neuron cell types 2019 Daniel R Kick\* Truman State University Alumni Research Presentation, Kirksville MO Gap Junction Conductance Modulation Via Voltage 2018 Daniel R Kick\* Truman State University Alumni Research Presentation, Kirksville MO Please mind the gap: Network homeostatic plasticity in the Cancer borealis 2017

2017 Please mind the gap: Network homeostatic plasticity in the Cancer boreali cardiac ganglion

Daniel R Kick\*

Truman State University Alumni Research Presentation, Kirksville MO

The Tell-Tale Heart: Applying crustacean neurogenic hearts to basic neurosciences questions
Daniel R Kick\*

Truman State University Alumni Research Presentation, Kirksville MO

#### Outreach & Miscellaneous: Posters

Maize Yield Prediction Accuracy Increased By Inclusion of Genetics,
 Environment, and Management Interactions With Deep Learning
 Daniel R Kick\*, Jacob D. Washburn
 University of Missouri Graduate Student Recruitment, Columbia MO
 Voltage Dependent modification of Electrical Synapses
 Daniel R Kick\*
 University of Missouri Biological Sciences Recruitment, Columbia MO