Computational & Data Sciences

The Division of Computational & Data Sciences (DCDS) at Washington University in St. Louis trains students interested in problems from across a range of disciplines that share a common reliance on data and computing.

The introduction of now-standard tools from statistical analysis and hypothesis testing transformed the practice of natural and social science in the mid-20th century. Emerging tools from computational and data science have the potential to bring about an even larger transformation of scientific practice, especially in the social sciences. The questions raised by data generated by and about human behavior are engaging and profound. However, many if not most of these questions can only be tackled using a multidisciplinary approach that combines a deep knowledge of the capabilities and operation of data science techniques with the domain expertise needed to apply them effectively to the problems under consideration.

Doctoral students in Computational & Data Sciences receive strong methodological training in modern computational and statistical methods, and they also acquire expertise in a particular social science application area.

The program is inherently interdisciplinary and brings together leading experts from across the university who are using data to solve some of the greatest challenges that our world faces today. Faculty include both data and computing experts as well as domain experts from different application areas.

Faculty

**Deanna Barch** ([psych.wustl.edu/people/deanna-barch](https://psych.wustl.edu/people/deanna-barch))
Professor and Chair, Psychological & Brain Sciences
PhD, University of Illinois

**Michael Bechtel** ([artsci.wustl.edu/faculty-staff/michael-m-bechtel](https://artsci.wustl.edu/faculty-staff/michael-m-bechtel))
Associate Professor, Political Science
PhD, University of Konstanz

**Ryan Bogdan** ([psych.wustl.edu/people/ryan-bogdan](https://psych.wustl.edu/people/ryan-bogdan))
Associate Professor, Psychological & Brain Sciences
PhD, Harvard University

**Todd Braver** ([psych.wustl.edu/people/todd-braver](https://psych.wustl.edu/people/todd-braver))
Professor, Psychological & Brain Sciences, Radiology, and Neuroscience
PhD, Carnegie Mellon University

**Derek Brown** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Derek-Brown.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Derek-Brown.aspx))
Associate Professor, Brown School
PhD, Duke University

**Sanmay Das** ([engineering.wustl.edu/Profiles/Pages/Sanmay-Das.aspx](https://engineering.wustl.edu/Profiles/Pages/Sanmay-Das.aspx))
Track Chair, Computational Methodologies
Associate Professor, Computer Science & Engineering
PhD, Massachusetts Institute of Technology

**Brett Drake** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Brett-Drake.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Brett-Drake.aspx))
Professor, Brown School
PhD, UCLA

**Christine Ekenga** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Christine-Ekenga.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Christine-Ekenga.aspx))
Assistant Professor, Brown School
PhD, New York University

**Patrick Fowler** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Patrick-Fowler.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Patrick-Fowler.aspx))
Track Chair, Social Work & Public Health
Associate Professor, Brown School
PhD, Wayne State University

**Roman Garnett** ([engineering.wustl.edu/Profiles/Pages/Roman-Garnett.aspx](https://engineering.wustl.edu/Profiles/Pages/Roman-Garnett.aspx))
Assistant Professor, Computer Science & Engineering
PhD, University of Oxford

**Chris Gill** ([engineering.wustl.edu/Profiles/Pages/Christopher-Gill.aspx](https://engineering.wustl.edu/Profiles/Pages/Christopher-Gill.aspx))
Professor, Computer Science & Engineering
DSc, Washington University in St. Louis

**Shenyang Guo** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Shenyang-Guo.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Shenyang-Guo.aspx))
Professor, Brown School
PhD, University of Michigan - Ann Arbor

**Ross Hammond** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Ross-Hammond.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Ross-Hammond.aspx))
Associate Professor, Brown School
PhD, University of Michigan

**Jenine Harris** ([brownschool.wustl.edu/Faculty-and-Research/Pages/Jenine-Harris.aspx](https://brownschool.wustl.edu/Faculty-and-Research/Pages/Jenine-Harris.aspx))
Associate Professor, Brown School
PhD, Saint Louis University

**CJ Ho** ([cse.wustl.edu/faculty/Pages/faculty.aspx?bio=116](https://cse.wustl.edu/faculty/Pages/faculty.aspx?bio=116))
Assistant Professor, Computer Science & Engineering
PhD, University of California, Los Angeles


**Degree Requirements**

**PhD in Computational & Data Sciences**

Upon joining the PhD program, each student is assigned an initial adviser from the DCDS faculty. This adviser meets with the student to assess their background and to advise them on course selection. Immediately prior to each fall semester (starting in 2019), DCDS faculty conduct a “boot camp” in

---

Peter Hovmand (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Peter-Hovmand.aspx)
Professor of Practice, Brown School
PhD, Michigan State University

Josh Jackson (https://psych.wustl.edu/people/joshua-jackson)
Associate Professor, Psychological & Brain Sciences
PhD, University of Illinois, Urbana-Champaign

Kim Johnson (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Kimberly-Johnson.aspx)
Associate Professor, Brown School
PhD, University of Minnesota

Melissa Jonson-Reid (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Melissa-Jonson-Reid.aspx)
Professor, Brown School
PhD, University of California, Berkeley

Assistant Professor, Computer Science & Engineering
PhD, Massachusetts Institute of Technology

Caitlin Kelleher (https://engineering.wustl.edu/Profiles/Pages/Caitlin-Kelleher.aspx)
Associate Professor, Computer Science & Engineering
PhD, Carnegie Mellon University

Matt Kreuter (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Matthew-Kreuter.aspx)
Professor, Social Work & Public Health
PhD, University of North Carolina, Chapel Hill

Calvin Lai (https://psych.wustl.edu/people/calvin-lai)
Assistant Professor, Psychological & Brain Sciences
PhD, University of Virginia

Christopher Lucas (http://polisci.wustl.edu/faculty/christopher-lucas)
Assistant Professor, Political Science
PhD, Harvard University

Professor, Brown School
PhD, University of Illinois

Andrew D. Martin (http://polisci.wustl.edu/faculty/andrew-martin)
Professor, Political Science and Law
Chancellor-Elect, Washington University in St. Louis
PhD, Washington University in St. Louis

Timothy McBride (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Timothy-McBride.aspx)
Professor, Brown School
PhD, University of Wisconsin - Madison

Jacob Montgomery (http://polisci.wustl.edu/faculty/jacob-montgomery)
Track Chair, Political Science
Associate Professor, Political Science
PhD, Duke University

Alvitta Ottley (https://engineering.wustl.edu/Profiles/Pages/Alvitta-Ottley.aspx)
Assistant Professor, Computer Science & Engineering
PhD, Tufts University

Andrew Reeves (http://www.andrewreeves.org)
Associate Professor, Political Science
PhD, Harvard University

Guillermo Rosas (http://polisci.wustl.edu/guillermo_rosas)
Associate Professor, Political Science
PhD, Duke University

Deborah Salvo (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Deborah-Salvo.aspx)
Assistant Professor, Brown School
PhD, Emory University

Betsy Sinclair (http://polisci.wustl.edu/faculty/betsy-sinclair)
Professor, Political Science
PhD, California Institute of Technology

Joe Steensma (https://brownschool.wustl.edu/Faculty-and-Research/Pages/Joseph-Steensma.aspx)
Professor of Practice, Brown School
EdD, Indiana Wesleyan University

Yevgeniy Vorobeychik (https://engineering.wustl.edu/Profiles/Pages/Yevgeniy-Vorobeychik.aspx)
Associate Professor
Computer Science & Engineering
PhD, University of Michigan

William Yeoh (https://engineering.wustl.edu/Profiles/Pages/William-Yeoh.aspx)
Assistant Professor
Computer Science & Engineering
PhD, University of Southern California

Jeffrey Zacks (https://psych.wustl.edu/people/jeffrey-zacks)
Track Chair, Psychological & Brain Sciences
Professor and Associate Chair, Psychological & Brain Sciences
PhD, Stanford University
mathematics, statistics and programming to help bring incoming students up to the level needed to succeed in the initial course work and the program.

All students complete a common core curriculum as well as a domain depth requirement in a social science area. The focus of the first year is on acquiring a common set of tools and an understanding of the ranges and types of problems students may work on as they progress through the program. The entire incoming cohort takes a unique two-semester seminar sequence solely for DCDS students, which includes both general topics and a series of data-driven dives into the types of research questions that may be encountered in each of the domain areas.

In addition, students will be exposed to research in different areas through “rotations” that start in November of their first year. By the end of the summer following their first year, each student will put together an advisory committee of at least two DCDS faculty members (preferably from different tracks) and identify the specific track in which they plan to do research and pursue their degree.

Curriculum

Required Core Courses (24 credit hours)

- **CSE 502 (3 credits):** This is an existing fundamental course in algorithms and data structures, including significant implementation in an object-oriented programming language (currently Java). We expect that many students will already have this background; the course is intended as a pathway for students with very little computational training.

- **Quantitative Methods (QM) I and II (6 credits):** This two-semester sequence covers essential probability and statistics, including hypothesis testing, inference and experimental methodology using a modern statistical computing language like R. The introductory courses offered by the departments of Psychological & Brain Sciences (PBS 5066) and Political Science (PS 581) will be cross-listed and count for QM I credit. QM II is a course that includes maximum-likelihood methods, Bayesian and nonparametric models, generalized linear models and sampling techniques. The course is currently taught as Political Science 582 and will be cross-listed across participating departments.

- **CSE 5XX: “Data Wrangling”:** We are in a new era in terms of the volume and modalities of data generated by efforts to measure human behavior. This will be a new cross-listed course that introduces students to the tools and techniques used to collect, maintain and process large-scale data sets of the kind generated in the course of studying people and social systems.

- **Machine Learning I and II: CSE 417T and 517A (3 credits):** This is a two-semester sequence in machine learning. Together, the two courses cover the fundamental principles of supervised learning, including generalization, overfitting, regularization, cross-validation, model selection, core ML techniques and algorithms, including linear models like logistic regression, gradient descent, tree-based and ensemble methods, kernel methods, deep neural networks and topics in unsupervised learning.

- **Computational and Data Sciences (CDS) Seminar I and II (6 credits):** This two-semester seminar sequence is cross-listed across participating departments and team-taught by participating faculty.
  - **CDS Seminar I** will be structured around topics and ideas that do not need detailed specific-content background. The topics covered will include ethics, the nature of research, robustness and reproducibility of research, and presentations from across the different areas of interest to give students an understanding of research in human and social data analytics across the university.
  - **CDS Seminar II** will be structured as a series of deep dives into data-driven approaches in each of the domain areas, including a module on computational methodologies. In each of these modules, the students will either be given a specific data set to investigate or a specific hands-on task to complete (e.g., developing a visualization, assessing how easy a computational tool is for social scientists to use). Students will work in teams on these projects.

Domain Depth Tracks

Students will choose one of four focus tracks: Political Science, Psychological & Brain Sciences, Social Work & Public Health, or Computational Methodologies. Depending on the track, students must complete the following domain depth requirements:

1. **Political Science track:** Students must complete three substantive classes in one subfield (e.g., American politics, comparative politics, international relations) from a specified list for each subfield as well as a research design course (PS 540).
2. **Psychological & Brain Sciences track:** Students must complete three substantive classes in one subfield (e.g., brain, behavior and cognition, clinical science, social/personality, development and aging). With permission, students may substitute the Psychological & Brain Sciences Research Methods Course (PBS 5011) for one of the substantive classes, depending on their background in psychological science.
3. **Social Work & Public Health track:** Students must complete a three-course core doctoral seminar series, including conceptual foundations of social science, advanced research methods, and a theory seminar, either in public health or social work. Students will also be required to take an advanced substantive course from an approved list in their area of interest.
4. **Computational Methodologies track**: Students must take CSE 541T Advanced Algorithms and either CSE 511A Introduction to Artificial Intelligence or CSE 515T Bayesian Methods in Machine Learning. In addition, students must take two substantive classes in their area of interest (i.e., political science, psychological & brain sciences, or social work & public health) from among the classes acceptable for students in that track as noted above.

### Sample Curriculum

A typical progression of classes is described below, with separate examples for students who enter with and without more extensive computational backgrounds.

#### Students Without Much Computer Science Background

<table>
<thead>
<tr>
<th>Units</th>
<th>Fall</th>
<th>Spring</th>
</tr>
</thead>
<tbody>
<tr>
<td>First Year</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Data Structures and Algorithms (CSE 502N)</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>Quantitative Methods I</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>CDS Seminar I</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>Introduction to Machine Learning (CSE 417T)</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>Data Wrangling</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>CDS Seminar II</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>9</td>
<td>9</td>
<td></td>
</tr>
<tr>
<td>Second Year</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Quantitative Methods II</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>Domain course</td>
<td>3</td>
<td>3</td>
</tr>
<tr>
<td>Domain course or elective</td>
<td>3</td>
<td>3</td>
</tr>
<tr>
<td>Machine Learning (CSE 517A)</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>9</td>
<td>9</td>
<td></td>
</tr>
</tbody>
</table>

#### Students With More Computer Science Background

<table>
<thead>
<tr>
<th>Units</th>
<th>Fall</th>
<th>Spring</th>
</tr>
</thead>
<tbody>
<tr>
<td>First Year</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Introduction to Machine Learning (CSE 417T) or domain course</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>Quantitative Methods I</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>CDS Seminar I</td>
<td>3</td>
<td>—</td>
</tr>
<tr>
<td>Introduction to Machine Learning (CSE 417T) or domain course</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>Data Wrangling</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>CDS Seminar II</td>
<td>—</td>
<td>3</td>
</tr>
<tr>
<td>9</td>
<td>9</td>
<td></td>
</tr>
<tr>
<td>Second Year</td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

### Further Requirements

Additional requirements for this program are as follows:

- A minimum of 72 credit hours beyond the bachelor’s level, with a minimum of 37 being course credits (including the core curriculum)
- A minimum of 24 credit hours of doctoral dissertation research
- Students must maintain a cumulative average grade of B (3.0 grade-point average) for all 72 credit hours.
- Required courses must be completed with no more than one grade below a B-.
- Up to 24 graduate credit hours may be transferred with the approval of the Graduate Studies Committee, chaired by the director of graduate studies.

In addition to fulfilling the course and research credit requirements, students must do the following:

- Complete at least two three-month-long research rotations.
- Pass a qualifying exam.
- Successfully defend a thesis proposal.
- Present and successfully defend a dissertation.
- Complete a teaching requirement consisting of two semesters of mentored teaching experience.