## COMPUTER SCIENCE

Courses offered by the Department of Computer Science are listed under the subject code CS on the Stanford Bulletin's ExploreCourses web site.

The Department of Computer Science (CS) operates and supports computing facilities for departmental education, research, and administration needs. All CS students have access to the departmental student machine for general use (mail, news, etc.), as well as computer labs with public workstations located in the Gates Building. In addition, most students have access to systems located in their research areas.

Each research group in Computer Science has systems specific to its research needs. These systems include workstations (PCs, Macs), multi-CPU computer clusters, and local mail and file servers. Servers and workstations running Linux or various versions of Windows are commonplace. Support for course work and instruction is provided on systems available through U (http://itservices.stanford.edu)niversity IT (https://uit.stanford.edu) (UIT) and the School of Engineering (http:// engineering.stanford.edu) (SoE).

## Mission of the Undergraduate Program in Computer Science

The mission of the undergraduate program in Computer Science is to develop students' breadth of knowledge across the subject areas of computer science, including their ability to apply the defining processes of computer science theory, abstraction, design, and implementation to solve problems in the discipline. Students take a set of core courses. After learning the essential programming techniques and the mathematical foundations of computer science, students take courses in areas such as programming techniques, automata and complexity theory, systems programming, computer architecture, analysis of algorithms, artificial intelligence, and applications. The program prepares students for careers in government, law, and the corporate sector, and for graduate study.

## Learning Outcomes (Undergraduate)

The department expects undergraduate majors in the program to be able to demonstrate the following learning outcomes. These learning outcomes are used in evaluating students and the department's undergraduate program. Students are expected to be able to:

1. Apply the knowledge of mathematics, science, and engineering.
2. Design and conduct experiments, as well to analyze and interpret data.
3. Design a system, component, or process to meet desired needs within realistic constraints such as economic, environmental, social, political, ethical, health and safety, manufacturability, and sustainability.
4. Function on multidisciplinary teams.
5. Identify, formulate, and solve engineering problems.
6. Understand professional and ethical responsibility.
7. Communicate effectively.
8. Understand the impact of engineering solutions in a global, economic, environmental, and societal context.
9. Demonstrate a working knowledge of contemporary issues.
10. Apply the techniques, skills, and modern engineering tools necessary for engineering practice.
11. Transition from engineering concepts and theory to real engineering applications.

## Learning Outcomes (Graduate)

The purpose of the master's program is to provide students with the knowledge and skills necessary for a professional career or doctoral studies. This is done through course work in the foundational elements of the field and in at least one graduate specialization. Areas of specialization include artificial intelligence, biocomputation, computer and network security, human-computer interaction, information management and analytics, mobile and internet computing, real-world computing, software theory, systems, and theoretical computer science.

The Ph.D. is conferred upon candidates who have demonstrated substantial scholarship and the ability to conduct independent research. Through course work and guided research, the program prepares students to make original contributions in Computer Science and related fields.

## Graduate Programs in Computer Science

The University's basic requirements for the M.S. and Ph.D. degrees are discussed in the "Graduate Degrees (http://exploredegrees.stanford.edu/ graduatedegrees)" section of this bulletin.

## Computer Science Course Catalog Numbering System

The first digit of a CS course number indicates its general level of sophistication:

| Digit | Description |
| :--- | :--- |
| 001-099 | Service courses for nontechnical <br> majors |
| $100-199$ | Other service courses, basic <br> undergraduate |
| 200-299 | Advanced undergraduate/beginning <br> graduate |
| $300-399$ | Advanced graduate |
| $400-499$ | Experimental |
| $500-599$ | Graduate seminars |

The tens digit indicates the area of Computer Science it addresses:

| Digit | Description |
| :--- | :--- |
| $00-09$ | Introductory, miscellaneous |
| $10-19$ | Hardware and Software Systems |
| $20-39$ | Artificial Intelligence |
| $40-49$ | Software Systems |
| $50-59$ | Mathematical Foundations of |
|  | Computing |
| $60-69$ | Analysis of Algorithms |
| $70-79$ | Computational Biology and <br>  <br> $90-99$ |

## Bachelor of Science in Computer Science

The department offers both a major in Computer Science and a minor in Computer Science. Further information is available in the Handbook for Undergraduate Engineering Programs published by the School of Engineering. The Computer Science major offers a number of tracks (programs of study) from which students can choose, allowing them to focus their program on the areas of most interest. These tracks also reflect the broad diversity of areas in computing disciplines. The department has an honors program.

In addition to Computer Science itself, Stanford offers several interdisciplinary degrees with a substantial computer science component. The Symbolic Systems major (in the School of Humanities and Sciences) offers an opportunity to explore computer science and its relation to linguistics, philosophy, and psychology. The Mathematical and Computational Sciences major (also Humanities and Sciences) allows students to explore computer science along with more mathematics, statistics, and operations research.

## Computer Science (CS)

Completion of the undergraduate program in Computer Science leads to the conferral of the Bachelor of Science in Computer Science.

## Mission of the Undergraduate Program in Computer Science

The mission of the undergraduate program in Computer Science is to develop students' breadth of knowledge across the subject areas of computer science, including their ability to apply the defining processes of computer science theory, abstraction, design, and implementation to solve problems in the discipline. Students take a set of core courses. After learning the essential programming techniques and the mathematical foundations of computer science, students take courses in areas such as programming techniques, automata and complexity theory, systems programming, computer architecture, analysis of algorithms, artificial intelligence, and applications. The program prepares students for careers in government, law, the corporate sector, and for graduate study.

## Requirements

| Mathematics (26 units minimum)- |  |  |
| :--- | :--- | :--- |
| CS 103 | Mathematical Foundations of Computing | 5 |
| CS 109 | Introduction to Probability for Computer Scientists | 5 |
| MATH 19 $^{\text {MATH 20 }}$ | Calculus $^{1}$ | 3 |
| Calculus $^{1}$ | 3 |  |
| MATH 21 | Calculus $^{1}$ | 4 |

Plus two electives ${ }^{2}$
Science (11 units minimum)-

| PHYSICS 41 | Mechanics | 4 |
| :--- | :--- | :--- |
| PHYSICS 43 | Electricity and Magnetism | 4 |
| Science elective $^{3}$ | 3 |  |

## Technology in Society (3-5 units)-

One course; course chosen must be on the SoE Approved Courses list at <ughb.stanford.edu> the year taken; see Basic Requirements 4 in the School of Engineering section

Engineering Fundamentals (13 units minimum; see Basic Requirement 3 in the School of Engineering section) -

| CS 106B | Programming Abstractions | 5 |
| :--- | :--- | ---: |
| or CS 106X | Programming Abstractions (Accelerated) |  |
| ENGR 40M | An Intro to Making: What is EE (or ENGR 40A and | $3-5$ |
|  | ENGR 40B) |  |

Fundamentals Elective (May be an ENGR fundamentals or an 3-5 additional CS Depth course. See Fig. 3-4 in the UGHB for approved ENGR fundamentals list. May not be any CS 106)
*Students who take ENGR 40A or 40M for fewer than 5 units are required to take 1-2 additional units of ENGR Fundamentals (13 units minimum), or 1-2 additional units of Depth ( 27 units minimum for track and elective courses).

## Writing in the Major-

Select one of the following:

| CS 181W | Computers, Ethics, and Public Policy |
| :--- | :--- |
| CS 191W | Writing Intensive Senior Project |
| CS 194W | Software Project |
| CS 210B | Software Project Experience with Corporate <br> Partners |
| CS 294W | Writing Intensive Research Project in Computer <br> Science |


| Computer Science Core (15 units)- |  |  |
| :--- | :--- | :--- |
| CS 107 | Computer Organization and Systems | 5 |
| or CS 107E | Computer Systems from the Ground Up |  |
| CS 110 | Principles of Computer Systems | 5 |
| CS 161 | Design and Analysis of Algorithms | 5 |

## Senior Project (3 units)-

| CS 191 | Senior Project |
| :--- | :--- |
| CS 191W | Writing Intensive Senior Project |
| CS 194 | Software Project |
| CS 194H | User Interface Design Project |
| CS 194W | Software Project |
| CS 210B | Software Project Experience with Corporate <br> Partners |
| CS 294 | 6 |
| or CS 294W | Writing Intensive Research Project in Computer <br> Science |

## Computer Science Depth B.S.

Choose one of the following ten CS degree tracks (a track must consist of at least 25 units and 7 classes):

## Artificial Intelligence Track-

|  |  |
| :--- | :--- |
| CS 221 | Artificial Intelligence: Principles and Techniques |$\quad 4$


| CS 205A | Mathematical Methods for Robotics, Vision, and <br> Graphics |
| :--- | :--- |
| STATS 315A | Modern Applied Statistics: Learning |
| STATS 315B | Modern Applied Statistics: Data Mining |
| Vision: |  |
| CS 231B |  |
| CS 231M |  |
| CS 331A |  |
| Comp Bio: |  |
| CS 262 |  |
| CS 279 | Computational Biology: Structure and Organization <br> of Biomolecules and Cells |
| CS 371 | Computational Biology in Four Dimensions |
| CS 374 | Information and the Web: |
| CS 276 | Information Retrieval and Web Search |
| CS 224W | Analysis of Networks |

## Biocomputation Track-

| The Mathematics, Science, and Engineering Fundamentals requirements are non-standard for this track. See Handbook for Undergraduate Engineering Programs for details. |  |  |
| :---: | :---: | :---: |
| Select one of | following: | 3-4 |
| CS 221 | Artificial Intelligence: Principles and Techniques |  |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques |  |
| CS 229 | Machine Learning |  |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition |  |
| Select one of the following: |  |  |
| CS 262 |  |  |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving |  |
| CS 273A | The Human Genome Source Code |  |
| CS 274 | Representations and Algorithms for Computationa Molecular Biology |  |
| CS 275 | Translational Bioinformatics |  |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells |  |
| One additional course from the lists above or the following: |  | 3-4 |
| CS 124 | From Languages to Information |  |
| CS 145 | Introduction to Databases |  |
| CS 147 | Introduction to Human-Computer Interaction Design |  |
| CS 148 | Introduction to Computer Graphics and Imaging |  |
| CS 248 | Interactive Computer Graphics |  |
| One course selected from the following: |  | 3-4 |
| CS 108 | Object-Oriented Systems Design | 3-4 |
| CS 124 | From Languages to Information | 3-4 |
| CS 131 | Computer Vision: Foundations and Applications | 3-4 |
| CS 140 | Operating Systems and Systems Programming | 3-4 |
| or CS 140E | Operating systems design and implementation |  |
| CS 142 | Web Applications | 3 |
| CS 143 | Compilers | 3-4 |
| CS 144 | Introduction to Computer Networking | 3-4 |
| CS 145 | Introduction to Databases | 3-4 |
| CS 147 | Introduction to Human-Computer Interaction Design | 3-5 |
| CS 148 | Introduction to Computer Graphics and Imaging | 3-4 |
| CS 149 | Parallel Computing | 3-4 |
| CS 154 | Introduction to Automata and Complexity Theory | 3-4 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| or PHIL 151 | Metalogic |  |
| CS 164 |  |  |
| CS 166 | Data Structures | 3-4 |
| CS 167 |  |  |
| CS 168 | The Modern Algorithmic Toolbox | 3-4 |
| CS 190 |  |  |
| CS 205A | Mathematical Methods for Robotics, Vision, and Graphics | 3 |
| CS 205B | Mathematical Methods for Fluids, Solids, and Interfaces | 3 |
| CS 210A | Software Project Experience with Corporate Partners | 3-4 |


| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| :---: | :---: | :---: |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | 3-4 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 224U | Natural Language Understanding | 3-4 |
| CS 224W | Analysis of Networks | 3-4 |
| CS 225A | Experimental Robotics | 3 |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques | 3-4 |
| CS 229 | Machine Learning | 3-4 |
| CS 229T | Statistical Learning Theory | 3 |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition | 3-4 |
| CS 231B |  |  |
| CS 231M |  |  |
| CS 231N | Convolutional Neural Networks for Visual Recognition | 3-4 |
| CS 232 | Digital Image Processing | 3 |
| CS 233 | Geometric and Topological Data Analysis | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 238 | Decision Making under Uncertainty | 3-4 |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240H |  |  |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | 3-4 |
| CS 244 | Advanced Topics in Networking | 3-4 |
| CS 244B | Distributed Systems | 3 |
| CS 245 | Database Systems Principles | 3 |
| CS 246 | Mining Massive Data Sets | 3-4 |
| CS 247 | Human-Computer Interaction Design Studio | 3-4 |
| CS 248 | Interactive Computer Graphics | 3-4 |
| CS 249A |  |  |
| CS 251 | Bitcoin and Crypto Currencies | 3 |
| CS 254 | Computational Complexity | 3 |
| CS 255 | Introduction to Cryptography | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 262 |  |  |
| CS 263 | Algorithms for Modern Data Models | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  |  |
| CS 267 | Graph Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving | 3 |
| CS 272 | Introduction to Biomedical Informatics Research Methodology | 3-5 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 273B | Deep Learning in Genomics and Biomedicine | 3 |
| CS 274 | Representations and Algorithms for Computational Molecular Biology |  |
| CS 275 | Translational Bioinformatics | 4 |
| CS 276 | Information Retrieval and Web Search | 3 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CS 348B | Computer Graphics: Image Synthesis Techniques | 3-4 |
| CS 348C | Computer Graphics: Animation and Simulation | 3 |


| CS 371 | Computational Biology in Four Dimensions | 3 |
| :---: | :---: | :---: |
| CS 374 |  |  |
| CME 108 | Introduction to Scientific Computing | 3 |
| EE 180 | Digital Systems Architecture | 4 |
| EE 263 | Introduction to Linear Dynamical Systems | 3 |
| EE 282 | Computer Systems Architecture | 3 |
| EE 364A | Convex Optimization I | 3 |
| BIOE 101 | Systems Biology | 3 |
| MS\&E 152 | Introduction to Decision Analysis | 3-4 |
| MS\&E 252 | Decision Analysis I: Foundations of Decision Analysis | 3-4 |
| STATS 206 | Applied Multivariate Analysis | 3 |
| STATS 315A | Modern Applied Statistics: Learning | 2-3 |
| STATS 315B | Modern Applied Statistics: Data Mining | 2-3 |
| BMI 231 |  |  |
| BMI 260 |  |  |
| GENE 211 | Genomics | 3 |
| One course from the following: |  | 3-5 |
| CS 145 | Introduction to Databases | 3-4 |
| CS 147 | Introduction to Human-Computer Interaction Design | 3-5 |
| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques | 3-4 |
| CS 229 | Machine Learning | 3-4 |
| CS 262 |  |  |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving | 3 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 273B | Deep Learning in Genomics and Biomedicine | 3 |
| CS 274 | Representations and Algorithms for Computational 3 Molecular Biology | -4 |
| CS 275 | Translational Bioinformatics | 4 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CS 371 | Computational Biology in Four Dimensions | 3 |
| CS 373 | Statistical and Machine Learning Methods for Genomics | 3 |
| CS 374 |  |  |
| EE 263 | Introduction to Linear Dynamical Systems | 3 |
| EE 364A | Convex Optimization I | 3 |
| MS\&E 152 | Introduction to Decision Analysis | 3-4 |
| MS\&E 252 | Decision Analysis I: Foundations of Decision Analysis | 3-4 |
| STATS 206 | Applied Multivariate Analysis | 3 |
| STATS 315A | Modern Applied Statistics: Learning | 2-3 |
| STATS 315B | Modern Applied Statistics: Data Mining | 2-3 |
| BMI 231 |  |  |
| BMI 260 |  |  |
| GENE 211 | Genomics | 3 |
| One course selected from the list above or the following: |  |  |
| BIOE 222A |  |  |
| BIOE 222B |  |  |
| CHEMENG 150 | Biochemical Engineering | 3 |
| CHEMENG 174 | Environmental Microbiology I | 3 |
| APPPHYS 294 | Cellular Biophysics | 3 |
| BIO 104 | Advanced Molecular Biology | 5 |
| BIO 118 | Genetic Analysis of Biological Processes | 4 |


| BIO 129A |  |  |
| :---: | :---: | :---: |
| BIO 129B |  |  |
| BIO 188 |  |  |
| BIO 189 |  |  |
| BIO 214 | Advanced Cell Biology | 4 |
| BIO 217 |  |  |
| BIO 230 | Molecular and Cellular Immunology | 4 |
| CHEM 135 |  |  |
| CHEM 171 | Physical Chemistry I | 4 |
| BIOC 218 |  |  |
| BIOC 241 | Biological Macromolecules 3-5 | 3-5 |
| SBIO 228 |  |  |
| One course from the following: |  |  |
| BIOE 220 | Introduction to Imaging and Image-based Human Anatomy | 3 |
| BIOE 222A |  |  |
| BIOE 222B |  |  |
| CHEMENG 150 | Biochemical Engineering | 3 |
| CHEMENG 174 | Environmental Microbiology I | 3 |
| CS 262 |  |  |
| CS 274 | Representations and Algorithms for Computational 3 Molecular Biology |  |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CS 371 | Computational Biology in Four Dimensions | 3 |
| CS 374 |  |  |
| ME 281 | Biomechanics of Movement | 3 |
| APPHYS 294 |  |  |
| BIO 104 | Advanced Molecular Biology | 5 |
| BIO 112 | Human Physiology | 4 |
| BIO 118 | Genetic Analysis of Biological Processes | 4 |
| BIO 129A |  |  |
| BIO 129B |  |  |
| BIO 158 | Developmental Neurobiology | 4 |
| BIO 183 | Theoretical Population Genetics | 3 |
| BIO 188 |  |  |
| BIO 189 |  |  |
| BIO 214 | Advanced Cell Biology | 4 |
| BIO 217 |  |  |
| BIO 230 | Molecular and Cellular Immunology | 4 |
| CHEM 135 |  |  |
| CHEM 171 | Physical Chemistry I | 4 |
| BIOC 218 |  |  |
| BIOC 241 | Biological Macromolecules 3-5 | 3-5 |
| DBIO 210 | Developmental Biology | 4 |
| GENE 211 | Genomics | 3 |
| SBIO 228 |  |  |
| SURG 101 | Regional Study of Human Structure | 5 |

## Computer Engineering Track-

For this track there is a 10 unit minimum for ENGR Fundamentals and a 31 unit minimum for Depth (for track and elective courses)
EE 108 Digital System Design $\quad$ 6-8
\& EE 180 and Digital Systems Architecture
Select two of the following: 8

EE 101B Circuits II
EE 102A Signal Processing and Linear Systems I
EE 102B Signal Processing and Linear Systems II
Satisfy the requirements of one of the following concentrations:

1) Digital Systems Concentration

CS 140 Operating Systems and Systems Programming
or CS 140E or C
EE 109 Digital Systems Design Lab
EE 271 Introduction to VLSI Systems
Plus two of the following (6-8 units):
CS $140 \quad$ Operating Systems and Systems Programming (if not counted above)
or CS 140 E or C
CS 144 Introduction to Computer Networking
CS 149 Parallel Computing
CS 190
CS 240E
CS 244 Advanced Topics in Networking
EE 273 Digital Systems Engineering
EE 282 Computer Systems Architecture
2) Robotics and Mechatronics Concentration

CS 205A Mathematical Methods for Robotics, Vision, and Graphics
CS 223A Introduction to Robotics
ME 210 Introduction to Mechatronics
ENGR 105 Feedback Control Design
Plus one of the following (3-4 units):
CS 225A Experimental Robotics
CS 231A Computer Vision: From 3D Reconstruction to Recognition
ENGR 205 Introduction to Control Design Techniques
ENGR 207B Linear Control Systems II
3) Networking Concentration

CS $140 \quad$ Operating Systems and Systems Programming
\& CS 144 and Introduction to Computer Networking (CS 140E can substitute for CS 140)
Plus three of the following (9-11 units):
CS 240 Advanced Topics in Operating Systems
CS 240E
CS 241 Embedded Systems Workshop
CS 244 Advanced Topics in Networking
CS 244B Distributed Systems
CS 244E
EE 179 Analog and Digital Communication Systems

## Graphics Track-

\& CS 248
Introduction to Computer Graphics and Imaging 8

Select one of the following: ${ }^{5} \quad 3-5$
CS 205A Mathematical Methods for Robotics, Vision, and Graphics (strongly recommended as a preferred choice)
CME 104 Linear Algebra and Partial Differential Equations for Engineers (Note: students taking CME 104 are also required to take its prerequisite course, CME 102)
CME 108 Introduction to Scientific Computing

| MATH 52 | Integral Calculus of Several Variables |
| :--- | :--- |
| MATH 113 | Linear Algebra and Matrix Theory |
| Select two of the following: | $6-8$ |
| CS 231A | Computer Vision: From 3D Reconstruction to <br> Recognition |
| or CS 131 | Computer Vision: Foundations and Applications |
| CS 233 | Geometric and Topological Data Analysis |
| CS 268 | Geometric Algorithms |
| CS 348A |  <br> Processing |
| CS 348B | Computer Graphics: Image Synthesis Techniques |
| CS 348C | Computer Graphics: Animation and Simulation |
| CS 448 | Topics in Computer Graphics |

Track Electives: at least two additional courses from the lists above, 6-8
the general CS electives list, or the following: ${ }^{4}$
ARTSTUDI 160 Intro to Digital / Physical Design
ARTSTUDI 170 PHOTOGRAPHY I: BLACK AND WHITE
ARTSTUDI 179 Digital Art I
CME 302 Numerical Linear Algebra
CME $306 \quad$ Numerical Solution of Partial Differential Equations
EE 168 Introduction to Digital Image Processing
EE 262 Two-Dimensional Imaging
EE 264 Digital Signal Processing
EE 278 Introduction to Statistical Signal Processing
EE 368 Digital Image Processing
ME 101 Visual Thinking
PSYCH 30 Introduction to Perception
PSYCH 221 Image Systems Engineering

## Human-Computer Interaction Track-


or COMM 269
COMM 172 Media Psychology
or COMM 272 Media Psychology
COMM 182
COMM 324 Language and Technology
Art Studio-
ARTSTUDI 160 Intro to Digital / Physical Design
ARTSTUDI 162 Embodied Interfaces
ARTSTUDI 163 Drawing with Code
ARTSTUDI 164 DESIGN IN PUBLIC SPACES
ARTSTUDI 165 Social Media and Performative Practices
ARTSTUDI 168 Data as Material
ARTSTUDI 264 Advanced Interaction Design
ARTSTUDI 266 Sculptural Screens / Malleable Media
ARTSTUDI 267 Emerging Technology Studio
Sym Sys-
SYMSYS 245 Cognition in Interaction Design
Psychology-
PSYCH 30 Introduction to Perception
PSYCH 45 Introduction to Learning and Memory
PSYCH $70 \quad$ Self and Society: Introduction to Social Psychology
PSYCH 75 Introduction to Cultural Psychology
PSYCH 110 Research Methods and Experimental Design
PSYCH 131 Language and Thought
PSYCH 154 Judgment and Decision-Making
Empirical Methods-
MS\&E 125 Introduction to Applied Statistics
PSYCH 252 Statistical Methods for Behavioral and Social Sciences
PSYCH 254 Affective Neuroscience
PSYCH 110 Research Methods and Experimental Design
STATS 203 Introduction to Regression Models and Analysis of Variance
EDUC 191 Introduction to Survey Research
HUMBIO 82A Qualitative Research Methodology
ME Design-
ME $101 \quad$ Visual Thinking
ME 115A Introduction to Human Values in Design
ME 203 Design and Manufacturing
ME 210 Introduction to Mechatronics
ME 216A Advanced Product Design: Needfinding
Learning Design + Tech-
EDUC 236 Beyond Bits and Atoms: Designing Technological Tools
EDUC 281 Technology for Learners
EDUC $239 \quad$ Educating Young STEM Thinkers
EDUC 338 Innovations in Education
EDUC 342 Child Development and New Technologies
MS\&E-
MS\&E 185 Global Work
MS\&E 331
Computer Music-
MUSIC 220A Fundamentals of Computer-Generated Sound
MUSIC 220B Compositional Algorithms, Psychoacoustics, and Computational Music
MUSIC 220C Research Seminar in Computer-Generated Music

| MUSIC 250A | Physical Interaction Design for Music |  | EE 282 | Computer Systems Architecture |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| MUSIC 256A | Music, Computing, Design I: Art of Design for Computer Music |  | Track Electi list above, the | t least three additional courses selected from the neral CS electives list, or the following: ${ }^{4}$ | 9-12 |
| Optional Elective ${ }^{4}$ |  | CS 240E |  |  |  |
|  |  | Units | CS 241 | Embedded Systems Workshop |  |
| Information Track- |  |  | CS 244E |  |  |
|  |  |  | CS 316 | Advanced Multi-Core Systems |  |
| CS 124 | From Languages to Information | 4 | CS 341 | Project in Mining Massive Data Sets |  |
| CS 145 | Introduction to Databases | 4 | CS 343 | (Not given this year) |  |
| Two courses, from different areas: |  | 6-9 | CS 344 | Topics in Computer Networks (3 or more units, any suffix) |  |
| 1) Information | -based AI applications |  |  |  |  |
| CS 224N | Natural Language Processing with Deep Learning |  | CS 345 | (Advanced Topics in Database Systems - 3 or more units, any suffix) |  |
| CS 224S | Spoken Language Processing |  |  |  |  |
| CS 229 | Machine Learning |  | CS 346 |  |  |
| CS 233 | Geometric and Topological Data Analysis |  | CS 347 |  |  |
| CS 234 | Reinforcement Learning |  | CS 349 | Topics in Programming Systems (with permission of undergraduate advisor) |  |
| 2) Database and Information Systems |  |  |  |  |  |
| CS 140 | Operating Systems and Systems Programming |  | CS 448 | Topics in Computer Graphics |  |
| or CS 140E | Operating systems design and implementation |  | EE 108 | Digital System Design |  |
| CS 142 | Web Applications |  | EE 382C | Interconnection Networks |  |
| CS 245 | Database Systems Principles |  | EE 384A | Internet Routing Protocols and Standards |  |
| CS 246 | Mining Massive Data Sets |  | EE 384B | Multimedia Communication over the Internet |  |
| CS 341 | Project in Mining Massive Data Sets |  | EE 384C | Wireless Local and Wide Area Networks |  |
| CS 345 | (Offered occasionally) |  | EE 384S | Performance Engineering of Computer Systems \& Networks |  |
| CS 346 |  |  | 3 |  |  |

CS 347 Information Systems in Biology
CS 262
CS 270 Modeling Biomedical Systems: Ontology,
Terminology, Problem Solving
CS 274 Representations and Algorithms for Computational Molecular Biology
4) Information Systems on the Web

CS 224W Analysis of Networks
CS 276 Information Retrieval and Web Search
At least three additional courses from the above areas or the general CS electives list. ${ }^{4}$

## Systems Track-

## Theory Track-

CS 154 Introduction to Automata and Complexity Theory 4
Select one of the following: 3
CS 167
CS 168 The Modern Algorithmic Toolbox
CS 255 Introduction to Cryptography
CS 261 Optimization and Algorithmic Paradigms
CS 264 Beyond Worst-Case Analysis
CS 265 Randomized Algorithms and Probabilistic Analysis
CS 268 Geometric Algorithms
Two additional courses from the list above or the following: 6-8

| CS 140 | Operating Systems and Systems Programming | 4 |
| :---: | :---: | :---: |
| or CS 140E | Operating systems design and implementation |  |
| Select one of the following: |  | 3-4 |
| CS 143 | Compilers |  |
| EE 180 | Digital Systems Architecture |  |
| Two additional courses from the list above or the following: |  | 6-8 |
| CS 144 | Introduction to Computer Networking |  |
| CS 145 | Introduction to Databases |  |
| CS 149 | Parallel Computing |  |
| CS 155 | Computer and Network Security |  |
| CS 190 |  |  |
| CS 240 | Advanced Topics in Operating Systems |  |
| CS 242 | Programming Languages |  |
| CS 243 | Program Analysis and Optimizations |  |
| CS 244 | Advanced Topics in Networking |  |
| CS 245 | Database Systems Principles |  |
| EE 271 | Introduction to VLSI Systems |  |


| CS 143 | Compilers |
| :--- | :--- |
| CS 155 | Computer and Network Security |
| CS 157 | Logic and Automated Reasoning |
| or PHIL 151 | Metalogic |
| CS 166 | Data Structures |
| CS 205A | Mathematical Methods for Robotics, Vision, and <br> Graphics |
| CS 228 | Probabilistic Graphical Models: Principles and <br> Techniques |
| CS 233 | Geometric and Topological Data Analysis |
| CS 242 | Programming Languages |
| CS 250 | Algebraic Error Correcting Codes |
| CS 251 | Bitcoin and Crypto Currencies |
| CS 254 | Computational Complexity |
| CS 259 | (with permission of undergraduate advisor) |
| CS 262 |  |
| CS 263 | Algorithms for Modern Data Models |
| CS 266 |  |
| CS 267 | Graph Algorithms |


| CS 2691 | Incentives in Computer Science |
| :--- | :--- |
| CS 352 | Pseudo-Randomness |
| CS 354 | (Not given this year) |
| CS 355 | (Not given this year) |
| CS 357 | (Not given this year) |
| CS 358 | Topics in Programming Language Theory <br> CS 359 <br> permission of undergraduate advisor) |
| CS 364A | (Not given this year) <br> CS 367 |
| CS 369 | Topics in Analysis of Algorithms (with permission <br> of undergraduate advisor) |
| CS 374 | Linear Programming |
| MS\&E 310 |  |

Track Electives: at least three additional courses from the lists above, 9-12 the general CS electives list, or the following: ${ }^{4}$

| CS 269G | Almost Linear Time Graph Algorithms |
| :--- | :--- |
| CME 302 | Numerical Linear Algebra |
| CME 305 | Discrete Mathematics and Algorithms |
| PHIL 152 | Computability and Logic |

## Unspecialized Track-

|  |  | Units |
| :---: | :---: | :---: |
| CS 154 | Introduction to Automata and Complexity Theory | 4 |
| Select one of the following: |  | 4 |
| CS 140 | Operating Systems and Systems Programming |  |
| or CS 140E | Operating systems design and implementation |  |
| CS 143 | Compilers |  |
| One additional course from the list above or the following: |  | 3-4 |
| CS 144 | Introduction to Computer Networking |  |
| CS 155 | Computer and Network Security |  |
| CS 190 |  |  |
| CS 242 | Programming Languages |  |
| CS 244 | Advanced Topics in Networking |  |
| EE 180 | Digital Systems Architecture |  |
| Select one of the following: |  | 3-4 |
| CS 221 | Artificial Intelligence: Principles and Techniques |  |
| CS 223A | Introduction to Robotics |  |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques |  |
| CS 229 | Machine Learning |  |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition |  |
| Select one of the following: |  | 3-4 |
| CS 145 | Introduction to Databases |  |
| CS 147 | Introduction to Human-Computer Interaction Design |  |
| CS 148 | Introduction to Computer Graphics and Imaging |  |
| CS 248 | Interactive Computer Graphics |  |
| CS 262 |  |  |
| At least two | urses from the general CS electives list ${ }^{4}$ |  |

## Individually Designed Track-

Students may propose an individually designed track. Proposals should include a minimum of 25 units and seven courses, at least four of which must be CS courses numbered 100 or above. See Handbook for Undergraduate Engineering Programs for further information.

For additional information and sample programs see the Handbook for Undergraduate Engineering Programs (UGHB) (http://ughb.stanford.edu)

MATH 19, MATH 20, and MATH 21 OR MATH 41 and MATH 42 OR AP Calculus Credit may be used as long as at least 26 MATH units are taken. AP Calculus Credit must be approved by the School of Engineering.
2 The math electives list consists of: MATH 51, MATH 104, MATH 108, MATH 109, MATH 110, MATH 113; CS 157, CS 205A; PHIL 151; CME 100, CME 102, CME 103 (or EE103), CME 104. Completion of MATH 52 and MATH 53 will together count as one math elective. Restrictions: CS 157 and PHIL 151 may not be used in combination to satisfy the math electives requirement. Students who have taken both MATH 51 and MATH 52 may not count CME 100 as an elective. Courses counted as math electives cannot also count as CS electives, and vice versa.
andical Methods for Robotics, Vision, and Graphics is strongly recommended in this list for the Graphics track. Students taking CME 104 Linear Algebra and Partial Differential Equations for Engineers are also required to take its prerequisite, CME 102 Ordinary Differential Equations for Engineers.
Independent study projects (CS 191 Senior Project or CS 191W Writing Intensive Senior Project) require faculty sponsorship and must be approved by the adviser, faculty sponsor, and the CS senior project adviser (P. Young). A signed approval form, along with a brief description of the proposed project, should be filed the quarter before work on the project is begun. Further details can be found in the Handbook for Undergraduate Engineering Programs.

## Honors Program

The Department of Computer Science (CS) offers an honors program for undergraduates whose academic records and personal initiative indicate that they have the necessary skills to undertake high-quality research in computer science. Admission to the program is by application only. To apply for the honors program, students must be majoring in Computer Science, have a grade point average (GPA) of at least 3.6 in courses that count toward the major, and achieve senior standing (135 or more units) by the end of the academic year in which they apply. Coterminal master's students are eligible to apply as long as they have not already received their undergraduate degree. Beyond these requirements, students who apply for the honors program must find a Computer Science faculty member who agrees to serve as the thesis adviser for the project. Thesis advisers must be members of Stanford's Academic Council.

Students who meet the eligibility requirements and wish to be considered for the honors program must submit a written application to the CS undergraduate program office by May 1 of the year preceding the honors work. The application must include a letter describing the research
project, a letter of endorsement from the faculty sponsor, and a transcript of courses taken at Stanford. Each year, a faculty review committee selects the successful candidates for honors from the pool of qualified applicants.

In order to receive departmental honors, students admitted to the honors program must, in addition to satisfying the standard requirements for the undergraduate degree, do the following:

1. Complete at least 9 units of CS 191 or CS 191W under the direction of their project sponsor.
2. Attend a weekly honors seminar Winter and Spring quarters.
3. Complete an honors thesis deemed acceptable by the thesis adviser and at least one additional faculty member.
4. Present the thesis at a public colloquium sponsored by the department.
5. Maintain the 3.6 GPA required for admission to the honors program.

## Guide to Choosing Introductory Courses

Students arriving at Stanford have widely differing backgrounds and goals, but most find that the ability to use computers effectively is beneficial to their education. The department offers many introductory courses to meet the needs of these students.

For students whose principal interest is an exposure to the fundamental ideas behind computer science and programming, CS 101 or CS 105 are the most appropriate courses. They are intended for students in nontechnical disciplines who expect to make some use of computers, but who do not expect to go on to more advanced courses. CS 101 and CS 105 meet the new Ways of Thinking Ways of Doing breadth requirements in Formal Reasoning and include an introduction to programming and the use of modern Internet-based technologies. Students interested in learning to use the computer should consider CS 1C, Introduction to Computing at Stanford.

Students who intend to pursue a serious course of study in computer science may enter the program at a variety of levels, depending on their background. Students with little prior experience or those who wish to take more time to study the fundamentals of programming should take CS 106A followed by CS 106B. Students in CS 106A need not have prior programming experience. Students with significant prior exposure to programming or those who want an intensive introduction to the field should take CS 106X or may start directly in CS 106B. CS 106A uses Java, JavaScript, or Python as its programming language; CS 106B and X use $\mathrm{C}++$. No prior knowledge of these languages is assumed, and the prior programming experience required for CS 106B or X may be in any language. In all cases, students are encouraged to discuss their background with the instructors responsible for these courses.

After the introductory sequence, Computer Science majors and those who need a significant background in computer science for related majors in engineering should take CS 103, CS 107 and CS 110. CS 103 offers an introduction to the mathematical and theoretical foundations of computer science. CS 107 exposes students to a variety of programming concepts that illustrate critical strategies used in systems development; CS 110 builds on this material, focusing on the development of largerscale software making use of systems and networking abstractions.

## In summary:

## For exposure:

CS 1C Introduction to Computing at Stanford

For nontechnical use:

| CS 101 | Introduction to Computing Principles |
| :--- | :--- |
| or CS 105 | Introduction to Computers |

or CS 105 Introduction to Computers
For scientific use:
CS 106A Programming Methodology

For a technical introduction:
CS 106A Programming Methodology

For significant use:

| CS 106A | Programming Methodology |
| :--- | :--- |
| \& CS 106B | and Programming Abstractions |
| or CS 106X | Programming Abstractions (Accelerated) |
| CS 103 | Mathematical Foundations of Computing |
| CS 107 | Computer Organization and Systems |
| CS 110 | Principles of Computer Systems |

## Overseas Studies Courses in Computer Science

For course descriptions and additional offerings, see the listings in the Stanford Bulletin's ExploreCourses web site (http:// explorecourses.stanford.edu) or the Bing Overseas Studies web site (http://bosp.stanford.edu). Students should consult their department or program's student services office for applicability of Overseas Studies courses to a major or minor program.

## Joint Major Program: Computer Science and a Humanities Major

The joint major program (JMP), authorized by the Academic Senate for a pilot period of six years beginning in 2014-15, permits students to major in both Computer Science and one of ten Humanities majors. See the "Joint Major Program (http://exploredegrees.stanford.edu/ undergraduatedegreesandprograms/\#jointmajortext)" section of this bulletin for a description of University requirements for the JMP. See also the Undergraduate Advising and Research JMP web site and its associated FAQs.

Students completing the JMP receive a B.A.S. (Bachelor of Arts and Science).

Because the JMP is new and experimental, changes to procedures may occur; students are advised to check the relevant section of the bulletin periodically.

## Mission

The Joint Major provides a unique opportunity to gain mastery in two disciplines: Computer Science and a selected humanities field. Unlike the double major or dual major, the Joint Major emphasizes integration of the two fields through a cohesive, transdisciplinary course of study and integrated capstone experience. The Joint Major not only blends the intellectual traditions of two Stanford departments-it does so in a way that reduces the total unit requirement for each major.

## Computer Science Major Requirements in the Joint Major Program

(See the respective humanities department Joint Major Program section of this bulletin for details on humanities major requirements.)

The CS requirements for the Joint Major follow the CS requirements for the CS-BS degree with the following exceptions:

1. Two of the depth electives are waived. The waived depth electives are listed below for each CS track.
2. The Senior Project is fulfilled with a joint capstone project. The student enrolls in CS191 or 191W (3 units) during the senior year. Depending on the $X$ department, enrollment in an additional Humanities capstone course may also be required. But, at a minimum, 3 units of CS191 or 191W must be completed.
3. There is no double-counting of units between majors. If a course is required for both the CS and Humanities majors, the student will work with one of the departments to identify an additional course - one which will benefit the academic plan - to apply to that major's total units requirement.
4. For CS, WIM can be satisfied with CS181W or CS191W.

## Depth Electives for CS Tracks for students completing a Joint Major:

## Artificial Intelligence Track:

One Track Elective (rather than three).

## Biocomputation Track:

One course from Note 3 of the Department Program Sheet, plus one course from Note 4 of the Program Sheet..

## Computer Engineering Track:

- EE 108A and 108B
- One of the following: EE 101A, 101B, 102A, 102B
- Satisfy the requirements of one of the following concentrations:

1. Digital Systems Concentration: CS 140 or 143; EE 109, 271; plus one of CS 140 or 143 (if not counted above), 144, 149, 240E, 244: EE 273, 282
2. Robotics and Mechatronics Concentration: CS 205A, 223A; ME 210; ENGR 105
3. Networking Concentration: CS 140, 144; plus two of the following, CS 240, 240E, 244, 244B, 244E, 249A, 249B, EE 179, EE 276

## Graphics Track:

No Track Electives required (rather than two)

## HCI Track:

No Interdisciplinary HCI Electives required
Information Track:
One Track Elective (rather than three)

## Systems Track:

One Track Elective (rather than three)
Theory Track:
One Track Elective (rather than three)

## Unspecialized Track:

No Track Electives required (rather than two)

## Individually Designed Track:

Proposals should include a minimum of five (rather than seven) courses, at least four of which must be CS courses numbered 100 or above.

## Declaring a Joint Major Program

To declare the joint major, students must first declare each major through Axess, and then submit the Declaration or Change of Undergraduate Major, Minor, Honors, or Degree Program. (https://stanford.box.com/ change-UG-program) The Major-Minor and Multiple Major Course Approval Form (https://stanford.box.com/MajMin-MultMaj) is required for graduation for students with a joint major.

## Dropping a Joint Major Program

To drop the joint major, students must submit the Declaration or Change of Undergraduate Major, Minor, Honors, or Degree Program. (https:// stanford.box.com/change-UG-program). Students may also consult the

Student Services Center (http://studentservicescenter.stanford.edu) with questions concerning dropping the joint major.

## Transcript and Diploma

Students completing a joint major graduate with a B.A.S. degree. The two majors are identified on one diploma separated by a hyphen. There will be a notation indicating that the student has completed a "Joint Major". The two majors are identified on the transcript with a notation indicating that the student has completed a "Joint Major".

## Computer Science (CS) Minor

The following core courses fulfill the minor requirements. Prerequisites include the standard mathematics sequence through MATH 51 (or CME 100).

Units

Introductory Programming (AP Credit may be used to fulfill this requirement):

| CS 106B or CS 106X | Programming Abstractions <br> Programming Abstractions (Accelerated) | 5 |
| :---: | :---: | :---: |
| Core: |  |  |
| CS 103 | Mathematical Foundations of Computing | 5 |
| CS 107 | Computer Organization and Systems | 5 |
| or CS 107E | Computer Systems from the Ground Up |  |
| CS 109 | Introduction to Probability for Computer Scientists | 5 |
| Electives (choose two courses from different areas): |  |  |
| Artificial Intelligence- |  |  |
| CS 124 | From Languages to Information | 4 |
| CS 221 | Artificial Intelligence: Principles and Techniques | 4 |
| CS 229 | Machine Learning | 3-4 |
| Human-Computer Interaction- |  |  |
| CS 147 | Introduction to Human-Computer Interaction Design | 4 |
| Software- |  |  |
| CS 108 | Object-Oriented Systems Design | 4 |
| CS 110 | Principles of Computer Systems | 5 |
| Systems- |  |  |
| CS 140 <br> or CS 140E | Operating Systems and Systems Programming Operating systems design and implementation | 4 |
| CS 143 | Compilers | 4 |
| CS 144 | Introduction to Computer Networking | 4 |
| CS 145 | Introduction to Databases | 4 |
| CS 148 | Introduction to Computer Graphics and Imaging | 4 |
| Theory- |  |  |
| CS 154 | Introduction to Automata and Complexity Theory | 4 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 161 | Design and Analysis of Algorithms | 5 |

Note: for students with no programming background and who begin with CS 106A, the minor consists of seven courses.

## Master of Science in Computer Science

In general, the M.S. degree in Computer Science is intended as a terminal professional degree and does not lead to the Ph.D. degree. Most students planning to obtain the Ph.D. degree should apply directly for admission to the Ph.D. program. Some students, however, may wish to complete the master's program before deciding whether to pursue the Ph.D. To give such students a greater opportunity to become familiar with research, the department has a program leading to a master's degree with distinction in research. This program is described in more detail below.

## Admission

Applications to the M.S. program and all supporting documents must be submitted and received online by the published deadline. Information on admission requirements (http://cs.stanford.edu/admissions) is available on the department's web site; see also the department's deadlines page (https://cs.stanford.edu/admissions/deadlines). Exceptions are made for applicants who are already students at Stanford and are applying to the coterminal program (https://cs.stanford.edu/admissions/current-stanford-students/coterminal-program).

## University Coterminal Requirements

Coterminal master's degree candidates are expected to complete all master's degree requirements as described in this bulletin. University requirements for the coterminal master's degree are described in the "Coterminal Master's Program (http://exploredegrees.stanford.edu/ cotermdegrees)" section. University requirements for the master's degree are described in the "Graduate Degrees (http:// exploredegrees.stanford.edu/graduatedegrees/\#masterstext)" section of this bulletin.

After accepting admission to this coterminal master's degree program, students may request transfer of courses from the undergraduate to the graduate career to satisfy requirements for the master's degree. Transfer of courses to the graduate career requires review and approval of both the undergraduate and graduate programs on a case by case basis.

In this master's program, courses taken during or after the first quarter of the sophomore year are eligible for consideration for transfer to the graduate career; the timing of the first graduate quarter is not a factor. No courses taken prior to the first quarter of the sophomore year may be used to meet master's degree requirements.

Course transfers are not possible after the bachelor's degree has been conferred.

The University requires that the graduate adviser be assigned in the student's first graduate quarter even though the undergraduate career may still be open. The University also requires that the Master's Degree Program Proposal be completed by the student and approved by the department by the end of the student's first graduate quarter.

## Requirements

A candidate is required to complete a program of 45 units. At least 36 of these must be graded units, passed with a grade point average (GPA) of 3.0 (B) or better. The 45 units may include no more than 10 units of courses from those listed below in Requirement 1. Thus, students needing to take more than two of the courses listed in Requirement 1 actually complete more than 45 units of course work in the program. Only well-prepared students may expect to finish the program in one year; most students complete the program in six quarters. Students hoping to complete the program with 45 units should already have a substantial background in computer science, including course work or experience equivalent to all of Requirement 1 and some prior course work related to their specialization area.

## Requirement 1: Foundations-

Students must complete the following courses, or waive out of them by providing evidence to their advisers that similar or more advanced courses have been taken, either at Stanford or another institution (total units used to satisfy foundations requirement may not exceed 10):
Logic, Automata, and Computability
CS $103 \quad$ Mathematical Foundations of Computing
Probability
Select one of the following:

| CS 109 | Introduction to Probability for Computer Scientists |
| :--- | :--- |
| STATS 116 | Theory of Probability |


| MS\&E 220 | Probabilistic Analysis |
| :--- | :--- |
| CME 106 | Introduction to Probability and Statistics for <br> Engineers |
| Algorithmic Analysis |  |
| CS 161 | Design and Analysis of Algorithms |
| Computer Organization and Systems |  |
| CS 107 Computer Organization and Systems <br> or CS 107E Computer Systems from the Ground Up |  |
| Principles of Computer Systems |  |
| CS 110 | Principles of Computer Systems |

## Requirement 2: Significant Software Implementation-

Students must complete at least one course designated as having a significant software implementation component. The list of such courses includes:

| CS 140 | Operating Systems and Systems Programming | $3-4$ |
| :--- | :--- | ---: |
| or CS 140E | Operating systems design and implementation |  |
| CS 143 | Compilers | $3-4$ |
| CS 144 | Introduction to Computer Networking | $3-4$ |
| CS 145 | Introduction to Databases | $3-4$ |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 190 |  |  |
| CS 210B | Software Project Experience with Corporate | $3-4$ |
|  | Partners |  |
| CS 221 | Artificial Intelligence: Principles and Techniques | $3-4$ |
| CS 227B | General Game Playing | 3 |
| CS 243 | Program Analysis and Optimizations | $3-4$ |
| CS 248 | Interactive Computer Graphics | $3-4$ |
| CS 341 | Project in Mining Massive Data Sets | 3 |
| CS 346 | (Offered occasionally) | $3-5$ |

## Requirement 3: Specialization-

Students may choose to satisfy this requirement through one of two options, Single Depth or Dual Depth, outlined following. All courses taken for this requirement must be taken on a letter grade basis for three or more units.

## Option 1-Single Depth

- A program of 27 units in a single area of specialization must be completed. A maximum of 9 units of independent study (CS 393, CS 395, CS 399) may be counted toward the specialization.
- Additionally, students must complete three breadth courses from the list of approved breadth courses associated with their chosen specialization. Individual specializations explicitly have different breadth requirements; see the individual specialization sheets on the department's web site (http://cs.stanford.edu/degrees/mscs/ programsheets) for details.
- Breadth courses may not be waived, must be taken for at least 3 units each, and must be completed for a letter grade.


## Option 2-Dual Depth

- Students select distinct primary and secondary areas.
- A program of 21 units in the primary area of specialization must be completed. A maximum of 9 units of independent study (CS 393, CS 395, CS 399) may be counted toward the primary specialization.
- Students must also complete a program of five courses satisfying the requirements for their secondary area of specialization.
- Breadth courses are not required.


## Specialization Areas-

Ten approved specialization areas which may be used to satisfy Requirement 3 are listed following. Students may propose to the M.S.
program committee other coherent programs that meet their goals and satisfy the basic requirements.

Courses marked with an asterisk (*) require consent of the faculty adviser. Courses marked with a double asterisk (**) may be waived by students with equivalent course work and with the approval of their adviser.

## 1. Artificial Intelligence-

A.

CS 221 Artificial Intelligence: Principles and Techniques **
B. Select at least four of the following:

| CS 223A | Introduction to Robotics |
| :--- | :--- |
| CS 224N | Natural Language Processing with Deep Learning |
| CS 224S | Spoken Language Processing |
| CS 224U | Natural Language Understanding |
| CS 224W | Analysis of Networks |
| CS 228 | Probabilistic Graphical Models: Principles and <br> Techniques |
| CS 229 | Machine Learning |
| CS 231A | Computer Vision: From 3D Reconstruction to <br> Recognition |
| CS 231N | Convolutional Neural Networks for Visual <br> Recognition |
| CS 234 | Reinforcement Learning |
| CS 238 | Decision Making under Uncertainty |

C. A total of at least 27 units from categories A, B, and the following:

CS 205A Mathematical Methods for Robotics, Vision, and Graphics
CS 225A Experimental Robotics
CS 227B General Game Playing
CS 229T Statistical Learning Theory
CS 231B
CS 231M
CS 232 Digital Image Processing
CS 233 Geometric and Topological Data Analysis
CS 239 Advanced Topics in Sequential Decision Making
CS 246 Mining Massive Data Sets
CS 262 Mod

CS 270 Modeling Biomedical Systems: Ontology, Terminology, Problem Solving
CS 273A The Human Genome Source Code
CS 273B Deep Learning in Genomics and Biomedicine
CS 274 Representations and Algorithms for Computational Molecular Biology
CS 275 Translational Bioinformatics
CS 276 Information Retrieval and Web Search
CS 279 Computational Biology: Structure and Organization of Biomolecules and Cells
CS 294A Research Project in Artificial Intelligence *
CS 323 Automated Reasoning: Theory and Applications
CS 325
CS 326 Topics in Advanced Robotic Manipulation
CS 327A Advanced Robotic Manipulation (Not given this year)
CS 328 Topics in Computer Vision
CS 329 Topics in Artificial Intelligence
CS 331A
CS 331B Representation Learning in Computer Vision
CS 332 Advanced Survey of Reinforcement Learning

| CS 333 | Safe and Interactive Robotics |
| :---: | :---: |
| CS 334A | Convex Optimization I |
| or EE 364A | Convex Optimization I |
| CS 341 | Project in Mining Massive Data Sets |
| CS 345 | (Offered occasionally) |
| CS 362 | (Not given this year) |
| CS 364A |  |
| CS 368 |  |
| CS 371 | Computational Biology in Four Dimensions |
| CS 373 | Statistical and Machine Learning Methods for Genomics |
| CS 374 | (not given this year) |
| CS 375 | Large-Scale Neural Network Modeling for Neuroscience |
| CS 377 | Topics in Human-Computer Interaction (CS 377 with any suffix) * |
| CS 379 | Interdisciplinary Topics (CS 379 with any suffix)* |
| CS 393 | Computer Laboratory ${ }^{\text {* }}$ |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project |
| CS 428 | Computation and cognition: the probabilistic approach |
| APPPHYS 293 | Theoretical Neuroscience |
| BIOE 332 |  |
| EE 263 | Introduction to Linear Dynamical Systems |
| EE 278 | Introduction to Statistical Signal Processing |
| EE 364B | Convex Optimization II |
| EE 376A | Information Theory |
| EE 377 | Information Theory and Statistics |
| EE 378B | Inference, Estimation, and Information Processing |
| ENGR 205 | Introduction to Control Design Techniques |
| ENGR 209A | Analysis and Control of Nonlinear Systems |
| MS\&E 226 | "Small" Data |
| MS\&E 251 | Stochastic Control |
| MS\&E 252 | Decision Analysis I: Foundations of Decision Analysis |
| MS\&E 351 | Dynamic Programming and Stochastic Control |
| MS\&E 352 | Decision Analysis II: Professional Decision Analysis |
| MS\&E 353 | Decision Analysis III: Frontiers of Decision Analysis |
| PSYCH 202 | Cognitive Neuroscience |
| PSYCH 209 | Neural Network Models of Cognition: Principles and Applications |
| STATS 202 | Data Mining and Analysis |
| STATS 315A | Modern Applied Statistics: Learning |
| STATS 315B | Modern Applied Statistics: Data Mining |
| - Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A), (B), and (C) requirements above. |  |
| - Students with a secondary area of specialization (per Option 2 above) in Artificial Intelligence must take five total courses satisfying the area (A) and (B) requirements above. |  |
| Those student additional cou | s who have waived out of CS 221 may take an urse in either area (B) or (C). |

## Artificial Intelligence Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 140 | Operating Systems and Systems Programming | $3-4$ |
| :--- | :--- | ---: |
| or CS 140E | Operating systems design and implementation |  |
| CS 143 | Compilers | $3-4$ |
| CS 144 | Introduction to Computer Networking | $3-4$ |
| or EE 284 | Introduction to Computer Networks |  |
| CS 145 | Introduction to Databases | $3-4$ |
| CS 147 | Introduction to Human-Computer Interaction | $3-5$ |
|  | Design |  |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | $3-4$ |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E |  |  |
| CS 240H |  | $3-4$ |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | $3-4$ |
| CS 244 | Advanced Topics in Networking | $3-4$ |
| CS 244B | Distributed Systems | 3 |
| CS 244E |  | 3 |
| CS 249A |  | 3 |
| CS 255 | Introduction to Cryptography | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 269l | Incentives in Computer Science | 3 |
| CME 108 | Introduction to Scientific Computing | 3 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | 3 |
| EE 282 | Computer Systems Architecture | 3 |
|  |  | 3 |

## 2. Biocomputation-

A. Select at least four of the following:

| CS 262 | Modeling Biomedical Systems: Ontology, |
| :--- | :--- |
| CS 270 | Terminology, Problem Solving |
| CS 272 | Introduction to Biomedical Informatics Research <br> Methodology |
| CS 273A | The Human Genome Source Code <br> CS 274Representations and Algorithms for Computational <br> Molecular Biology |
| CS 279 | Computational Biology: Structure and Organization <br> of Biomolecules and Cells |

B. A total of at least 27 units from category $(A)$ and the following:

CS $228 \quad$ Probabilistic Graphical Models: Principles and Techniques
CS 229 Machine Learning
CS 231N Convolutional Neural Networks for Visual Recognition

| CS 233 | Geometric and Topological Data Analysis |
| :---: | :---: |
| CS 245 | Database Systems Principles |
| CS 246 | Mining Massive Data Sets |
| CS 261 | Optimization and Algorithmic Paradigms |
| CS 264 | Beyond Worst-Case Analysis |
| CS 265 | Randomized Algorithms and Probabilistic Analysis |
| CS 268 | Geometric Algorithms |
| CS 273B | Deep Learning in Genomics and Biomedicine |
| CS 275 | Translational Bioinformatics |
| CS 325 |  |
| CS 341 | Project in Mining Massive Data Sets |
| CS 345 | (Offered occasionally ) |
| CS 346 |  |
| CS 362 | (Not given this year) |
| CS 371 | Computational Biology in Four Dimensions |
| CS 373 | Statistical and Machine Learning Methods for Genomics |
| CS 374 |  |
| CS 375 | Large-Scale Neural Network Modeling for Neuroscience |
| CS 393 | Computer Laboratory* |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project ${ }^{\text {* }}$ |
| APPPHYS 293 | Theoretical Neuroscience |
| BIOC 218 |  |
| BIOE 332 |  |
| GENE 203 |  |
| GENE 211 | Genomics |
| SBIO 228 |  |
| - Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area $(A)$ and (B) requirements above. |  |
| - Students with a secondary area of specialization (per Option 2 above) in Biocomputation must take five total courses, three courses of which must come from area (A) and the remaining two courses may come from either area (A) or (B). |  |

## Biocomputation Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | $3-4$ |
| :--- | :--- | ---: |
| CS 140 | Operating Systems and Systems Programming | $3-4$ |
| or CS 140E | Operating systems design and implementation |  |
| CS 143 | Compilers | $3-4$ |
| CS 144 | Introduction to Computer Networking | $3-4$ |
| or EE 284 | Introduction to Computer Networks |  |
| CS 145 | Introduction to Databases | $3-4$ |
| CS 147 | Introduction to Human-Computer Interaction | $3-5$ |
|  | Design |  |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | $3-4$ |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 205A | Mathematical Methods for Robotics, Vision, and | 3 |
|  | Graphics |  |


| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| :---: | :---: | :---: |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | 3-4 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 224U | Natural Language Understanding | 3-4 |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition | 3 |
| or CS 231B |  |  |
| CS 234 | Reinforcement Learning | 3 |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E |  |  |
| CS 240H |  | 3-4 |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | 3-4 |
| CS 244 | Advanced Topics in Networking | 3-4 |
| CS 244B | Distributed Systems | 3 |
| CS 244E |  |  |
| CS 249A |  | 3 |
| CS 255 | Introduction to Cryptography | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 276 | Information Retrieval and Web Search | 3 |
| CME 108 | Introduction to Scientific Computing | 3-4 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | 3-4 |
| EE 282 | Computer Systems Architecture | 3 |
| 3. Computer and Network SecurityA. |  |  |
| CS 140 | Operating Systems and Systems Programming ** |  |
| or CS 140E | Operating systems design and implementation |  |
| CS 144 | Introduction to Computer Networking ** |  |
| CS 155 | Computer and Network Security |  |
| CS 244 | Advanced Topics in Networking |  |
| CS 255 | Introduction to Cryptography |  |
| B. Select at least three of the following: |  |  |
| CS 142 | Web Applications |  |
| CS 190 |  |  |
| CS 240 | Advanced Topics in Operating Systems |  |
| CS 244B | Distributed Systems |  |
| CS 261 | Optimization and Algorithmic Paradigms |  |
| CS 265 | Randomized Algorithms and Probabilistic Analysis |  |
| CS 340 | Topics in Computer Systems |  |
| CS 344 | Topics in Computer Networks (CS 344 with any suffix) |  |
| CS 355 | (Not given this year) |  |
| C. A total of at least 27 units from categories (A), (B), and the following: |  |  |
| CS 240E |  |  |
| CS 244E |  |  |
| CS 245 | Database Systems Principles |  |
| CS 251 | Bitcoin and Crypto Currencies |  |
| CS 264 | Beyond Worst-Case Analysis |  |
| CS 294S | Research Project in Software Systems and Security (Not given this year) |  |
| CS 341 | Project in Mining Massive Data Sets |  |
| CS 345 | (Offered occasionally) |  |


| CS 347 |  |
| :--- | :--- |
| CS 393 | Computer Laboratory * |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project |

- Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A), (B), and (C) requirements above.
- Students with a secondary area of specialization (per Option 2 above) in Computer and Network Security must take five courses; those five courses must satisfy the area (A) requirement and additional courses from area (B) should be taken if any area (A) requirements are waived.


## Computer and Network Security Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | $3-4$ |
| :--- | :--- | ---: |
| CS 143 | Compilers | $3-4$ |
| CS 147 | Introduction to Human-Computer Interaction | $3-5$ |
|  | Design |  |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | $3-4$ |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 205A | Mathematical Methods for Robotics, Vision, and | 3 |
|  | Graphics |  |
| CS 221 | Artificial Intelligence: Principles and Techniques | $3-4$ |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | $3-4$ |
| CS 224S | Spoken Language Processing | $2-4$ |
| CS 224U | Natural Language Understanding | $3-4$ |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and | $3-4$ |
|  | Techniques | $3-4$ |
| CS 229 | Machine Learning | 3 |
| CS 231A | Computer Vision: From 3D Reconstruction to | 3 |
| or CS 231B | Recognition | 3 |
| CS 233 | Geometric and Topological Data Analysis | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | $3-4$ |
| CS 246 | Mining Massive Data Sets | $3-4$ |
| CS 249A |  | 3 |
| CS 262 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, | 3 |
| CS 273A | Terminology, Problem Solving | 3 |
| The Human Genome Source Code | 3 |  |
|  |  | 3 |


| CS 274 | Representations and Algorithms for Computational 3-4 Molecular Biology |  |
| :---: | :---: | :---: |
| CS 276 | Information Retrieval and Web Search | 3 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CME 108 | Introduction to Scientific Computing | -4 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | -4 |
| EE 282 | Computer Systems Architecture | 3 |

## 4. Human-Computer Interaction-

A.

| CS 147 | Introduction to Human-Computer Interaction <br> Design |
| :--- | :--- |
| CS 247 | Human-Computer Interaction Design Studio ** |

B. Select any three of the following:

| CS 142 | Web Applications |
| :--- | :--- |
| CS 148 | Introduction to Computer Graphics and Imaging |
| CS 194H | User Interface Design Project |
| CS 210A | Software Project Experience with Corporate <br> Partners |
| CS 248 | Interactive Computer Graphics |
| CS 376 | Human-Computer Interaction Research |
| CS 377 | Topics in Human-Computer Interaction (CS 377 <br> with any suffix) |
| CS 448B | Data Visualization |
| ME 216M | Introduction to the Design of Smart Products |
| C. A total of at <br> following: |  |

following:
a. Broader CS

CS 221 Artificial Intelligence: Principles and Techniques
CS 224N Natural Language Processing with Deep Learning
CS 224U Natural Language Understanding
CS 224W Analysis of Networks
CS 229 Machine Learning
CS 231A Computer Vision: From 3D Reconstruction to Recognition
CS 231B
CS 242 Programming Languages
CS 246 Mining Massive Data Sets
CS 341 Project in Mining Massive Data Sets
CS 393 Computer Laboratory *
CS 395 Independent Database Project *
CS 399 Independent Project *
b. Art Studio

ARTSTUDI 160 Intro to Digital / Physical Design
ARTSTUDI 162 Embodied Interfaces
ARTSTUDI 163 Drawing with Code
ARTSTUDI 164 DESIGN IN PUBLIC SPACES
ARTSTUDI 165 Social Media and Performative Practices
ARTSTUDI 168 Data as Material
ARTSTUDI 264 Advanced Interaction Design
ARTSTUDI 266 Sculptural Screens / Malleable Media
ARTSTUDI 267 Emerging Technology Studio
c. Communication

COMM 224 Lies, Trust, and Tech
COMM 240
COMM 266 Virtual People

COMM 269
COMM 272 Media Psychology
Comm 282
COMM 324 Language and Technology
d. Empirical Methods

COMM 314 Ethnographic Methods
EDUC 200B Introduction to Qualitative Research Methods
MS\&E 125 Introduction to Applied Statistics
PSYCH 252 Statistical Methods for Behavioral and Social Sciences
PSYCH 254 Affective Neuroscience
STATS 203 Introduction to Regression Models and Analysis of Variance
e. Learning Design \& Tech

EDUC 236 Beyond Bits and Atoms: Designing Technological Tools
EDUC 239 Educating Young STEM Thinkers
EDUC 281 Technology for Learners
EDUC 338 Innovations in Education
EDUC 342 Child Development and New Technologies
f. Management Science \& Engr

MS\&E 185 Global Work
MS\&E 331
MS\&E 334 Topics in Social Data
g. Mechanical Engr

ME 203 Design and Manufacturing
ME 210 Introduction to Mechatronics
ME 216A Advanced Product Design: Needfinding
h. Music

MUSIC 220A Fundamentals of Computer-Generated Sound
MUSIC 220B Compositional Algorithms, Psychoacoustics, and Computational Music
MUSIC 220C Research Seminar in Computer-Generated Music
MUSIC 250A Physical Interaction Design for Music
MUSIC 256A Music, Computing, Design I: Art of Design for Computer Music
i. Psych

PSYCH 204 Computation and cognition: the probabilistic approach
PSYCH 209 Neural Network Models of Cognition: Principles and Applications
j. Sym Sys

SYMSYS 245 Cognition in Interaction Design
Additional courses ${ }^{1}$
Any d.school course (http://dschool.stanford.edu) or any HCl course (http://hci.stanford.edu/courses); such courses must be numbered 100 or above and be taken for at least 3 units to count for this requirement

- Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A) through (C) requirements above.
- Students with a secondary area of specialization (per Option 2 above) in Human-Computer Interaction must take five courses satisfying the areas (A) through (C).


## Human-Computer Interaction Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | 3-4 |
| :---: | :---: | :---: |
| CS 140 | Operating Systems and Systems Programming | -4 |
| or CS 140E | Operating systems design and implementation |  |
| CS 143 | Compilers | 3-4 |
| CS 144 | Introduction to Computer Networking | 3-4 |
| or EE 284 | Introduction to Computer Networks |  |
| CS 145 | Introduction to Databases | 3-4 |
| CS 149 | Parallel Computing | 3-4 |
| CS 154 | Introduction to Automata and Complexity Theory | 3-4 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | 3-4 |
| CS 168 | The Modern Algorithmic Toolbox | 3-4 |
| CS 205A | Mathematical Methods for Robotics, Vision, and Graphics | 3 |
| CS 223A | Introduction to Robotics | 3 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques | 3-4 |
| CS 233 | Geometric and Topological Data Analysis | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E |  |  |
| CS 240H |  | 3-4 |
| CS 243 | Program Analysis and Optimizations | 3-4 |
| CS 244 | Advanced Topics in Networking | 3-4 |
| CS 244B | Distributed Systems | 3 |
| CS 244E |  |  |
| CS 249A |  | 3 |
| CS 255 | Introduction to Cryptography | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 262 |  | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving | 3 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 274 | Representations and Algorithms for Computational Molecular Biology |  |
| CS 276 | Information Retrieval and Web Search | 3 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CME 108 | Introduction to Scientific Computing | 3-4 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | 3-4 |
| EE 282 | Computer Systems Architecture | 3 |
| 5. Information Management and AnalyticsA. |  |  |
| CS 145 | Introduction to Databases ** | 3-4 |
| B. Select at least four of the following: |  |  |
| CS 224N | Natural Language Processing with Deep Learning |  |
| CS 224W | Analysis of Networks |  |


| CS 229 | Machine Learning |
| :---: | :---: |
| CS 245 | Database Systems Principles |
| CS 246 | Mining Massive Data Sets |
| CS 276 | Information Retrieval and Web Search |
| CS 345 | (Offered occasionally) |
| CS 346 | (no longer offered) |
| CS 347 |  |
| C. A total of at least 27 units from categories (A), (B) and the following: |  |
| CS 144 | Introduction to Computer Networking |
| CS 190 |  |
| CS 224S | Spoken Language Processing |
| CS 224U | Natural Language Understanding |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques |
| CS 229T | Statistical Learning Theory |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition |
| CS 231N | Convolutional Neural Networks for Visual Recognition |
| CS 233 | Geometric and Topological Data Analysis |
| CS 234 | Reinforcement Learning |
| CS 240 | Advanced Topics in Operating Systems |
| CS 242 | Programming Languages |
| CS 243 | Program Analysis and Optimizations |
| CS 244 | Advanced Topics in Networking |
| CS 244B | Distributed Systems |
| CS 249A |  |
| CS 251 | Bitcoin and Crypto Currencies |
| CS 255 | Introduction to Cryptography |
| CS 262 |  |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving |
| CS 272 | Introduction to Biomedical Informatics Research Methodology |
| CS 273A | The Human Genome Source Code |
| CS 274 | Representations and Algorithms for Computational Molecular Biology |
| CS 275 | Translational Bioinformatics |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells |
| CS 316 | Advanced Multi-Core Systems |
| CS 325 |  |
| CS 341 | Project in Mining Massive Data Sets |
| CS 344 | Topics in Computer Networks (CS 344 with any suffix) |
| CS 362 | (Not given this year) |
| CS 374 |  |
| CS 393 | Computer Laboratory * |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project * |
| MS\&E 226 | "Small" Data |
| STATS 315A | Modern Applied Statistics: Learning |
| STATS 315B | Modern Applied Statistics: Data Mining |

- Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A), (B), and (C) requirements above.
- Students with a secondary area of specialization (per Option 2 above) in Information Management and Analytics must take five courses satisfying the area $(A)$ and $(B)$ requirements above. Note that if CS145 was waived in area (A), students should take an additional course from either area (B) or (C) in its place.


## Information Management and Analytics Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | $3-4$ |
| :--- | :--- | ---: |
| CS 140 | Operating Systems and Systems Programming | $3-4$ |
| or CS 140E | Operating systems design and implementation |  |
| CS 147 | Introduction to Human-Computer Interaction <br>  <br>  <br> Design | $3-5$ |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | $3-4$ |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 205A | Mathematical Methods for Robotics, Vision, and | 3 |
|  | Graphics |  |
| CS 221 | Artificial Intelligence: Principles and Techniques | $3-4$ |
| CS 223A | Introduction to Robotics | 3 |
| CS 227B | General Game Playing | 3 |
| CS 240E |  |  |
| CS 244E |  | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CME 108 | Introduction to Scientific Computing | $3-4$ |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | $3-4$ |
| EE 282 | Computer Systems Architecture | 3 |

6. Mobile and Internet Computing-
A. Select two of the following:

| CS 140 | Operating Systems and Systems Programming ** |
| :--- | :--- |
| or CS 140E | Operating systems design and implementation |
| CS 144 | Introduction to Computer Networking |
| CS 244 | Advanced Topics in Networking |

B. Select one of the following:

| CS 142 | Web Applications |
| :--- | :--- |
| CS 147 | Introduction to Human-Computer Interaction <br> Design |
| CS 247 | Human-Computer Interaction Design Studio |

C. Select one of the following:

| CS 155 | Computer and Network Security |
| :--- | :--- |
| CS 255 | Introduction to Cryptography |

D.

CS 294S Research Project in Software Systems and Security
E. A total of 27 units from categories (A), (B), (C), (D) and the following:

CS 190

| CS 224W | Analysis of Networks |
| :--- | :--- |
| CS 241 | Embedded Systems Workshop |
| CS 244E | Mining Massive Data Sets |
| CS 246 | Bitcoin and Crypto Currencies |
| CS 251 | Topics in Computer Networks (CS 344 with any <br> suffix) |
| CS 344 | Human-Computer Interaction Research |
| CS 364A | Computer Laboratory |

- Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A) through (E) requirements above.
- Students with a secondary area of specialization (per Option 2 above) in Mobile and Internet Computing must take five courses satisfying the area (A) through (D) requirements above.


## Mobile and Internet Computing Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | $3-4$ |
| :--- | :--- | ---: |
| CS 143 | Compilers | $3-4$ |
| CS 145 | Introduction to Databases | $3-4$ |
| CS 148 | Introduction to Computer Graphics and Imaging | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | $3-4$ |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 205A | Mathematical Methods for Robotics, Vision, and | 3 |
|  | Graphics |  |
| CS 221 | Artificial Intelligence: Principles and Techniques | $3-4$ |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | $3-4$ |
| CS 224S | Spoken Language Processing | $2-4$ |
| CS 224U | Natural Language Understanding | $3-4$ |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and | $3-4$ |
|  | Techniques | $3-4$ |
| CS 229 | Machine Learning | 3 |
| CS 231A | Computer Vision: From 3D Reconstruction to | 3 |
| or CS 231B | Recognition |  |
| CS 233 | Geometric and Topological Data Analysis | 3 |


| CS 234 | Reinforcement Learning | 3 |
| :--- | :--- | ---: |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E | (no longer offered) |  |
| CS 240H |  | $3-4$ |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | $3-4$ |
| CS 244B | Distributed Systems | 3 |
| CS 249A |  | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 262 |  | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, | 3 |
| CS 273A | Terminology, Problem Solving |  |
| CS 274 | The Human Genome Source Code | 3 |
| CS 276 | Representations and Algorithms for Computational 3-4 |  |
| CS 279 | Molecular Biology |  |
|  | Information Retrieval and Web Search | 3 |
| CME 108 | Computational Biology: Structure and Organization | 3 |
| CME 302 | of Biomolecules and Cells |  |
| EE 180 | Introduction to Scientific Computing | $3-4$ |
| EE 282 | Numerical Linear Algebra | 3 |
|  | Digital Systems Architecture | $3-4$ |
|  | Computer Systems Architecture | 3 |

## 7. Real-World Computing-

| A. Select at least three of the following: |  |
| :--- | :--- |
| CS 148 | Introduction to Computer Graphics and Imaging |
| CS 223A | Introduction to Robotics |
| CS 231A | Computer Vision: From 3D Reconstruction to <br> Recognition |
| CS 248 | Interactive Computer Graphics |

B. Select at least three of the following:

| CS 205A | Mathematical Methods for Robotics, Vision, and <br> Graphics |
| :--- | :--- |
| CS 233 | Geometric and Topological Data Analysis |
| CS 249A |  |
| CS 262 | Geometric Algorithms |
| CS 268 |  <br> Crocessing |
| CS 348A | Computer Graphics: Image Synthesis Techniques |
| CS 348C | Computer Graphics: Animation and Simulation |
| CS 374 | Numerical Linear Algebra |
| CME 302 | Numerical Solution of Partial Differential <br> CME 306 |

C. A total of at least 27 units from categories (A), (B), and the following:

| CS 225A | Experimental Robotics |
| :--- | :--- |
| CS 228 | Probabilistic Graphical Models: Principles and <br> Techniques |
| CS 229 | Machine Learning |
| CS 231B |  |

Cs

| CS 232 <br> or EE 368 | Digital Image Processing <br> Digital Image Processing |
| :--- | :--- |
| CS 247 | Human-Computer Interaction Design Studio <br> CS 270 |
| Modeling Biomedical Systems: Ontology, <br> Terminology, Problem Solving |  |
| CS 272 | Introduction to Biomedical Informatics Research <br> Methodology |
| CS 273A | The Human Genome Source Code |

## Real-World Computing Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | $3-4$ |
| :--- | :--- | ---: |
| CS 140 | Operating Systems and Systems Programming | $3-4$ |
| or CS 140E |  | $3-4$ |
| CS 143 | Compilers | $3-4$ |
| CS 144 | Introduction to Computer Networking |  |
| or EE 284 | Introduction to Computer Networks | $3-4$ |
| CS 145 | Introduction to Databases | $3-5$ |
| CS 147 | Introduction to Human-Computer Interaction |  |
|  | Design | $3-4$ |
| CS 149 | Parallel Computing | $3-4$ |
| CS 154 | Introduction to Automata and Complexity Theory | 3 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | $3-4$ |
| CS 166 | Data Structures | $3-4$ |
| CS 168 | The Modern Algorithmic Toolbox | $3-4$ |
| CS 221 | Artificial Intelligence: Principles and Techniques | $3-4$ |
| CS 224N | Natural Language Processing with Deep Learning | $3-4$ |
| CS 224S | Spoken Language Processing | $2-4$ |
| CS 224U | Natural Language Understanding | $3-4$ |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 240 | Advanced Topics in Operating Systems | 3 |


| CS 240E | (no longer offered) | $3-4$ |
| :--- | :--- | ---: |
| CS 240H | Programming Languages | 3 |
| CS 242 | Program Analysis and Optimizations | $3-4$ |
| CS 243 | Advanced Topics in Networking | $3-4$ |
| CS 244 | Distributed Systems | 3 |
| CS 244B |  | 3 |
| CS 244E | Mining Massive Data Sets | 3 |
| CS 246 | Introduction to Cryptography | 3 |
| CS 255 | Optimization and Algorithmic Paradigms | 3 |
| CS 261 | Beyond Worst-Case Analysis | 3 |
| CS 264 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 265 |  | 3 |
| CS 266 | Graph Algorithms | 3 |
| CS 267 | Incentives in Computer Science | 3 |
| CS 269I | Information Retrieval and Web Search | 3 |
| CS 276 | Computational Biology: Structure and Organization | 3 |
| CS 279 | of Biomolecules and Cells |  |
| CME 108 | Introduction to Scientific Computing | $3-4$ |
| EE 180 | Digital Systems Architecture | $3-4$ |
| EE 282 | Computer Systems Architecture | 3 |

## 8. Software Theory-

A.

CS 243 Program Analysis and Optimizations
B. Select at least one of the following:

| CS 244 | Advanced Topics in Networking |
| :--- | :--- |
| CS 245 | Database Systems Principles |
| CS 341 | Project in Mining Massive Data Sets |
| CS 343 | (Offered occasionally) |
| CS 345 | (Offered occasionally) |

C. Select at least two courses from the following:

CS 242 Programming Languages
CS 255 Introduction to Cryptography
CS 261 Optimization and Algorithmic Paradigms
CS 263 Algorithms for Modern Data Models
CS 264 Beyond Worst-Case Analysis
CS 265 Randomized Algorithms and Probabilistic Analysis
CS 266
CS 267 Graph Algorithms
CS 268 Geometric Algorithms
CS 355 (Not given this year)
CS 367 (Not given this year)

| D. A total of at least 27 units from (A), (B), (C), or the following: |  |
| :---: | :---: |
| CS 250 | Algebraic Error Correcting Codes |
| CS 251 | Bitcoin and Crypto Currencies |
| CS 294S | Research Project in Software Systems and Security (Not given this year) |
| CS 346 |  |
| CS 362 | (Not given this year) |
| CS 393 | Computer Laboratory* |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project * |

- Students with a 27 - or 21 -unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area (A) through (D) requirements above.

Students with a secondary area of specialization (per Option 2 above) in Software Theory need to take 5 total courses satisfying the area (A) through (D) requirements above.

## Software Theory Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | 3-4 |
| :---: | :---: | :---: |
| CS 140 | Operating Systems and Systems Programming | 3-4 |
| or CS 140E | Operating systems design and implementation |  |
| CS 147 | Introduction to Human-Computer Interaction Design | 3-5 |
| CS 148 | Introduction to Computer Graphics and Imaging | 3-4 |
| CS 149 | Parallel Computing | 3-4 |
| CS 154 | Introduction to Automata and Complexity Theory | 3-4 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 205A | Mathematical Methods for Robotics, Vision, and Graphics | 3 |
| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | 3-4 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 224U | Natural Language Understanding | 3-4 |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques | 3-4 |
| CS 229 | Machine Learning | 3-4 |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition | 3 |
| or CS 231B |  |  |
| CS 233 | Geometric and Topological Data Analysis | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E | (no longer offered) |  |
| CS 240H |  | 3-4 |
| CS 244B | Distributed Systems | 3 |
| CS 244E |  |  |
| CS 246 | Mining Massive Data Sets | 3-4 |
| CS 249A |  | 3 |
| CS 262 |  | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving | 3 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 274 | Representations and Algorithms for Computational 3 Molecular Biology |  |
| CS 276 | Information Retrieval and Web Search | 3 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CME 108 | Introduction to Scientific Computing | 3-4 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | 3-4 |
| EE 282 | Computer Systems Architecture | 3 |

## 9. Systems-

A.

CS 140 Operating Systems and Systems Programming **

| or CS 140E | Operating systems design and implementation |
| :--- | :--- |
| CS 144 | Introduction to Computer Networking** |
| CS 240 | Advanced Topics in Operating Systems |
| B. Select at least four of the following:  <br> CS 190  <br> CS 242 Programming Languages <br> CS 243 Program Analysis and Optimizations <br> CS 244 Advanced Topics in Networking <br> CS 245 Database Systems Principles <br> CS 248 Interactive Computer Graphics <br> CS 348B Computer Graphics: Image Synthesis Techniques <br> EE 271 Introduction to VLSI Systems <br> EE 282 Computer Systems Architecture |  |

C. A total of at least 27 units from categories (A), (B), and the following:

| CS 240E | (no longer offered) |
| :---: | :---: |
| CS 240H |  |
| CS 241 | Embedded Systems Workshop |
| CS 244B | Distributed Systems |
| CS 244E |  |
| CS 246 | Mining Massive Data Sets |
| CS 249A |  |
| CS 251 | Bitcoin and Crypto Currencies |
| CS 255 | Introduction to Cryptography |
| CS 262 |  |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving |
| CS 272 | Introduction to Biomedical Informatics Research Methodology |
| CS 276 | Information Retrieval and Web Search |
| CS 294S | Research Project in Software Systems and Security (Not given this year) |
| CS 315B | Parallel Computing Research Project |
| CS 316 | Advanced Multi-Core Systems |
| CS 340 | Topics in Computer Systems |
| CS 341 | Project in Mining Massive Data Sets |
| CS 343 | (Not given this year) |
| CS 344 | Topics in Computer Networks (CS 344 with any suffix) |
| CS 345 | (Offered occasionally) |
| CS 346 |  |
| CS 347 |  |
| CS 348A | Computer Graphics: Geometric Modeling \& Processing |
| CS 348C | Computer Graphics: Animation and Simulation |
| CS 349 | Topics in Programming Systems (CS 349 with any suffix) |
| CS 374 |  |
| CS 393 | Computer Laboratory * |
| CS 395 | Independent Database Project * |
| CS 399 | Independent Project * |
| CS 448 | Topics in Computer Graphics (CS 448 with any suffix) |
| EE 267 | Virtual Reality |
| EE 273 | Digital Systems Engineering |
| EE 382C | Interconnection Networks |
| EE 384A | Internet Routing Protocols and Standards |


| EE 384B | Multimedia Communication over the Internet (not <br> given this year) |
| :--- | :--- |
| EE 384C | Wireless Local and Wide Area Networks |
| EE 384S |  <br> Networks |

- Students with a 27 -unit depth option (Option 1 above) must take 27 units subject to satisfying the area (A), (B), and (C) requirements above.
- Students with a 21 -unit depth option (Option 2 above) must take that many units subject to satisfying the area (A) and (B) requirements above, and additional courses may be taken from area (C) if any courses in the area (A) requirement are waived.
- Students with a secondary area of specialization (per Option 2 above) in Systems need to take five courses; those courses must satisfy the area (A) requirement and additional courses may be taken from area (B).


## Systems Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | 3-4 |
| :---: | :---: | :---: |
| CS 147 | Introduction to Human-Computer Interaction Design | 3-5 |
| CS 154 | Introduction to Automata and Complexity Theory | 3-4 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 166 | Data Structures | 3-4 |
| CS 168 | The Modern Algorithmic Toolbox | 3-4 |
| CS 205A | Mathematical Methods for Robotics, Vision, and Graphics | 3 |
| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | 3-4 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 224U | Natural Language Understanding | 3-4 |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 228 | Probabilistic Graphical Models: Principles and Techniques | 3-4 |
| CS 229 | Machine Learning | 3-4 |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition | 3 |
| or CS 231B |  |  |
| CS 233 | Geometric and Topological Data Analysis | 3 |
| CS 234 | Reinforcement Learning | 3 |
| CS 261 | Optimization and Algorithmic Paradigms | 3 |
| CS 264 | Beyond Worst-Case Analysis | 3 |
| CS 265 | Randomized Algorithms and Probabilistic Analysis | 3 |
| CS 266 |  | 3 |
| CS 267 | Graph Algorithms | 3 |
| CS 268 | Geometric Algorithms | 3 |
| CS 2691 | Incentives in Computer Science | 3 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 274 | Representations and Algorithms for Computational Molecular Biology |  |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CME 108 | Introduction to Scientific Computing | 3-4 |

## C <br> A.

## 10. Theoretical Computer Science-

| CS 154 | Introduction to Automata and Complexity Theory ${ }^{\text {** }}$ |
| :--- | :--- |
| CS 261 | Optimization and Algorithmic Paradigms |

B. A total of at least 27 units from category (A) and the following:

CS 166 Data Structures
CS 168 The Modern Algorithmic Toolbox
CS $228 \quad$ Probabilistic Graphical Models: Principles and Techniques
CS 233 Geometric and Topological Data Analysis
CS 246 Mining Massive Data Sets
CS 250 Algebraic Error Correcting Codes
CS 251 Bitcoin and Crypto Currencies
CS 254 Computational Complexity
CS 255 Introduction to Cryptography
CS 262 Algorithms for Modern Data Models
CS 264 Beyond Worst-Case Analysis
CS 265 Randomized Algorithms and Probabilistic Analysis
CS 266 Graph Algorithms
CS 268 Geometric Algorithms
CS 269G Almost Linear Time Graph Algorithms
CS 269I Incentives in Computer Science
CS 334A Convex Optimization I
or EE 364A Convex Optimization I
CS $341 \quad$ Project in Mining Massive Data Sets
CS 345 (Offered occasionally)
CS 352 Pseudo-Randomness
CS 354 (Not given this year)
CS 355 (Not given this year)
CS 357 (Not given this year)
$\begin{array}{ll}\text { CS } 358 & \text { Topics in Programming Language Theory } \\ \text { CS } 359 & \text { Topics in the Theory of Computation }\end{array}$
CS 362 (Not given this year)
CS 364A
CS 366 (Not given this year)
CS 367 (Not given this year)
CS 368
CS 369 Topics in Analysis of Algorithms *
CS 374 (not given this year)
CS 393 Computer Laboratory *
CS 395 Independent Database Project *
CS 399 Independent Project *
CS 468 Topics in Geometric Algorithms: Machine Learning for 3D Data *
MS\&E 310 Linear Programming
MS\&E 319 Approximation Algorithms

- Multiple CS 359, CS 369, and/or CS 468 courses may be taken as long as they are each on different topics, denoted by different letter suffixes for the courses.
- Students with a 27 - or 21-unit depth option (Option 1 or 2 above) must take 27 or 21 units respectively subject to satisfying the area $(A)$ and $(B)$ requirements above.
- Students with a secondary area of specialization (per Option 2 above) in Theoretical Computer Science need to take 5 total courses satisfying the area $(A)$ and (B) requirements above.


## Theoretical Computer Science Breadth Courses

Students in the single depth specialization must complete three of the following breadth courses and receive a letter grade for each.

| CS 124 | From Languages to Information | 3-4 |
| :---: | :---: | :---: |
| CS 140 <br> or CS 140E | Operating Systems and Systems Programming Operating systems design and implementation | 3-4 |
| CS 143 | Compilers | 3-4 |
| CS 144 <br> or EE 284 | Introduction to Computer Networking Introduction to Computer Networks | 3-4 |
| CS 145 | Introduction to Databases | 3-4 |
| CS 147 | Introduction to Human-Computer Interaction Design | 3-5 |
| CS 148 | Introduction to Computer Graphics and Imaging | 3-4 |
| CS 149 | Parallel Computing | 3-4 |
| CS 155 | Computer and Network Security | 3 |
| CS 157 | Logic and Automated Reasoning | 3 |
| CS 205A | Mathematical Methods for Robotics, Vision, and Graphics | 3 |
| CS 221 | Artificial Intelligence: Principles and Techniques | 3-4 |
| CS 223A | Introduction to Robotics | 3 |
| CS 224N | Natural Language Processing with Deep Learning | 3-4 |
| CS 224S | Spoken Language Processing | 2-4 |
| CS 224U | Natural Language Understanding | 3-4 |
| CS 224W | Analysis of Networks | 3 |
| CS 227B | General Game Playing | 3 |
| CS 229 | Machine Learning | 3-4 |
| CS 231A | Computer Vision: From 3D Reconstruction to Recognition | 3 |
| or CS 231B |  |  |
| CS 234 | Reinforcement Learning | 3 |
| CS 240 | Advanced Topics in Operating Systems | 3 |
| CS 240E |  |  |
| CS 240H |  | 3-4 |
| CS 242 | Programming Languages | 3 |
| CS 243 | Program Analysis and Optimizations | 3-4 |
| CS 244 | Advanced Topics in Networking | 3-4 |
| CS 244B | Distributed Systems | 3 |
| CS 244E |  |  |
| CS 249A |  | 3 |
| CS 270 | Modeling Biomedical Systems: Ontology, Terminology, Problem Solving | 3 |
| CS 273A | The Human Genome Source Code | 3 |
| CS 274 | Representations and Algorithms for Computational Molecular Biology |  |
| CS 276 | Information Retrieval and Web Search | 3 |
| CS 279 | Computational Biology: Structure and Organization of Biomolecules and Cells | 3 |
| CME 108 | Introduction to Scientific Computing | 3-4 |
| CME 302 | Numerical Linear Algebra | 3 |
| EE 180 | Digital Systems Architecture | 3-4 |
| EE 282 | Computer Systems Architecture | 3 |

* With consent of faculty adviser.
** Students with equivalent course work may waive with approval of their adviser.


## Requirement 4

Additional elective units must be technical courses (numbered 100 or above) related to the degree program and approved by the adviser and MS program administrator. All CS courses numbered above 110 (with the exception of CS 196 and 198) taken for 3 or more units are pre-approved as elective courses. Additionally, up to a maximum of 3 units of 500 -level CS seminars, CS 300, EE 380, EE 385A, or other 1-2 unit seminars offered in the School of Engineering may be counted as electives. Elective courses may be taken on a satisfactory/no credit basis provided that a minimum of 36 graded units is presented within the 45 -unit program.

## Master of Science with Distinction in Research

A student who wishes to pursue the M.S. in CS with distinction in research must first identify a faculty adviser who agrees to supervise and support the research work. The research adviser must be a member of the Academic Council and must hold an appointment in Computer Science. The student and principal adviser must also identify another faculty member, who need not be in the Department of Computer Science, to serve as a secondary adviser and reader for the research report. In addition, the student must complete the following requirements beyond those for the regular M.S. in CS degree:

1. Research Experience-The program must include significant research experience at the level of a half-time commitment over the course of three academic quarters. In any given quarter, the half-time research commitment may be satisfied by a 50 percent appointment to a departmentally supported research assistantship, 6 units of independent study (CS 393, CS 395, or CS 399), or a prorated combination of the two (such as a 25 percent research assistantship supplemented by 3 units of independent study). This research must be carried out under the direction of the primary or secondary adviser.
2. Supervised Writing and Research-In addition to the research experience outlined in the previous requirement, students must enroll in at least 3 units of independent research (CS 393, CS 395, or CS 399) under the direction of their primary or secondary adviser. These units should be closely related to the research described in the first requirement, but focused more directly on the preparation of the research report described in the next section. The writing and research units described in parts (1) and (2) may be counted toward the 45 units required for the degree.
3. All independent study units (CS 393, CS 395, CS 399) must be taken for letter grades and a GPA of 3.0 (B) or better must be maintained.
4. Research Report-Students must complete a significant report describing their research and its conclusions. The research report represents work that is publishable in a journal or at a high-quality conference, although it is presumably longer and more expansive in scope than a typical conference paper. A copy of the research report must be submitted to the student services office in the department three weeks before the beginning of the examination period in the student's final quarter. Both the primary and secondary adviser must approve the research report before the distinction-in-research designation can be conferred.

## Master of Science in Computer Science Education

Candidates for the MS specialization in Computer Science Education will be admitted from a separate pool of applicants and will be eligible only for this specialization. The qualifications for admission are:

[^0]- Experience and evidence of excellence in college-level teaching
- Successful completion of a standard introductory programming sequence (CS 106B or equivalent)

Admitted candidates will complete the following courses (45 units) over the course of four quarters:

CS 103, Mathematical Foundations of Computing
CS 107, Computer Organization and Systems
CS 108, Object-oriented Systems Design
CS 109, Introduction to Probability for Computer Scientists
CS 110, Principles of Computer Systems
CS 161, Design and Analysis of Algorithms
CS 198, Teaching Computer Science
CS 208E, Great Ideas in Computer Science
Two CS elective courses and a final project
Admission: In addition to the strong academic preparation required for any graduate program at Stanford, we are looking for candidates who are excellent teachers and who are able to supply evidence of successful university teaching. Applicants should submit a list of courses taught along with the associated teaching evaluations. In addition, applicants should ask their recommenders to concentrate on teaching experience and expertise; recommendation letters that focus on research strengths will carry relatively little weight.

Applications to the MS specialization in Computer Science Education and all supporting documents must be submitted and received online by the published deadline. Information on admission requirements and deadlines is available on the department's web site (http:// cs.stanford.edu/admissions/.html).

## Joint M.S. and MBA Degree

The joint MS in Computer Science/MBA degree links two of Stanford University's world-class programs. This joint degree offers students an opportunity to develop advanced technical and managerial skills for a broader perspective on both existing technologies and new technology ventures.

Admission to the joint MSCS/MBA program requires that students apply and be accepted independently to both the Computer Science Department in the School of Engineering and the Graduate School of Business. Students may apply concurrently, or elect to begin their course of study in CS and apply to the GSB during their first year.

Additional information on the MS in Computer Science/MBA Joint Degree Program and its requirements is available on the department's web site (https://cs/academics/current-masters/joint-cs-msmba-degree).

## Joint M.S. and Law Degree

Law students interested in pursuing an M.S. in Computer Science must apply for admission to the Computer Science Department either (i) concurrently with applying to the Law School; or (ii) after being admitted to the Law School, but no later than the earlier of: (a) the end of the second year of Law School; or (b) the Computer Science Department's admission deadline for the year following that second year of Law School.

In addition to being admitted separately to the Law School and the Computer Science Department, students must secure permission from
both academic units to pursue degrees in those units as part of a joint degree program.
J.D./M.S. students may elect to begin their course of study in either the Law School or the Computer Science Department. Faculty advisors from each academic unit participate in the planning and supervising of the student's joint program. Students must be enrolled full-time in the Law School for the first year of law studies. Otherwise, enrollment may be in the graduate school or the Law School, and students may choose courses from either program regardless of where enrolled. Students must satisfy the requirements for both the J.D. degree as specified by the Law School and the M.S. degree as specified in this Bulletin.

The Law School approves courses from the Department of Computer Science that may count toward the J.D. degree, and the Computer Science Department approves courses from the Law School that may count toward the M.S. degree in Computer Science. In either case, approval may consist of a list applicable to all joint-degree students or may be tailored to each individual student program. No more than 45 units of approved courses may be counted toward both degrees. No more than 36 units of courses that originate outside the Law School may count toward the Law degree. To the extent that courses under this joint degree program originate outside of the Law School but count toward the Law degree, the Law School credits permitted under Section 17(1) of the Law School Regulations shall be reduced on a unit-per-unit basis, but not below zero. The maximum number of Law School credits that may be counted toward the M.S. in Computer Science is the greater of: (i) 12 units; or (ii) the maximum number of units from courses outside of the department that M.S. candidates in Computer Science are permitted to count toward the M.S. in the case of a particular student's individual program. Tuition and financial aid arrangements are normally through the school in which the student is then enrolled.

## Teaching and Research Assistantships in Computer Science

Graduate student assistantships are available. Half-time assistants receive a tuition scholarship for 8,9 , or 10 units per quarter during the academic year, and in addition receive a monthly stipend.

Duties for half-time assistants during the academic year involve approximately 20 hours of work per week. Course assistants (CAs) help an instructor teach a course by conducting discussion sections, consulting with students, and grading examinations. Research assistants (RAs) help faculty and senior staff members with research in computer science. Many MS students are hired to staff teaching and research assistantships. However, MS students should not plan on being appointed to an assistantship.

Students with fellowships may have the opportunity to supplement their stipends by serving as graduate student assistants.

## Doctor of Philosophy in Computer Science

The University's basic requirements for the Ph.D. degree are outlined in the "Graduate Degrees (http://exploredegrees.stanford.edu/ graduatedegrees)" section of this bulletin. Department requirements are stated below.

## Requirements

Applications to the Ph.D. program and all supporting documents must be submitted and received online by the published deadline. See the department's web site for admissions requirements and the application deadline (https://cs.stanford.edu/admissions/general-information). Changes or updates to the admission process are posted in September.

The following are general department requirements. Contact the Computer Science Ph.D. administrator for details.

1. A student should plan and complete a coherent program of study covering the basic areas of computer science and related disciplines. The student's adviser has primary responsibility for the adequacy of the program, which is subject to review by the Student Services Office.
2. The first year of the Ph.D. program is spent working with 1-3 different professors on a rotating basis. The intent is to allow the first-year Ph.D. student to work with a variety of professors before aligning with a permanent program adviser. Students who don't need the full year to find a professor to align with will have the option of aligning within the first or second quarter.
3. The CS 300 Departmental Lecture Series seminar gives faculty the opportunity to explain their research to first year CS Ph.D. students. First year CS Ph.D. students are required to attend $2 / 3$ of the classes to receive credit.
4. A student must complete 135 course units for graduation. Computer Science Ph.D. students take 8-10 units per quarter. Credit for coursework done elsewhere (up to the maximum of 45 course units) may be applied to graduation requirements. Students must also take at least three units of coursework from four different faculty members. There are NO courses specifically required by the CS Ph.D. program except for the 1 unit CS 300 Departmental Lecture Series and CS 499 Advanced Reading and Research or its equivalent. At least one course must be taken for a letter grade. A 3.0 GPA must be maintained.
5. Each student, to remain in the Ph.D. program, must satisfy the breadth requirement covering introductory-level graduate material in major areas of computer science. A student must fulfill two breadtharea requirements in each of three general areas by the end of the second year in the program. If students have fulfilled the six breadtharea requirements, and taken courses from at least four different faculty members, they are eligible to apply for candidacy prior to the second year in the program. An up-to-date list of courses that satisfy the breadth requirements (http://cs.stanford.edu/education/phd) can be found on the department's web site. The student must completely satisfy the breadth requirement by the end of the second year in the program and must pass a qualifying exam in the general area of their expected dissertation by the end of the third year in the program.
6. University policy requires that all doctoral students declare candidacy by the end of the sixth quarter in residence, excluding summers. However, after aligning with a permanent adviser, passing six breadth requirements, and taking classes with four different faculty, a student is eligible to file for candidacy prior to the sixth quarter. The candidacy form serves as a "contract" between the department and the student. The department acknowledges that the student is a bona fide candidate for the Ph.D. and agrees that the program submitted by the student is sufficient to warrant granting the Ph.D. upon completion. Candidacy expires five years from the date of submission of the candidacy form, rounded to the end of the quarter. In special cases, the department may extend a student's candidacy, but is under no obligation to do so.
7. Each student is required to pass a qualifying exam in their area by the end of their third year in the program. A student may only take the qualifying exam twice. If the student fails the qualifying exam a second time, the Ph.D. program committee is convened to discuss the student's lack of reasonable academic progress. Failing the exam a second time is cause for dismissal from the Computer Science Ph.D. program and the committee meets to discuss the final outcome for the student.
8. As part of the training for the Ph.D., the student is also required to complete at least four units (a unit is ten hours per week for one quarter) as a course assistant or instructor for courses in Computer Science numbered 100 or above.
9. The Reading Committee form and Oral Thesis Proposal must be submitted within one year of passing the qualifying exam.
10. The Oral Thesis Proposal must be submitted before the end of the fourth year.
11. The most important requirement is the dissertation. After passing the required qualifying examination, each student must secure the agreement of a member of the department faculty to act as the dissertation adviser. The dissertation adviser is often the student's program adviser.
12. The student must pass a University oral examination in the form of a defense of the dissertation. This is typically held after all or a substantial portion of the dissertation research has been completed.
13. The student is expected to demonstrate the ability to present scholarly material orally in the dissertation defense.
14. The dissertation must be accepted by a reading committee composed of the principal dissertation adviser, a second member from within the department, and a third member chosen from within or outside of the University. The department requires at least two committee members to be affiliated with the Computer Science department. The principal adviser and at least one of the other committee members must be Academic Council members.

## Guidelines for Reasonable Progress

By the end of the first academic year, a student should be aligned with a permanent research advisor.

By Spring Quarter of the second year, a student should complete all six breadth area requirements, two breadth area requirements in each of three areas, and file for candidacy.

By Spring Quarter of the third year, a student should pass a Qualifying Examination (https://cs.stanford.edu/academics/phd/qualifying-exams) in the area of his or her intended dissertation.

Within one year of passing the Qualifying Examination, a student should submit a signed Reading Committee Form (https:// stanford.app.box.com/v/docdiss-reading-committee-form). By Spring Quarter of the fourth year, a student should submit the Thesis Proposal Form (http://cs.stanford.edu/degrees/phd/PhD/ ThesisProposalForm.pdf).

The teaching requirement may be satisfied at any time. The research requirement is routinely satisfied by participation in research throughout the student's career.

## Ph.D. Minor in Computer Science

For a minor in Computer Science, a candidate must complete 20 units of Computer Science coursework numbered 200 or above, except for the 100 -level courses listed on the Ph.D. Minor Worksheet (http:// cs.stanford.edu/degrees/phd/admissions/Worksheet.pdf) (pdf). At least three of the courses must be master's core courses to provide breadth and one course numbered 300 or above to provide depth. One of the courses taken must include a significant programming project to demonstrate programming efficiency. Courses must be taken for a letter grade and passed with a grade of 'B' or better. Applications for a minor in Computer Science are submitted at the same time as admission to candidacy.

Emeriti (Professors): Tom Binford, Edward Feigenbaum (http://kslweb.stanford.edu/people/eaf), Richard Fikes (http://www.stanford.edu/ ~fikes), Donald E. Knuth (http://www-cs-faculty.stanford.edu/~knuth)*, Jean-Claude Latombe (http://robotics.stanford.edu/~latombe), Marc Levoy (http://graphics.stanford.edu/~levoy)*, Zohar Manna, Teresa Meng (http://dualist.stanford.edu/~thm), William F. Miller, Nils J. Nilsson (http://robotics.stanford.edu/~nilsson), Serge Plotkin (http://trollw.stanford.edu/plotkin), Vaughan Pratt (http://boole.stanford.edu/ pratt.html)*, Eric Roberts (http://cs.stanford.edu/people/eroberts)*, Yoav Shoham (http://robotics.stanford.edu/~shoham), Jeffrey D. Ullman (http://infolab.stanford.edu/~ullman), Gio Wiederhold
(http://infolab.stanford.edu/people/gio.html), Terry Winograd (http:// hci.stanford.edu/winograd), Ken Salisbury (https://profiles.stanford.edu/ john-salisbury), David Dill (https://profiles.stanford.edu/david-dill)*

Chair: Alex Aiken (http://theory.stanford.edu/~aiken)
Associate Chair for Education: Mehran Sahami (http:// robotics.stanford.edu/users/sahami/bio.html)

Professors: Maneesh Agrawala (http://graphics.stanford.edu/ ~maneesh), Alex Aiken (http://theory.stanford.edu/~aiken), Serafim Batzoglou (http://www.serafimb.org/people.html), Dan Boneh (http:// crypto.stanford.edu/~dabo), Moses Charikar, David Cheriton (http:// www.stanford.edu/~cheriton), David Dill (http://verify.stanford.edu/ dill), Ronald P. Fedkiw (http://physbam.stanford.edu/~fedkiw), Hector Garcia-Molina (http://infolab.stanford.edu/people/hector.html), Leonidas J. Guibas (http://geometry.stanford.edu/member/guibas), Patrick Hanrahan (http://www-graphics.stanford.edu/~hanrahan), John Hennessy, Mark A. Horowitz (http://www-vlsi.stanford.edu/ ~horowitz), Doug James (http://www.cs.cornell.edu/~djames), Dan Jurafsky (http://web.stanford.edu/~jurafsky), Oussama Khatib (http:// robotics.stanford.edu/~ok), Monica Lam (http://suif.stanford.edu/ ~lam), James Landay (https://profiles.stanford.edu/james-landay), Nick McKeown (http://tiny-tera.stanford.edu/~nickm), Christopher Manning (http://nlp.stanford.edu/~manning), David Mazieres (http:// www.scs.stanford.edu/~dm), John Mitchell (http://theory.stanford.edu/ people/jcm/home.html), Kunle Olukotun (http://ogun.stanford.edu/ ~kunle), John Ousterhout (http://www.stanford.edu/~ouster/cgibin/home.php), Balaji Prabhakar (http://www.stanford.edu/~balaji), Omer Reingold (https://profiles.stanford.edu/omer-reingold), Mendel Rosenblum (http://web.stanford.edu/~mendel), Jennifer Widom (http://infolab.stanford.edu/~widom), Tim Roughgarden (http:// theory.stanford.edu/~tim), Subhasish Mitra (http://www.stanford.edu/ ~subh)

Associate Professors: Gill Bejerano (http://bejerano.stanford.edu), Ron Dror (http://cs.stanford.edu/people/rondror), Dawson Engler (http://www.stanford.edu/~engler), Michael Genesereth (http:// logic.stanford.edu/people/genesereth/genesereth.html), Christoforos Kozyrakis (http://csl.stanford.edu/~christos), Jure Leskovec (http:// cs.stanford.edu/people/jure), Philip Levis (http://csl.stanford.edu/ ~pal), Fei-Fei Li (http://vision.stanford.edu), Christopher Re (http://cs.stanford.edu/people/chrismre), Silvio Savarese (http:// cvgl.stanford.edu/silvio), Sachin Katti (http://web.stanford.edu/~skatti), Noah Goodman (http://cocolab.stanford.edu/ndg.html)

Assistant Professors: Michael Bernstein (http://people.csail.mit.edu/ msbernst), Stefano Ermon (http://cs.stanford.edu/~ermon), Anshul Kundaje (https://sites.google.com/site/anshulkundaje), Percy Liang (http://cs.stanford.edu/~pliang), Greg Valiant (http:// theory.stanford.edu/~valiant), Keith Winstein (http://web.mit.edu/ keithw), Mary Wootters, Matei Zaharia, Emma Brunskill (https:// profiles.stanford.edu/emma-brunskill?tab=bio), Jeannette Bogh, Dorsa Sadigh, Kayvon Fatahalian

Professors (Research): Clark Barrett (http://www.cs.nyu.edu/ ~barrett), William J. Dally (http://cva.stanford.edu/ billd_webpage_new.html),

Professor (Teaching): Mehran Sahami (http://robotics.stanford.edu/users/ sahami/bio.html)

Associate Professor (Teaching):
Courtesy Professors: Russ Altman (http://bmir.stanford.edu/people/ view.php/russ_b_altman), Stephen Boyd (http://www.stanford.edu/ ~boyd), Patrick Hayden, Michael Levitt, Roy Pea

Courtesy Associate Professors: Ashish Goel (http://www.stanford.edu/ ~ashishg), Justin Grimmer, Allison Okamura, Chris Potts, Ge Wang (https://ccrma.stanford.edu/~ge),

Courtesy Assistant Professors: John Duchi, Sean Follmer, Sharad Goel, Thomas Icard, Ramesh Johari, Mykel Kochenderfer (http://mykel.kochenderfer.com), Stephen Montgomery (http:// montgomerylab.stanford.edu), Camille Utterback, Gordon Wetzstein, Aaron Sidford, Dan Yamins, James Zou

Lecturers: Gerald Cain, Chris Gregg, Victoria Kirst, Cynthia Lee, Nicholas J. Parlante (http://www-cs-faculty.stanford.edu/~nick), Chris Piech, Keith Schwarz, Marty Stepp (http://www.martystepp.com), Patrick Young (http://www.stanford.edu/~psyoung), Julie Zelenski (http://www-csfaculty.stanford.edu/~zelenski)

Adjunct Professors: Pei Cao, Stuart Card, Tom Dean, Daphne Koller, P. Pandurang Nayak, Andrew Ng (http://www.andrewng.org), Bill MacCartney (http://nlp.stanford.edu/~wcmac), Sebastian Thrun (http:// robots.stanford.edu)

Visiting Professors:Thomas Funkhouser
Visiting Assistant Professors:
Secondary Appointment in CS: Anshul Kundaje

* Recalled to active duty.


[^0]:    - A doctorate in an academic discipline other than Computer Science

