MANAGEMENT SCIENCE AND ENGINEERING

Courses offered by the Department of Management Science and Engineering are listed under the subject code MS&E on the Stanford Bulletin's ExploreCourses web site.

The Department of Management Science and Engineering leads at the interface of engineering, business, and public policy. The department's mission is, through education and research, to advance the design, management, operation, and interaction of technological, economic, and social systems. The department's engineering research strength is integrated with its educational program at the undergraduate, master's, and doctoral levels: graduates of the program are trained as engineers and future leaders in technology, policy, and industry. Research and teaching activities are complemented by an outreach program that encourages the transfer of ideas to the environment of Silicon Valley and beyond.

Management Science and Engineering (MS&E) provides programs of education and research by integrating three basic strengths:

1. depth in conceptual and analytical foundations
2. comprehensive coverage of functional areas of application
3. interaction with other Stanford departments, Silicon Valley industry, and organizations throughout the world.

The analytical and conceptual foundations include decision and risk analysis, dynamic systems, economics, optimization, organizational science, and stochastic systems. The functional areas of application include entrepreneurship, finance, information, marketing, organizational behavior, policy, production, and strategy. Close associations with other engineering departments and with industry enrich the programs by providing opportunities to apply MS&E methods to important problems and by motivating new theoretical developments from practical experience. MS&E's programs also provide a basis for contributing to other areas such as biotechnology, defense policy, environmental policy, information systems, and telecommunication.

Mission of the Undergraduate Program in Management Science and Engineering

The mission of the undergraduate program in Management Science and Engineering is to provide students with the fundamentals of engineering systems analysis so that they are able to plan, design, and implement complex economic and technical management systems. The program builds on the foundational courses for engineering including calculus, engineering fundamentals, and physics or chemistry as well as management science. Students complete core courses in accounting, computer science, economics, ethics, organizational theory, mathematical modeling, optimization, probability, and statistics. To personalize their exploration, students select additional courses from different areas of the department, with greater emphasis in one of them. The major prepares students for a variety of career paths, including investment banking, management consulting, facilities and process management, or for graduate school in industrial engineering, operations research, business, economics, law, medicine, or public policy.

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:

1. to apply the knowledge of mathematics, science, and engineering;
2. to design and conduct experiments;
3. to design a system or components to meet desired needs;
4. to identify, formulate, and solve engineering problems;
5. to use techniques, skills, and modern engineering tools necessary for engineering practice;
6. to function on multidisciplinary teams;
7. to communicate effectively;
8. to recognize the need for and demonstrate an ability to engage in lifelong learning;
9. to obtain the background necessary for admission to top professional graduate engineering or business programs;
10. to understand professional and ethical responsibility;
11. to obtain the broad education necessary to understand the impact of engineering solutions in a global and societal context; and
12. to obtain a knowledge of contemporary issues pertinent to the field of management science and engineering.

Graduate Programs in Management Science and Engineering

MS&E offers programs leading to the degrees of Master of Science and Doctor of Philosophy. The department also offers a coterminal B.S./M.S. degree, a dual master's degree in cooperation with each of the other departments in the School of Engineering, and joint master's degrees with the School of Law and the Public Policy Program.

For University coterminal degree program rules and University application forms, see the Registrar's coterminal degrees web site (http://studentaffairs.stanford.edu/registrar/publications/#Coterm).

Applicants for admission as graduate students in MS&E must submit the results of the verbal, quantitative, and analytical parts of the Graduate Record Examination. The deadline for application to the doctoral program is December 5, 2017, and the deadline for application to the master's program is January 16, 2018.

Except in unusual circumstances, admission is limited to the Autumn Quarter because courses are arranged sequentially with basic courses and prerequisites offered early in the academic year.

Assistantships and Fellowships

A limited number of fellowships and assistantships are awarded each year. Applicants admitted to the doctoral program, who have indicated on their application that they would like to be considered for financial aid, are automatically considered for these assistantships and fellowships. New and returning master's students may apply for course assistantships each quarter, but priority is given to MS&E doctoral students.

Information about loan programs and need-based aid for U.S. citizens and permanent residents can be obtained from the Financial Aid Office.

Learning Outcomes (Graduate)

The M.S. prepares engineers for a lifelong career addressing the critical technical and managerial needs of private and public organizations. The program emphasizes developing analytic abilities, making better decisions, developing and executing strategies while also leading people who innovate. Unlike an MBA, our master’s program addresses the technical as well as the behavioral challenges of running organizations and complex systems. We emphasize quantitative analytic skills and an entrepreneurial spirit.

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 Management Science and Engineering and related fields.

**Careers in MS&E**

MS&E students are candidates for careers in consulting, product and project management, financial analysis, and work in policy arenas. A significant number join or found start-ups. Many have become leaders in technology-based businesses which have an increasing need for analytically oriented people who understand both business and technology. Other graduates make careers tackling the problems faced by local, national, and international governments by developing new healthcare systems, new energy systems and a more sustainable environment. The major problems of the day demand an ability to integrate the technical, social and economic ways of thinking. This is precisely what the department educates its students to do.

**Bachelor of Science in Management Science and Engineering**

The program leading to the B.S. degree in Management Science and Engineering (MS&E) is outlined in the School of Engineering section of this bulletin; more information is contained in the School of Engineering’s *Handbook for Undergraduate Engineering Programs*. Students are encouraged to plan their academic programs as early as possible, ideally in the freshman or sophomore year. Students should not wait until they are declaring a major to consult with the department’s student services staff. This is particularly important for students who would like to study overseas or pursue another major or minor.

The undergraduate curriculum in Management Science and Engineering provides students training in the fundamentals of engineering systems analysis to prepare them to plan, design, and implement complex economic and technological management systems where a scientific or engineering background is necessary or desirable. The major prepares students for a variety of career paths, including investment banking, management consulting, facilities and process management, or for graduate school in industrial engineering, operations research, business, economics, law, medicine, or public policy.

The educational objectives of the undergraduate degree program are:

- **Principles and Skills**—provide students with a basic understanding of management science and engineering principles, including analytical problem solving and communications skills.
- **Preparation for Practice**—prepare students for practice in a field that sees rapid changes in tools, problems, and opportunities.
- **Preparation for Continued Growth**—prepare students for graduate study and self development over an entire career.
- **Preparation for Service**—develop in students the awareness, background, and skills necessary to become responsible citizens, employees, and leaders.

See also the department’s undergraduate Learning Outcomes (p. ) for additional learning objectives.

The program builds on the foundational courses for engineering, including calculus, mathematical modeling, probability, statistics, engineering fundamentals, and physics or chemistry.

Students interested in a minor should see the Minor tab in this section.

MS&E also participates with the departments of Computer Science, Mathematics, and Statistics in a program leading to a B.S. in Mathematical and Computational Science. See the "Mathematical and Computational Science (http://exploreddegrees.stanford.edu/schoolofhumanitiesandsciences/#bachelorstext)” section of this bulletin.

**Core**

The department core, taken for all areas, includes courses in accounting, computer science, deterministic optimization, economics, organization theory, and a capstone senior project. Through the core, students in the program are exposed to the breadth of faculty interests, and are in a good position to choose an area during the junior year.

**Areas**

The major is designed to allow a student to explore all three areas of the department in greater depth.

1. **Finance and Decision**: focuses on the design and analysis of financial and strategic plans.
2. **Operations and Analytics**: focuses on algorithms, theory, and the design and analysis of manufacturing, production, and service systems.
3. **Organizations, Technology, and Policy**: focuses on understanding, design, and analysis of organizations and public policy, particularly technology-based issues.

**Management Science and Engineering (MS&E)**

Completion of the undergraduate program in Management Science and Engineering leads to the conferral of the Bachelor of Science in Management Science and Engineering.

**Requirements**

<table>
<thead>
<tr>
<th>Mathematics and Science</th>
<th>Units</th>
</tr>
</thead>
<tbody>
<tr>
<td>All required; see SoE Basic Requirements 1 and 2</td>
<td>23</td>
</tr>
<tr>
<td>CME 100 or MATH 51</td>
<td>Vector Calculus for Engineers</td>
</tr>
<tr>
<td>Linear Algebra and Differential Calculus of Several Variables</td>
<td></td>
</tr>
<tr>
<td>CME 103</td>
<td>Introduction to Matrix Methods</td>
</tr>
<tr>
<td>MS&amp;E 120</td>
<td>Probabilistic Analysis</td>
</tr>
<tr>
<td>MS&amp;E 121</td>
<td>Introduction to Stochastic Modeling</td>
</tr>
<tr>
<td>MS&amp;E 125</td>
<td>Introduction to Applied Statistics</td>
</tr>
<tr>
<td>Select one of the following sequences:</td>
<td>8</td>
</tr>
<tr>
<td>CHEM 31B &amp; CHEM 33</td>
<td>Chemical Principles II and Structure and Reactivity of Organic Molecules</td>
</tr>
<tr>
<td>CHEM 31X &amp; CHEM 33</td>
<td>Chemical Principles Accelerated and Structure and Reactivity of Organic Molecules</td>
</tr>
<tr>
<td>PHYSICS 21 &amp; PHYSICS 23 &amp; PHYSICS 22</td>
<td>Mechanics, Fluids, and Heat and Electricity, Magnetism, and Optics and Mechanics, Fluids, and Heat Laboratory</td>
</tr>
<tr>
<td>PHYSICS 24</td>
<td>Electricity, Magnetism, and Optics Laboratory</td>
</tr>
<tr>
<td>PHYSICS 41</td>
<td>Mechanics</td>
</tr>
<tr>
<td>PHYSICS 43</td>
<td>Electricity and Magnetism</td>
</tr>
<tr>
<td>Electives from SoE approved math or science lists or AP/IB credit</td>
<td>13</td>
</tr>
</tbody>
</table>

**Technology in Society**

Select one of the following; see SoE Basic Requirement 4

- COMM 120W | Digital Media in Society |
- CS 181 | Computers, Ethics, and Public Policy |
- ENGR 131 | Ethical Issues in Engineering |
- MS&E 193 | Technology and National Security |
- STS 1 | The Public Life of Science and Technology |

**Engineering Fundamentals**

Two courses; see SoE Basic Requirement 3

- Computer Science Fundamentals
- Engineering Fundamentals
Select one of the following:

- ENGR 10  Introduction to Engineering Analysis
- ENGR 14  Intro to Solid Mechanics
- ENGR 15  Dynamics
- ENGR 20  Introduction to Chemical Engineering
- ENGR 25B  Biotechnology
- ENGR 25E  Energy: Chemical Transformations for Production, Storage, and Use
- ENGR 40  Introductory Electronics
- ENGR 40A  Introductory Electronics
- ENGR 40M  An Intro to Making: What is EE
- ENGR 50  Introduction to Materials Science, Nanotechnology Emphasis
- ENGR 50E  Introduction to Materials Science, Energy Emphasis
- ENGR 50M  Introduction to Materials Science, Biomaterials Emphasis
- ENGR 80  Introduction to Bioengineering (Engineering Living Matter)
- ENGR 90  Environmental Science and Technology

**Engineering Depth**

**Core Courses (all six required)** 25-27

- CS 106B  Programming Abstractions
- or CS 106X  Programming Abstractions (Accelerated)
- ECON 50  Economic Analysis I
- MS&E 108  Senior Project (WIM)
- MS&E 111  Introduction to Optimization
- or MS&E 111X  Introduction to Optimization (Accelerated)
- MS&E 140  Accounting for Managers and Entrepreneurs
- or MS&E 140X  Financial Accounting Concepts and Analysis
- MS&E 180  Organizations: Theory and Management

**Area Courses (see below)** 27

Choose four or five courses (minimum 15 units) from a primary area and two courses (minimum 6 units) from each of the other two areas.

**Depth Areas**

**Finance and Decision Area**

Students choosing F&D as their primary area must take at least two of ECON 51, MS&E 145 (or 245A), and MS&E 152 (or 252), as part of their 15 units

- Introductory (no prerequisites)
  - MS&E 147  Finance and Society for non-MBAs
  - MS&E 152  Introduction to Decision Analysis

- Intermediate (has prerequisites and/or appropriate for juniors and seniors)
  - MS&E 145  Introduction to Investment Science
  - MS&E 146  Corporate Financial Management
  - MS&E 252  Decision Analysis I: Foundations of Decision Analysis

- Advanced (intended primarily for graduate students, but may be taken by advanced undergraduates)
  - MS&E 245A  Investment Science
  - MS&E 246  Financial Risk Analytics
  - MS&E 250A  Engineering Risk Analysis
  - MS&E 250B  Project Course in Engineering Risk Analysis
  - MS&E 245B  Advanced Investment Science

**Operations and Analytics Area**

Students choosing O&A as their primary area may also include CS 161, CS 229, and STATS 202 in their selections

- Introductory (no prerequisites)
  - MS&E 112  Mathematical Programming and Combinatorial Optimization
  - MS&E 135  Networks
  - MS&E 213  Introduction to Optimization Theory
  - MS&E 223  Simulation
  - MS&E 226  “Small” Data
  - MS&E 231  Introduction to Computational Social Science
  - MS&E 237  Networks, Markets, and Crowds
  - MS&E 251  Stochastic Control

- Advanced (has prerequisites and/or appropriate for juniors and seniors)
  - MS&E 130  Information Networks and Services
  - MS&E 233  Networked Markets
  - MS&E 234  Data Privacy and Ethics
  - MS&E 235  Analytics in Action
  - MS&E 260  Introduction to Operations Management
  - MS&E 262  Supply Chain Management
  - MS&E 263  Healthcare Operations Management
  - MS&E 267  Service Operations and the Design of Marketplaces
  - MS&E 330  Law, Order & Algorithms

**Organizations, Technology, and Policy Area**

Students choosing O&T&P as their primary area must take at least two of ENGR 145, MS&E 175, MS&E 184, and MS&E 185 as part of their 15 units

- Introductory (no prerequisites)
  - MS&E 131  Ethical Issues in Engineering
  - MS&E 190  Methods and Models for Policy and Strategy Analysis
  - MS&E 193  Technology and National Security

- Advanced (has prerequisites and/or appropriate for juniors and seniors)
  - ENGR 145  Technology Entrepreneurship
  - MS&E 175  Innovation, Creativity, and Change
  - or MS&E 177  Creativity Rules
  - MS&E 183  Leadership in Action
  - MS&E 184  New Directions in the Psychology of Technology and Work
  - MS&E 185  Global Work
  - MS&E 188  Organizing for Good
  - MS&E 243  Energy and Environmental Policy Analysis
  - MS&E 292  Health Policy Modeling
  - MS&E 294  Climate Policy Analysis
  - MS&E 295  Energy Policy Analysis
Courses used to satisfy the Math, Science, Technology in Society, or Engineering Fundamental requirement may not also be used to satisfy an engineering depth requirement.

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

Management Science and Engineering (MS&E) Minor

The following courses are required to fulfill the minor requirements:

<table>
<thead>
<tr>
<th>Background requirements (two courses)</th>
<th>Units</th>
</tr>
</thead>
<tbody>
<tr>
<td>CME 100 Vector Calculus for Engineers</td>
<td>5</td>
</tr>
<tr>
<td>or MATH 51 Linear Algebra and Differential Calculus of Several Variables</td>
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</tr>
<tr>
<td>CS 106A Programming Methodology</td>
<td>5</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Minor requirements (seven courses, letter-graded)</th>
<th>Units</th>
</tr>
</thead>
<tbody>
<tr>
<td>MS&amp;E 111 Introduction to Optimization</td>
<td>3-4</td>
</tr>
<tr>
<td>or MS&amp;E 111X Introduction to Optimization (Accelerated)</td>
<td></td>
</tr>
<tr>
<td>MS&amp;E 120 Probabilistic Analysis</td>
<td>5</td>
</tr>
<tr>
<td>MS&amp;E 121 Introduction to Stochastic Modeling</td>
<td>4</td>
</tr>
<tr>
<td>MS&amp;E 125 Introduction to Applied Statistics</td>
<td>4</td>
</tr>
<tr>
<td>MS&amp;E 180 Organizations: Theory and Management</td>
<td>4</td>
</tr>
<tr>
<td>Electives (select any two 100- or 200-level MS&amp;E courses)</td>
<td>6</td>
</tr>
</tbody>
</table>

Recommended courses:

In addition to the required background and minor courses, it is recommended that students also take the following courses.

<table>
<thead>
<tr>
<th>Units</th>
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</thead>
<tbody>
<tr>
<td>5</td>
</tr>
<tr>
<td>2-4</td>
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<tr>
<td></td>
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</tbody>
</table>

Coterminal Program in Management Science and Engineering

This program allows Stanford undergraduates an opportunity to work simultaneously toward a B.S. in Management Science and Engineering or another quantitative major, and an M.S. in Management Science and Engineering.

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)” 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.

Master of Science in Management Science and Engineering

The M.S. degree programs require a minimum of 45 units beyond the equivalent of a B.S. degree at Stanford. All programs represent substantial progress in the major field beyond the bachelor's degree.

University requirements for the master’s degree are described in the "Graduate Degrees (http://exploredegrees.stanford.edu/graduatedegrees)" section of this bulletin.

The master’s in Management Science and Engineer prepares engineers for a lifelong career addressing the technical and managerial needs of private and public organizations. The program emphasizes developing analytic abilities, making better decisions, and developing and executing strategies while also leading people who innovate. Unlike an M.B.A., the department's master’s program addresses the technical as well as the behavioral challenges of running organizations and complex systems, emphasizing quantitative analytic skills and an entrepreneurial spirit.

MS&E students know math, engineering, as well as behavioral science. They can conduct experiments to design better systems, organizations and work processes. They understand how to analyze data to solve real world problems. They can develop mathematical and computational models to inform action. They know how to surface and examine unarticulated assumptions and root causes. These students can communicate effectively in the team environments found in so many contemporary organizations.

MS&E master’s students have breadth as well as depth. All are required to develop competence in optimization and analytics, organizations and decisions, and probability. In addition every student pursues a specialty in one of six areas:

1. Financial Analytics: Students who concentrate in Financial Analytics are prepared for careers requiring analytical rigor and the ability to innovate around market challenges. Example career paths include financial services, risk management, investment management, financial technology and data processing, financial regulation and policy, exchanges and clearing houses, and auditing and compliance. The concentration combines the in-depth study of quantitative techniques with practical, hands-on business problem solving. Students learn to use mathematical models and quantitative tools to solve complex problems in finance practice. The concentration exploits the intellectual ties between finance, operations research, computer science, and engineering. It offers a high level of flexibility and a range of elective courses that allow students to tailor the program to their specific career goals. Required courses immerse students in quantitative methods and deepen their understanding of finance fundamentals. Projects courses feature practical, data-driven team projects and case studies, fostering group learning and interaction with peers.

2. Operations and Analytics: Students following the Operations and Analytics track become prepared in the fundamentals and applications that are critical to careers in a fields ranging from operations management in the service, health care, production, manufacturing, computer, telecommunications, banking, industries to modern Silicon Valley information technology and data analytics. The program emphasizes a balance between the technical rigor of methodologies with lasting value and insightful modern applications and design challenges in a variety of established and emerging industries and operations environments. It offers a portfolio
of courses in probabilistic modeling, optimization, simulation, algorithms, data science, networks, markets, and corresponding applications.

3. Technology and Engineering Management: Students who concentrate in Technology and Engineering Management are prepared for careers including product and project management, management consulting, and entrepreneurship. They acquire skills to manage technical organizations, foster innovation, and deal with rapidly evolving technologies and dynamic markets. Specialized coursework is flexible, allowing students to explore and gain depth, understanding technical organizations to develop a culture of successful innovation and entrepreneurship, along with methods for decision making under uncertainty, financial analysis, and strategic planning.

4. Computational Social Science: The Computational Social Science track teaches students how to apply rigorous statistical and computational methods to address problems in economics, sociology, political science, and beyond. The program prepares students for a diverse set of career paths in data science, information technology, and policy analysis. The core coursework covers fundamental statistical concepts, large-scale computation, and network analysis. Through electives, students can explore topics such as experimental design, algorithmic economics, and machine learning.

5. Decision and Risk Analysis: Students who specialize in Decision and Risk Analysis are prepared for careers including management consulting, policy analysis, and risk management, applying engineering systems analysis to tackle complex economic and technical management problems in the private and public sectors. They acquire the skills to identify and develop opportunities in uncertain situations while recognizing and hedging the downside risks. Specialized course work includes the methodological foundations for modeling in dynamic uncertain environments to value and manage uncertain opportunities and risks, applications to public policy, and an opportunity to work on a client project under faculty guidance.

6. Energy and Environment: The Energy and Environment track is designed for students interested in energy and environmental issues from the perspectives of public policy, nongovernmental organizations, or corporations. This track includes core courses; courses in economic analysis, energy resources, and energy/environmental policy analysis; and an individually designed concentration, typically emphasizing policy, strategy, or technology. Seminars provide insights into current corporate strategy, public policy, and research community developments. Energy/environmental project courses give practice in applying methodologies and concepts.

7. Health Systems Modeling: The Health Systems Modeling track is designed for students interested in healthcare operations and policy. The courses in this track emphasize the application of mathematical and economic analysis to problems in public health policy and the design and operation of healthcare services.

The master’s degree is designed to be a terminal degree program with a professional focus. The M.S. degree can be earned in one academic year (three academic quarters) of full-time work, although most students choose to complete the program in five academic quarters, or eighteen months, and work as an intern in the Summer Quarter.

Background Requirements
Students are expected to have completed both MATH 51 Linear Algebra and Differential Calculus of Several Variables, or an equivalent multivariable differential calculus course, and CS 106A Programming Methodology, or an equivalent general programming course, before beginning graduate study. These courses do not count toward degree requirements.

Degree Requirements
Students must take a minimum of 45 course units as follows:

• Three core courses (9-12 units)
• A primary or specialized concentration (12-24 units)
• One project course or two integrated project courses (0-8 units)
• Elective courses (1-24 units; see restrictions below)

Core Courses (three courses required) Optimization and Analytics (select one)

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 211</td>
<td>Introduction to Optimization</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 211X</td>
<td>Introduction to Optimization (Accelerated)</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 226</td>
<td>&quot;Small&quot; Data</td>
</tr>
</tbody>
</table>

Relevant 200 or 300 level MS&E course in optimization or analytics if a comparable introductory course in optimization or analytics has already been completed.

Organizations and Decisions (select one)

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 252</td>
<td>Decision Analysis I: Foundations of Decision Analysis</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 270</td>
<td>Strategy in Technology-Based Companies</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 280</td>
<td>Organizational Behavior: Evidence in Action</td>
</tr>
</tbody>
</table>

Relevant 200 or 300 level MS&E course in organizations or decisions if a comparable introductory course in organizations or decisions has already been completed.

Probability (select one)

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 220</td>
<td>Probabilistic Analysis</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 221</td>
<td>Stochastic Modeling</td>
</tr>
</tbody>
</table>

Relevant 200 or 300 level MS&E course in probability or stochastics if a comparable introductory course in probability or stochastics has already been completed.

Primary Concentrations

Financial Analytics Concentration (five courses required)

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 245A</td>
<td>Investment Science</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 245B</td>
<td>Advanced Investment Science</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 246</td>
<td>Financial Risk Analytics</td>
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</tbody>
</table>

Quantitative Methods (two required): Select one (whichever wasn’t taken for core):

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 211</td>
<td>Introduction to Optimization</td>
</tr>
<tr>
<td></td>
<td>or MS&amp;E 211X</td>
<td>Introduction to Optimization (Accelerated)</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 226</td>
<td>&quot;Small&quot; Data</td>
</tr>
</tbody>
</table>

Select one:

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 223</td>
<td>Simulation</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 245B</td>
<td>Advanced Investment Science (if not used above)</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 246</td>
<td>Financial Risk Analytics (if not used above)</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 322</td>
<td>Stochastic Calculus and Control</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 349</td>
<td>Financial Statistics</td>
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<tr>
<td></td>
<td>STATS 207</td>
<td>Introduction to Time Series Analysis</td>
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<tr>
<td></td>
<td>STATS 240</td>
<td>Statistical Methods in Finance</td>
</tr>
<tr>
<td></td>
<td>STATS 241</td>
<td>Data-driven Financial and Risk Econometrics</td>
</tr>
</tbody>
</table>

Financial Applications (select two): Select one:

<table>
<thead>
<tr>
<th>Units</th>
<th>Course Code</th>
<th>Course Name</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 347</td>
<td>Credit Risk: Modeling and Management</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 348</td>
<td>Optimization of Uncertainty and Applications in Finance</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 447</td>
<td>Systemic and Market Risk: Notes on Recent History, Practice, and Policy</td>
</tr>
</tbody>
</table>
Operations and Analytics Concentration (four courses required)

Required Courses

MS&E 211  Introduction to Optimization (whichever course wasn't taken for core)
or MS&E 211X  Introduction to Optimization (Accelerated)
or MS&E 226  "Small" Data
MS&E 221  Stochastic Modeling (or a more advanced course in probability (i.e. MS&E 223 Simulation) if a student has taken an equivalent class in stochastic modeling)
MS&E 235  Analytics in Action
or MS&E 251  Stochastic Control
MS&E 260  Introduction to Operations Management
or MS&E 263  Healthcare Operations Management
or MS&E 267  Service Operations and the Design of Marketplaces

Recommended Elective Courses:

MS&E 212  Mathematical Programming and Combinatorial Optimization
MS&E 213  Introduction to Optimization Theory
MS&E 223  Simulation
MS&E 231  Introduction to Computational Social Science
MS&E 233  Networked Markets
MS&E 234  Data Privacy and Ethics
MS&E 235  Analytics in Action
MS&E 237  Networks, Markets, and Crowds
MS&E 243  Energy and Environmental Policy Analysis
MS&E 245A  Investment Science
MS&E 250A  Engineering Risk Analysis
MS&E 251  Stochastic Control
MS&E 252  Decision Analysis I: Foundations of Decision Analysis
MS&E 260  Introduction to Operations Management
MS&E 262  Supply Chain Management
MS&E 263  Healthcare Operations Management
MS&E 267  Service Operations and the Design of Marketplaces
MS&E 270  Strategy in Technology-Based Companies
MS&E 292  Health Policy Modeling

Technology and Engineering Management Concentration (four courses beyond core required)
The course used to satisfy the Organizations and Decisions Core satisfies one of the areas below, but the course units do not double-count.

Organizations and Strategy (select at least one):

MS&E 270  Strategy in Technology-Based Companies
MS&E 274  Dynamic Entrepreneurial Strategy
MS&E 278  Patent Law and Strategy for Innovators and Entrepreneurs
MS&E 280  Organizational Behavior: Evidence in Action
MS&E 282  Transformational Leadership
MS&E 284  Designing Modern Work Organizations

Entrepreneurship and Innovation (select at least one):

MS&E 270  Strategy in Technology-Based Companies
MS&E 271  Global Entrepreneurial Marketing
MS&E 272  Entrepreneurship without Borders

Economics

MS&E 273  Technology Venture Formation
MS&E 275  Foundations for Large-Scale Entrepreneurship
MS&E 276  Entrepreneurial Management and Finance
MS&E 277  Creativity and Innovation
ENGR 245  The Lean LaunchPad: Getting Your Lean Startup Off the Ground

Finance and Decisions (select at least one):

MS&E 240  Accounting for Managers and Entrepreneurs
MS&E 245A  Investment Science
MS&E 245B  Advanced Investment Science
MS&E 246  Financial Risk Analytics
MS&E 250A  Engineering Risk Analysis
MS&E 250B  Project Course in Engineering Risk Analysis
MS&E 252  Decision Analysis I: Foundations of Decision Analysis
MS&E 352  Decision Analysis II: Professional Decision Analysis

Specialized Concentrations (must have approval of the academic adviser)

Computational Social Science (four courses required)

Statistics (select at least one)

MS&E 226  "Small" Data (may not be duplicated in core)
STATS 203  Introduction to Regression Models and Analysis of Variance
STATS 305A  Introduction to Statistical Modeling

Computation (select at least one)

MS&E 231  Introduction to Computational Social Science
MS&E 235  Analytics in Action
CS 246  Mining Massive Data Sets

Networks (select at least one)

MS&E 233  Networked Markets
CS 224W  Analysis of Networks
ECON 291  Social and Economic Networks
MS&E 334  Topics in Social Data

Social Science (select at least one)

MS&E 270  Strategy in Technology-Based Companies
MS&E 280  Organizational Behavior: Evidence in Action
MS&E 284  Designing Modern Work Organizations
ECON 202N  Microeconomics I For Non-Economics PhDs
ECON 203N  Microeconomics II For Non-Economics PhDs
PSYCH 212  Classic and contemporary social psychology research

PSYCH 265  Social Psychology and Social Change
SOC 220  Interpersonal Relations
SOC 224B  Relational Sociology

Recommended Elective Courses

Causal Inference
COMM 382  Research in Computational Social Science
POLISCI 355C  Causal Inference for Social Science

Computation

CS 147  Introduction to Human-Computer Interaction Design
CS 229  Machine Learning
CS 448B  Data Visualization
MS&E 234  Data Privacy and Ethics
### Decision and Risk Analysis Concentration (four courses required)

Core Courses are restricted as follows:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>MS&amp;E 211</td>
<td>Introduction to Optimization</td>
</tr>
<tr>
<td>or MS&amp;E 211X</td>
<td>Introduction to Optimization (Accelerated)</td>
</tr>
<tr>
<td>MS&amp;E 221</td>
<td>Stochastic Modeling</td>
</tr>
<tr>
<td>MS&amp;E 252</td>
<td>Decision Analysis I: Foundations of Decision Analysis</td>
</tr>
</tbody>
</table>

Required Courses (select two):

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>MS&amp;E 241</td>
<td>Economic Analysis</td>
</tr>
<tr>
<td>MS&amp;E 250A</td>
<td>Engineering Risk Analysis</td>
</tr>
<tr>
<td>MS&amp;E 352</td>
<td>Decision Analysis II: Professional Decision Analysis</td>
</tr>
</tbody>
</table>

Policy Course (select one):

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>MS&amp;E 243</td>
<td>Energy and Environmental Policy Analysis</td>
</tr>
<tr>
<td>MS&amp;E 292</td>
<td>Health Policy Modeling</td>
</tr>
<tr>
<td>MS&amp;E 293</td>
<td>Technology and National Security</td>
</tr>
<tr>
<td>MS&amp;E 294</td>
<td>Climate Policy Analysis</td>
</tr>
<tr>
<td>MS&amp;E 295</td>
<td>Energy Policy Analysis</td>
</tr>
</tbody>
</table>

Project Course:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>MS&amp;E 250B</td>
<td>Project Course in Engineering Risk Analysis</td>
</tr>
<tr>
<td>MS&amp;E 297</td>
<td>&quot;Hacking for Defense&quot;: Solving National Security issues with the Lean Launchpad</td>
</tr>
</tbody>
</table>

### Energy and Environment Concentration (six courses required)

Required Courses:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>CEE 207A</td>
<td>Understanding Energy</td>
</tr>
<tr>
<td>MS&amp;E 241</td>
<td>Economic Analysis</td>
</tr>
</tbody>
</table>

### Energy and Environment Policy Analysis

Three additional courses from energy, policy, or strategy areas below.

Policy:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>ECON 251</td>
<td>Natural Resource and Energy Economics</td>
</tr>
<tr>
<td>ENERGY 158</td>
<td>Bringing New Energy Technologies to Market: Optimizing Technology Push and Market Pull</td>
</tr>
<tr>
<td>GSBGEN 336</td>
<td>Energy Markets and Policy</td>
</tr>
<tr>
<td>MS&amp;E 293</td>
<td>Technology and National Security</td>
</tr>
<tr>
<td>MS&amp;E 294</td>
<td>Climate Policy Analysis</td>
</tr>
<tr>
<td>MS&amp;E 295</td>
<td>Energy Policy Analysis</td>
</tr>
</tbody>
</table>

Strategy:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>ECON 203N</td>
<td>Microeconomics II For Non-Economics PhDs</td>
</tr>
<tr>
<td>ENERGY 158</td>
<td>Bringing New Energy Technologies to Market: Optimizing Technology Push and Market Pull</td>
</tr>
<tr>
<td>GSBGEN 538</td>
<td>Energy Policy, Markets, and Climate Change</td>
</tr>
<tr>
<td>MS&amp;E 270</td>
<td>Strategy in Technology-Based Companies</td>
</tr>
<tr>
<td>MS&amp;E 271</td>
<td>Global Entrepreneurial Marketing</td>
</tr>
<tr>
<td>MS&amp;E 272</td>
<td>Entrepreneurship without Borders</td>
</tr>
<tr>
<td>MS&amp;E 273</td>
<td>Technology Venture Formation</td>
</tr>
<tr>
<td>MS&amp;E 274</td>
<td>Dynamic Entrepreneurial Strategy</td>
</tr>
<tr>
<td>MS&amp;E 275</td>
<td>Foundations for Large-Scale Entrepreneurship</td>
</tr>
<tr>
<td>MS&amp;E 276</td>
<td>Entrepreneurial Management and Finance</td>
</tr>
<tr>
<td>MS&amp;E 277</td>
<td>Creativity and Innovation</td>
</tr>
<tr>
<td>MS&amp;E 278</td>
<td>Patent Law and Strategy for Innovators and Entrepreneurs</td>
</tr>
</tbody>
</table>

Energy:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>ENERGY 102</td>
<td>Fundamentals of Renewable Power</td>
</tr>
<tr>
<td>ENERGY 104</td>
<td>Sustainable Energy for 9 Billion</td>
</tr>
<tr>
<td>ENERGY 158</td>
<td>Bringing New Energy Technologies to Market: Optimizing Technology Push and Market Pull</td>
</tr>
<tr>
<td>ME 370A</td>
<td>Energy Systems I: Thermodynamics</td>
</tr>
<tr>
<td>ME 370B</td>
<td>Energy Systems II: Modeling and Advanced Concepts</td>
</tr>
<tr>
<td>PHYSICS 240</td>
<td>Introduction to the Physics of Energy</td>
</tr>
<tr>
<td>PHYSICS 241</td>
<td>Introduction to Nuclear Energy</td>
</tr>
</tbody>
</table>

Recommended Seminars:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>ECON 341</td>
<td>Public Economics and Environmental Economics Seminar</td>
</tr>
<tr>
<td>ENERGY 301</td>
<td>The Energy Seminar</td>
</tr>
<tr>
<td>MS&amp;E 441</td>
<td>Policy and Economics Research Roundtable</td>
</tr>
<tr>
<td>MS&amp;E 472</td>
<td>Entrepreneurial Thought Leaders’ Seminar</td>
</tr>
</tbody>
</table>

Recommended Elective Courses:

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>ECON 250</td>
<td>Environmental Economics</td>
</tr>
<tr>
<td>ECON 270</td>
<td>Intermediate Econometrics I</td>
</tr>
<tr>
<td>ECON 278</td>
<td>Behavioral and Experimental Economics I</td>
</tr>
<tr>
<td>MGTECON 603</td>
<td>Econometric Methods I</td>
</tr>
<tr>
<td>MS&amp;E 201</td>
<td>Dynamic Systems</td>
</tr>
<tr>
<td>MS&amp;E 211</td>
<td>Introduction to Optimization</td>
</tr>
<tr>
<td>MS&amp;E 244</td>
<td>Economic Growth and Development</td>
</tr>
<tr>
<td>MS&amp;E 251</td>
<td>Stochastic Control</td>
</tr>
</tbody>
</table>

### Health Systems Modeling Concentration (four courses required)

Required Courses (select four)

<table>
<thead>
<tr>
<th>Course Code</th>
<th>Course Title</th>
</tr>
</thead>
<tbody>
<tr>
<td>HRP 263</td>
<td>Advanced Decision Science Methods and Modeling in Health</td>
</tr>
<tr>
<td>HRP 392</td>
<td>Analysis of Costs, Risks, and Benefits of Health Care</td>
</tr>
</tbody>
</table>
Additional Requirements

1. At least 45 units must be in courses numbered 100 and above.
2. The degree program must be completed with a grade point average (GPA) of 3.0 or higher.
3. At least 27 units must be in courses numbered 200 and above in MS&E, taken for a letter grade and a minimum of two units each.
4. At least 36 letter-graded units must be in MS&E or closely related fields. Closely related fields include any department in the School of Engineering, mathematics, statistics, economics, sociology, psychology, or business.
5. All courses used to satisfy core, concentration, or project requirements must be taken for a letter grade.
6. A maximum of three units of 1-unit courses such as seminars, colloquia, workshops, in any department, including MS&E 208A, B, and C, Curricular Practical Training.
7. A maximum of 18 non-degree option (NDO) units through the Stanford Center for Professional Development (SCPD).
8. Courses taken in Health and Human Performance (Athletics, Club Sports, Martial Arts, Outdoor Education, Physical Education, and Wellness Education) may not be applied toward the degree.

Projects

Select one project course or two integrated project courses; may double-count as part of the core or concentration.

<table>
<thead>
<tr>
<th>Units</th>
<th>Project Courses</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>MS&amp;E 263 Healthcare Operations Management</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 292 Health Policy Modeling</td>
</tr>
<tr>
<td></td>
<td>MS&amp;E 463 Healthcare Systems Design</td>
</tr>
</tbody>
</table>

Integrated Project Courses

<table>
<thead>
<tr>
<th>Units</th>
<th>Project Courses</th>
</tr>
</thead>
<tbody>
<tr>
<td>3</td>
<td>MS&amp;E 201 Dynamic Systems</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 226 &quot;Small&quot; Data</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 233 Networked Markets</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 243 Energy and Environmental Policy Analysis</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 245A Investment Science</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 245B Advanced Investment Science</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 252 Decision Analysis I: Foundations of Decision Analysis</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 256 Technology Assessment and Regulation of Medical Devices</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 260 Introduction to Operations Management</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 262 Supply Chain Management</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 265 Product Management Fundamentals</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 270 Strategy in Technology-Based Companies</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 271 Global Entrepreneurial Marketing</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 273 Technology Venture Formation</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 274 Dynamic Entrepreneurial Strategy</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 275 Foundations for Large-Scale Entrepreneurship</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 277 Creativity and Innovation</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 280 Organizational Behavior: Evidence in Action</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 282 Transformational Leadership</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 284 Designing Modern Work Organizations</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 294 Climate Policy Analysis</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 295 Energy Policy Analysis</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 311 Optimization</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 338 Reinforcement Learning</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 347 Credit Risk: Modeling and Management</td>
</tr>
<tr>
<td>3</td>
<td>MS&amp;E 355 Influence Diagrams and Probabilistics Networks</td>
</tr>
</tbody>
</table>

Professional Education

The Stanford Center for Professional Development (SCPD) provides opportunities for employees of some local and remote companies to take courses at Stanford.

The Honors Cooperative Program (HCP) provides opportunities for employees of SCPD member companies to earn an M.S. degree, over a longer period, by taking one or two courses per academic quarter.

Some courses are only offered on campus; HCP students may attend those courses at Stanford to meet the degree requirements. It is possible to complete this program as a remote HCP student although the remote offerings are limited. Students must apply for a degree program through the standard application process, and must meet the standard application deadlines.

The non-degree option (NDO) allows employees of some local companies to take courses for credit from their company sites before being admitted to a degree program. Students apply to take NDO courses each quarter through the Stanford Center for Professional Development. Up to 18 units taken as an NDO student may be applied toward a degree program. For additional information about the NDO application process and deadlines, see the SCPD web site (http://scpd.stanford.edu), or contact SCPD at (650) 725-3000.

Certificate

The department offers a certificate program within the framework of the NDO program. A certificate can be obtained by completing three MS&E core courses, plus one MS&E elective course for a total of four courses. For further information, see http://scpd.stanford.edu/scpd/programs/certs/managementSci.htm.

Dual Master’s Degree Program

The dual degree program enables a small group of graduate students to obtain two master’s degrees simultaneously. Students complete the course requirements for each department. A total of 90 units is required to complete the dual master’s degree.

Admission

For the dual degree, admission to two departments is required, but is coordinated by designated members of both admissions committees who make recommendations to the committees of their respective departments. Students may apply to only one department initially. After the first quarter at Stanford, students may apply to be admitted to the second department.

Advising

Every student in the dual degree program has one adviser in each department.
Joint MS&E and Law Degrees

The School of Law and the Department of Management Science and Engineering offer joint degree programs leading to a J.D. degree and an M.S. degree in MS&E, or to a J.D. and Ph.D. in MS&E. These programs are designed for students who wish to prepare themselves for careers in areas relating to both law and to the decision making, policy making, and problem solving knowledge and skills developed in the MS&E program. Students interested in either joint degree program must apply and gain admission separately to the School of Law and the Department of Management Science and Engineering and, as an additional step, must secure consent from both academic units to pursue degrees in those units as part of a joint degree program. Interest in either joint degree program should be noted on the student’s admission applications and may be considered by the admission committee of each program. Alternatively, an enrolled student in either the Law School or MS&E may apply for admission to the other program and for joint degree status in both academic units after commencing study in either program.

Joint degree students may elect to begin their course of study in either the School of Law or MS&E. Students are assigned to a joint program committee composed of at least one faculty member from Law and one from MS&E. This committee plans the student’s program jointly with the student. Students must be enrolled full time in the Law School for the first year of law studies, and it is recommended that students devote exclusively one Autumn Quarter to the MS&E M.S. program to initiate their MS&E work. After that time, enrollment may be in MS&E or Law, and students may choose courses from either program regardless of where enrolled. A candidate in the joint J.D./Ph.D. program should spend a substantial amount of full time residency in MS&E. Students must satisfy the requirements for both the J.D. and the M.S. or Ph.D. degrees as specified in this bulletin or by the School of Law. The Law School may approve courses from MS&E or courses in the student’s MS&E program from outside of the Department of Management Science and Engineering that may count toward the J.D. degree, and MS&E may approve courses from the Law School that may count toward the M.S. or Ph.D. degree in MS&E. In either case, approval may consist of a list applicable to all joint degree students or may be tailored to each individual student’s program. The lists may differ depending on whether the student is pursuing an M.S. or a Ph.D. in MS&E.

In the case of a J.D./M.S. program, no more than 45 units of approved courses may be counted toward both degrees. In the case of a J.D./Ph.D. program, no more than 54 units of approved courses may be counted toward both degrees. In either case, no more than 35 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 the Law School but count toward the law degree, the law credits permitted under Section 17(1) of the Law School Regulations are 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 MS&E is the greater of: (a) 18 units in the case of the M.S., or (b) the maximum number of hours from courses outside the department that an M.S. candidate in MS&E is permitted to count toward the applicable degree under general departmental guidelines or under departmental rules that apply in the case of a particular student.

Tuition and financial aid arrangements are normally through the school in which the student is then enrolled.

Joint MS&E and Master of Public Policy Degree

MS MS&E students who wish to apply their analytical and management skills to the field of public policy can simultaneously pursue a master degree in MS&E and a master degree in Public Policy. The MPP is a two-year degree program, but MS MS&E students who pursue the joint program can earn both degrees in a minimum of two years, depending on prior preparation and elective choices, by counting up to 45 quarter units of course work toward both degrees. After admission to the Department of Management Science and Engineering, incoming or current MS students request that their application file be forwarded to the MPP program director for review.

Students in the joint program normally will spend most of their first year taking MS&E core courses. The second year is typically devoted to the MPP core, concentration, and practicum. The joint degree requires 90 quarter units. Tuition for the first year of study is paid at the Graduate Engineering rate, the remaining time at the graduate rate.

Doctor of Philosophy in Management Science and Engineering

University requirements for the Ph.D. degree are described in the “Graduate Degrees” section of this bulletin.

The Ph.D. degree in MS&E is intended for students primarily interested in a career of research and teaching, or high-level technical work in universities, industry, or government. The program requires three years of full-time graduate study, at least two years of which must be at Stanford. Typically, however, students take four to five years after entering the program to complete all Ph.D. requirements. The Ph.D. is organized around the expectation that the students acquire a certain breadth across all areas of the department, and depth in one of them. The current areas are:

- Computational Social Science
- Decision and Risk Analysis
- Energy and Environmental Policy
- Financial Analytics
- Health Policy
- National Security Policy
- Operations Management
- Optimization and Stochastics
- Organizations
- Strategy, Innovation, and Entrepreneurship

Doctoral students are required to take a number of courses, both to pass a qualifying exam in one of these areas, and to complete a dissertation based on research which must make an original contribution to knowledge.

Each student admitted to the Ph.D. program must satisfy a breadth requirement and pass a qualification procedure. The purpose of the qualification procedure is to assess the student’s command of the field and to evaluate his or her potential to complete a high-quality dissertation in a timely manner. The student must complete specified course work in one of the areas of the department.

The qualification decision is based on the student’s course work and grade point average (GPA), on the one or two preliminary papers prepared by the student with close guidance from two faculty members, at least one of whom must be an MS&E faculty member, the student’s performance in an area examination or defense of the written paper(s), and an overall assessment by the faculty of the student’s ability to conduct high-quality Ph.D. research. Considering this evidence, the department faculty vote on advancing the student to candidacy in the department at large. The Ph.D. requires a minimum of 135 units, up to 45 units of which may be transferred from another graduate program.

All courses used to satisfy breadth and depth requirements must be taken for a letter grade, if the letter graded option is available. Prior to candidacy, at least 3 units of work must be taken with each of four Stanford faculty members. Finally, the student must pass a University oral examination and complete a Ph.D. dissertation. During the course
of the Ph.D. program, students who do not have a master's degree are strongly encouraged to complete one, either in MS&E or in another Stanford department.

**Breadth Requirement**
All first year students are required to attend and participate in MS&E 302 Fundamental Concepts in Management Science and Engineering, which meets in the Autumn Quarter.

Each course session is devoted to a specific MS&E Ph.D. research area. At a given session several advanced P.h.D. students in that area make carefully prepared presentations designed for first-year doctoral students regardless of area. The presentations are devoted to: (a) illuminating how people in the area being explored that day think about and approach problems, and (b) illustrating what can and cannot be done when addressing problems by deploying the knowledge, perspectives, and skills acquired by those who specialize in the area in question.

Faculty in the focal area of the week comment on the student presentations. The rest of the session is devoted to questions posed and comments made by the first year Ph.D. students.

During the last two weeks of the quarter, groups of first year students make presentations on how they would approach a problem drawing on two or more of the perspectives to which they have been exposed earlier in the class.

Attendance is mandatory and performance is assessed on the basis of the quality of the students' presentations and class participation.

**Qualification Procedure Requirements**
The qualification procedure is based on depth in an area of the student's choice and preparation for dissertation research. The qualification process must be completed by the end of the month of May of the student's second year of graduate study in the department. The performance of all doctoral students is reviewed every year at a department faculty meeting at the end of May or beginning of June. Ph.D. qualification decisions are made at that time and individual feedback is provided.

The Ph.D. qualification requirements comprise these elements:

1. **Courses and GPA:** Students must complete the depth requirements of one of the areas of the MS&E department. (The Ph.D. area course requirements are below.)
   All courses used to satisfy depth requirements must be taken for a letter grade, if the letter graded option is available. Course substitutions may be approved by the doctoral program adviser or the MS&E dissertation adviser on the candidacy form or on a request for graduate course waiver/substitution form. A student must maintain a GPA of at least 3.4 in the set of all courses taken by the student within the department. The GPA is computed on the basis of the nominal number of units for which each course is offered.

2. **Paper(s):** A student may choose between two options. The first option involves one paper supervised by a primary faculty adviser and a second faculty reader. This paper should be written in two quarters. The second option involves two shorter sequential tutorials, with two different faculty advisers. Each tutorial should be completed in one quarter. In both options, the student chooses the faculty adviser(s)/reader with the faculty members' consent. There must be two faculty members, at least one of whom must be an MS&E faculty member, supervising and evaluating this requirement for advancement to candidacy. The paper/tutorials must be completed before the Spring Quarter of the student's second year of graduate study in the department if the student's qualifying exam is during the Spring Quarter, and before the end of May of that year otherwise. A student may register for up to 3 units per tutorial and up to 6 units for a paper.

3. **Area Qualification:** In addition, during the second year, a student must pass an examination in one of the areas of the MS&E department, or defense of the written paper(s). The student chooses the area/program in which to take the examination. This area examination is written, oral, or both, at the discretion of the area faculty administering the exam. Most areas offer the qualifying exam only once per year, which may be early in the second year.

**Degree Progress and Student Responsibility**

Each student's progress is reviewed annually by the MS&E faculty. Typically, this occurs at a faculty meeting at the end of Spring Quarter, and email notifications are sent over the summer.

1. First-year students should complete 30 units of breadth and depth courses, including MS&E 302, and develop relationships with faculty members who might serve as dissertation adviser and reading committee.
2. Second-year students should complete most, if not all, of the required depth courses, work with two faculty members, at least one of whom must be an MS&E faculty member, on tutorials/research paper, and pass an area qualifying exam. Most areas offer the qualifying exam only once per year, which may be early in the second year. Students should continue to develop relationships with faculty members who might serve as dissertation advisers and reading committee, and select a dissertation adviser before the beginning of the third year.
3. Third-year students should complete any remaining depth courses, select a dissertation topic, and make progress on the dissertation.
4. Fourth-year students should select a reading committee, and complete, or nearly complete, the oral exam and dissertation.

It is the responsibility of the student to initiate each step in completing the Ph.D. program.

It is strongly recommended that each student, in the first year of graduate study at Stanford, make it a special point to become well acquainted with MS&E faculty members and to seek advice and counsel regarding possible Ph.D. candidacy. A faculty member is more likely to accept the responsibility of supervising the research of a student whom he or she knows fairly well than a student whose abilities, initiative, and originality the faculty member knows less.

It is expected that advanced students regularly report to their full reading committee on the progress of their dissertation. It is also expected that the student avail him/herself of the different expertise represented on the committee continually. Each member of this committee must certify approval of both the scope and quality of the dissertation.

The doctoral dissertation reading committee consists of the principal dissertation adviser and two other readers. At least one member must be from the student's major department.

As administered in this department, the University oral examination is a defense of the dissertation; however, the candidate should be prepared to answer any question raised by any members of the Academic Council who choose to be present. Students should schedule three hours for the oral examination, which usually consists of a 45-minute public presentation, followed by closed-session questioning of the examinee by the committee, and committee deliberation. The University oral examination may be scheduled after the dissertation reading committee has given tentative approval to the dissertation. The student must be enrolled in the quarter of their oral examination.

The examining committee usually consists of the three members of the reading committee as well as a fourth faculty member and an orals chair. It is the responsibility of the student's adviser to find an appropriate orals chair. The chair must be an Academic Council member and may not be affiliated with either the Department of Management Science and Engineering nor any department in which the student's adviser has a regular appointment. Emeriti professors are eligible to serve as an
orals chair. The student needs to reserve a room, and meet with the student services manager to complete the oral examination schedule and pick up other paperwork. This paperwork, along with an abstract, needs to be delivered to the orals chair at least one week prior to the oral examination.

Course Requirements

Computational Social Science

The Computational Social Science track teaches students how to apply rigorous statistical and computational methods to address problems in economics, sociology, political science and beyond. The core course work covers fundamental statistical concepts, large-scale computation, and network analysis. Through electives, students can explore topics such as experimental design, algorithmic economics, and machine learning.

Select at least one class from each of four different core areas.

Statistics core:
- MS&E 226 "Small" Data
- STATS 203 Introduction to Regression Models and Analysis of Variance
- STATS 305A Introduction to Statistical Modeling

Computation core:
- MS&E 231 Introduction to Computational Social Science
- MS&E 235 Analytics in Action
- CS 246 Mining Massive Data Sets

Networks core:
- MS&E 233 Networked Markets
- MS&E 334 Topics in Social Data
- CS 224W Analysis of Networks
- ECON 291 Social and Economic Networks

Social Science core:
- MS&E 270 Strategy in Technology-Based Companies
- MS&E 280 Organizational Behavior: Evidence in Action
- MS&E 274 Dynamic Entrepreneurial Strategy
- ECON 202N Microeconomics I For Non-Economics PhDs
- ECON 203N Microeconomics II For Non-Economics PhDs
- PSYCH 212 Classic and contemporary social psychology research
- PSYCH 265 Social Psychology and Social Change
- SOC 220 Interpersonal Relations
- SOC 224B Relational Sociology

Recommended:
- Causal Inference
  - COMM 382 Research in Computational Social Science
  - POLSCI 355C Causal Inference for Social Science

Computation
- CS 147 Introduction to Human-Computer Interaction Design
- CS 229 Machine Learning
- CS 448B Data Visualization
- MS&E 234 Data Privacy and Ethics

Economics
- MS&E 241 Economic Analysis

Natural Language Processing
- CS 124 From Languages to Information
- CS 224N Natural Language Processing with Deep Learning
- CS 224S Spoken Language Processing
- LINGUIST 278 Programming for Linguists
- LINGUIST 281 Computational Models of Linguistic Formalism

Psychology
- PSYCH 216 Public Policy and Social Psychology: Implications and Applications
- PSYCH 238 Wise Interventions

Sociology
- OB 637 Modeling Culture
- SOC 214 Economic Sociology
- SOC 218 Social Movements and Collective Action
- SOC 262 The Social Regulation of Markets
- SOC 270 Classics of Modern Social Theory
- SOC 271 Organizational Analysis

Statistics
- STATS 209 Statistical Methods for Group Comparisons and Causal Inference
- STATS 263 Design of Experiments
- STATS 315A Modern Applied Statistics: Learning
- STATS 315B Modern Applied Statistics: Data Mining

Students may substitute other classes (including those from other departments) from the same general area on a case-by-case basis, subject to approval by the student’s program/dissertation adviser. The students must obtain a GPA of 3.50 or better in the core courses to qualify. The core courses must be completed in or before the Spring Quarter of the student’s second year.

Computational Social Science Qualifying Procedure

The student does two quarter-length tutorials with CSS faculty. At the end of these tutorials, the student must make a 45-minute presentation of one of their tutorials to a committee of three CSS faculty members. The student can do both tutorials with the same faculty member, in which case the presentation can be of the two tutorials together, and another committee member must be kept informed of the student’s progress on a regular basis during the two quarters. The presentation should take place in the Spring Quarter of the student’s second year, or earlier. The presentation must include original research or promising directions towards original research. During this presentation, the student must also provide the name of their chosen focus area, and the list of courses that the student has completed and intends to complete in the core as well as in the chosen focus area. The committee then makes a recommendation to the CSS area and the MS&E department regarding qualification of the student for the Ph.D. program in CSS.

Decision Analysis and Risk Analysis

Prerequisites:
- CS 106A Programming Methodology
- CME 100 Vector Calculus for Engineers
- CME 103 Introduction to Matrix Methods

Required:
- MS&E 201 Dynamic Systems
- or EE 263 Introduction to Linear Dynamical Systems
- MS&E 211 Introduction to Optimization
- or MS&E 211X Introduction to Optimization (Accelerated)
- or MS&E 311 Optimization
- MS&E 220 Probabilistic Analysis
- MS&E 221 Stochastic Modeling
- or STATS 217 Introduction to Stochastic Processes I
- MS&E 223 Simulation
are affiliated with the Center for Financial and Risk Analytics (CFRA).

Statistical testing of financial models. PhD students in the area typically
execute; large-scale portfolio optimization; mortgage markets; and
management; systemic financial risk; algorithmic trading; optimal order
dissertation topics include studies of machine learning methods for risk
computational mathematics as well as a variety of other courses. Recent
courses in probability, statistics, optimization, finance, economics, and
financial risks, institutions, markets, and technology. Students take
The finance area focuses on the quantitative and statistical study of
Electricity.

Prerequisites (may be waived based on prior coursework)

### Mathematics

- **MATH 113** Linear Algebra and Matrix Theory
- **MATH 115** Functions of a Real Variable
- **MATH 171** Fundamental Concepts of Analysis

### Probability

- **MS&E 220** Probabilistic Analysis
- **or STATS 116** Theory of Probability
- **MS&E 221** Stochastic Modeling

### Statistics

- **STATS 110** Statistical Methods in Engineering and the Physical Sciences

### Programming

- **CS 106A** Programming Methodology

### Economics

- **MS&E 241** Economic Analysis

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**Finance Qualifying Procedure**

In addition to beginning an appropriate course program, students must pass two quarters of tutorial and an oral examination to obtain qualification. The tutorials emphasize basic research skills. The oral examination emphasizes command of basic concepts as represented in the required courses as well as the modeling of practical situations.
Optimization and Stochastics

Prerequisites:
- MS&E 220 Probabilistic Analysis
- or STATS 116 Theory of Probability
- MS&E 221 Stochastic Modeling
- or STATS 217 Introduction to Stochastic Processes I
- MS&E 241 Economic Analysis
- or ECON 50 Economic Analysis I
- CS 106A Programming Methodology
- or CS 106X Programming Abstractions (Accelerated)
- MATH 113 Linear Algebra and Matrix Theory
- MATH 115 Functions of a Real Variable
- or MATH 171 Fundamental Concepts of Analysis

Strongly Recommended:
- CME 108 Introduction to Scientific Computing
- STATS 200 Introduction to Statistical Inference
- STATS 203 Introduction to Regression Models and Analysis of Variance

Core (four courses):
- MS&E 310 Linear Programming
- MS&E 321 Stochastic Systems
- MS&E 311 Optimization
- MS&E 316 Discrete Mathematics and Algorithms
- STATS 310A Theory of Probability I

Three to four courses in some coherent area of specialization.

In addition to the four core courses, students should take at least four 3-4 unit courses in some coherent area of specialization. The area of specialization may be methodological; examples include (but are not limited to) optimization, stochastic systems, stochastic control, algorithms, economic analysis, statistical inference, scientific computing, etc. The area of specialization could also have a significant modeling and application component, such as (but not limited to) information services, telecommunications, financial engineering, supply chains, health care, energy, etc. Independent of the choice of specialization, students are encouraged to take a range of courses covering methodology, modeling, and applications. Any MS&E courses satisfying this requirement must be at the 300-level, while courses outside MS&E must be at a comparable level. Students are expected to earn a letter grade of A- or better in all courses counted for the requirements. A student’s plan for completing these requirements must be discussed with and approved by their faculty advisor by the beginning of Autumn Quarter of their second year.

Optimization and Stochastics Qualifying Procedure

Students take the area qualifying exam at the beginning of their second year of study. The qualifying exam consists of two written exams: one in Optimization and one in Stochastic Systems. The first exam covers the material in MS&E 310 and related prerequisites. The second exam covers the material in MS&E 321 and related prerequisites.

The student does two quarter-length tutorials with Optimization and Stochastics faculty (or affiliated faculty). A written report approved by the supervising faculty member is required on each tutorial. In addition, at the end of the second year, students are expected to make a 30-minute presentation to the broader Optimization and Stochastics faculty. The presentation must include original research or promising directions towards original research. The student can do both tutorials with the same faculty member; in this case a single written report is sufficient, and the presentation can be of the two tutorials together.

Organizations, Strategy, Innovation, and Entrepreneurship

Foundation in Organizational Behavior (five courses):
- OB 671 Social Psychology of Organizations
- SOC 363A Seminar on Organizational Theory
- or OB 672 Organization and Environment

Plus three of the following, which must include at least one 37x course and one 38x course:
- MS&E 371 Innovation and Strategic Change
- MS&E 372 Entrepreneurship Doctoral Research Seminar
- MS&E 376 Strategy Doctoral Research Seminar
- MS&E 380 Doctoral Research Seminar in Organizations
- MS&E 384 Groups and Teams
- MS&E 387 Design of Field Research Methods
- MS&E 388 Contemporary Themes in Work and Organization Studies

Statistics and Research Methods (examples; three courses required)
- MS&E 231 Introduction to Computational Social Science
- MS&E 379 Social Data Analysis
- MS&E 387 Design of Field Research Methods
- PSYCH 252 Statistical Methods for Behavioral and Social Sciences
- SOC 381 Sociological Methodology I: Introduction
- SOC 382 Sociological Methodology II: Principles of Regression Analysis
- SOC 383 Sociological Methodology III: Models for Discrete Outcomes
- SOC 384 New Models and Methods in the Social Sciences

In their first two years in the Ph.D. program, all students are expected to work with faculty on research. To ensure an early start, all students must work at least 25% of their time in their first year as a research assistant with a faculty member. Students on fellowships can earn course credit.
for the work. With approval from the students’ adviser, one quarter of the requirement may be fulfilled by working as a Course Assistant (CA).

Ph.D. students in organizational behavior must take 3 courses in statistics and research methods. Two of these courses must be statistics courses.

Ph.D. students are required to take a minimum of 2 advanced-content courses chosen with input from their adviser.

Students are expected to complete a yearly plan, of no more than two typed pages in length, detailing the student's plans for the next year in terms of education (e.g., courses and seminars), research (e.g., RAships), and teaching (e.g., TAships). This plan should be provided to the students’ academic adviser for review no later than May 15 each calendar year.

**Policy and Strategy**
The Policy and Strategy (P&S) Area addresses policy and strategy questions in a variety of organizational and societal settings. In order to approach interdisciplinary research questions in application domains as diverse as energy, environment, health, information technology, innovation, and government regulation, P&S faculty members rely on a broad range of analytical and empirical tools, such as decision analysis, optimization and operations research methods, formal economic modeling, econometrics, case studies, and simulation. After having been exposed to foundational knowledge of economics, strategy, and organizational theory, doctoral students in the P&S Area can select from a variety of courses to deepen their understanding of the specific application domains. The P&S Area's mission is to provide a first-class learning and research environment preparing doctoral students for careers at research universities, government institutions, and in the private sector.

**Foundation in Policy and Strategy (three):**
- MS&E 241 Economic Analysis
- or MS&E 375 Strategy Doctoral Research Seminar
- or MS&E 390 Doctoral Research Seminar in Health Systems Modeling
- or MS&E 391 Doctoral Research Seminar in Energy-Environmental Systems Modeling and Analysis

**Statistics and Research Methods (three):**
- MS&E 201 Dynamic Systems
- MS&E 211 Introduction to Optimization
- or MS&E 211 X Introduction to Optimization (Accelerated)
- MS&E 212 Mathematical Programming and Combinatorial Optimization
- MS&E 221 Stochastic Modeling
- MS&E 223 Simulation
- MS&E 352 Decision Analysis II: Professional Decision Analysis
- PSYCH 252 Statistical Methods for Behavioral and Social Sciences
- SOC 383 Sociological Methodology III: Models for Discrete Outcomes
- SOC 384 New Models and Methods in the Social Sciences

The student must select a program of four or more electives including disciplinary depth courses that reflects his or her interests and this approved by the Policy and Strategy faculty. The following are a number of sample programs:

**Sample Program: Modeling Emphasis**

**Research Methods**
- MS&E 201 Dynamic Systems
- MS&E 252 Decision Analysis I: Foundations of Decision Analysis
- MS&E 311 Optimization
- MS&E 321 Stochastic Systems
- Domain Depth
- MS&E 292 Health Policy Modeling
- HRP 392 Analysis of Costs, Risks, and Benefits of Health Care

**Two of the following:**
- MS&E 263 Healthcare Operations Management
- MS&E 463 Healthcare Systems Design
- HRP 256 Economics of Health and Medical Care
- HRP 263 Advanced Decision Science Methods and Modeling in Health

**Sample Program: Economics Emphasis**

**Research Methods**
- ECON 282 Contracts, Information, and Incentives
- ECON 286 Game Theory and Economic Applications
- Domain Depth
- ECON 257 Industrial Organization I
- ECON 285 Matching and Market Design

**Sample Program: Strategy Emphasis**

**Research Methods**
- MS&E 408 Directed Reading and Research ((Methods Apprenticeship))
- SOC 369 Social Network Methods
- Domain Depth
- MS&E 371 Innovation and Strategic Change
- MS&E 376 Strategy Doctoral Research Seminar
- SOC 314 Economic Sociology

**Sample Program: Risk Analysis Emphasis**

**Research Methods**
- MS&E 250A Engineering Risk Analysis
- MS&E 251 Stochastic Control
- MS&E 252 Decision Analysis I: Foundations of Decision Analysis
- MS&E 355 Influence Diagrams and Probabilistics Networks
- Domain Depth
- MS&E 250B Project Course in Engineering Risk Analysis
- MS&E 353 Decision Analysis III: Frontiers of Decision Analysis

**Policy and Strategy Qualifying Procedure**

Advancement to Ph.D. candidacy is determined at the end of the student's second year of studies, based on the following three components:

1. the student’s overall grade point average in the program (a GPA of 3.5 or higher is required);
2. a second-year research paper that is written by the student under the supervision of a faculty member, and that is presented to examining faculty members in the second year;
3. a written and an oral qualifying examination taken by the student in the spring quarter of the second year.

**Ph.D. Minor in Management Science and Engineering**

Students pursuing a Ph.D. in another department who wish to receive a Ph.D. minor in Management Science and Engineering should consult the MS&E student services office. A minor in MS&E may be obtained by completing 20 units of approved graduate-level MS&E courses, of which at least 6 units must be at the 300-level. Courses approved for the minor must form a coherent program, and include a breadth of courses from across the department. The program must include a minimum of 16 letter-graded units, and a minimum grade point average of 3.3 must be achieved in these courses.


_Chair:_ Nicholas Bambos


_Associate Professors:_ Samuel S. Chiu, Charles E. Eesley, Kay Giesecke, Ramesh Johari, Amin Saberi, Ross D. Shachter, Edison T. S. Tse

_Assistant Professors:_ Itai Ashlagi, Sharad Goel, Markus Pelger, Aaron Sidford, Johan Ugander, Melissa A. Valentine

_Professors (Research):_ John P. Weyant

_Professors (Teaching):_ Thomas H. Byers, Robert E. McGinn

_Professor of the Practice:_ Tina L. Seelig

_Courtesy Professors:_ Stephen P. Boyd, Douglas K. Owens, Walter Powell, Balaji Prabhakar, Alvin Roth, Tim Roughgarden