ARTIFICIAL INTELLIGENCE

The Collaborative Specialization in Artificial Intelligence (AI) provides thesis-based Master's students in Computer Science, Engineering, Mathematics and Statistics, and Bioinformatics with a diverse and comprehensive knowledge base in AI. Students wishing to undertake graduate studies at the Master's level with emphasis on artificial intelligence will be admitted by a participating department and will register in both the participating department and in the collaborative specialization.

Students will learn from a multidisciplinary team of faculty with expertise in fundamental and applied deep learning and machine learning, while conducting AI-related research guided by a faculty advisor. By the end of this program, graduates will have comprehensive understanding of leading-edge AI techniques and will be able to apply this knowledge to solve real-world problems.

Administrative Staff

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Graduate Faculty

This list may include Regular Graduate Faculty, Associated Graduate Faculty and/or Graduate Faculty from other universities.

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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BSE Azad, M.Sc., PhD Putra Malaysia - Associate Professor
Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Graduate Faculty

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Associated Graduate Faculty

Sheng Yang
B.Sc., M.Sc. Northwestern Polytechnical, PhD McGill - Assistant Professor
Graduate Faculty

Simon X. Yang
B.Sc. Peking, M.Sc. Sinica, M.Sc. Houston, PhD Alberta, P.Eng. - Professor
Graduate Faculty

MSc/MASc Collaborative Specialization
Admission Requirements

Masters students in the Collaborative Specialization in Artificial Intelligence must meet the admission requirements of the participating department in which they are enrolled. The application process has two stages. First, prospective students will apply to their primary program of interest, identifying interest in the collaborative specialization as a focus. If the student is admitted to the primary program as a thesis student, the second stage is then admission to the collaborative specialization. All applications to participate in the Collaborative Specialization in Artificial Intelligence will be vetted by the specialization's Graduate Program Coordinator.

Learning Outcomes

Upon successful completion of the collaborative specialization, graduates will have demonstrated the ability to:

1. Employ common tools in artificial intelligence and machine learning (such as using data visualization techniques to perform exploratory data analysis);
2. Express the mathematical foundations of artificial intelligence and machine learning, including relevant topics in calculus, linear algebra, and probability theory;
3. Employ general-purpose optimizers to fit the parameters and hyper-parameters of machine learning models, and contrast the similarity and difference between machine learning and optimization;
4. Master the algorithmic foundations of artificial intelligence and machine learning, identify canonical algorithmic problems, and propose existing algorithmic paradigms to solve them;
5. Identify and discuss the most pertinent issues concerning artificial intelligence;
6. Reflect upon and discuss ethical and social implications of artificial intelligence applications;
7. Collaborate with colleagues from different backgrounds and employ multidisciplinary approach to developing design solutions to AI-related problems;
8. Consider, question, and critique alternative design solutions in consideration of technical, social, and ethical themes; and
9. Propose solutions to AI-related problems through written and oral forms of communication with clarity and coherency.

Program Requirements

Masters students in the collaborative specialization in artificial intelligence must complete:

Code	Title	Credits
UNIV*6080	Computational Thinking for Artificial Intelligence	0.25
UNIV*6090	Artificial Intelligence Applications and Society	0.50
One of the following Elective Core courses:		
CIS*6020	Artificial Intelligence	0.50
ENGG*6500	Introduction to Machine Learning	0.50
STAT*6801	Statistical Learning	0.50
Two of the following Complementary AI-related courses: [1]		
BINF*6970	Statistical Bioinformatics	0.50
CIS*6050	Neural Networks	0.50
CIS*6060	Bioinformatics	0.50
CIS*6070	Discrete Optimization	0.50
CIS*6080	Genetic Algorithms	0.50
CIS*6120	Uncertainty Reasoning in Knowledge Representation	0.50
CIS*6160	Multiagent Systems	0.50
CIS*6170	Human-Computer Interaction	0.50
CIS*6180 or DATA*6300	Analysis of Big Data Analysis of Big Data	0.50
CIS*6190 or DATA*6400	Machine Learning for Sequential Data Processing Machine Learning for Sequential Data Processing	0.50
CIS*6320	Image Processing Algorithms and Applications	0.50
CIS*6420	Soft Computing	0.50
ENGG*6100	Machine Vision	0.50
ENGG*6140	Optimization Techniques for Engineering	0.50
ENGG*6570	Advanced Soft Computing	0.50
MATH*6020	Scientific Computing	0.50
MATH*6021	Optimization I	0.50
MATH*6051	Mathematical Modelling	0.50
PHIL*6400	Ethics of Data Science (formerly PHIL*6760 Science and Ethics))	0.50
STAT*6721	Stochastic Modelling	0.50
STAT*6821	Multivariate Analysis	0.50
STAT*6841	Computational Statistical Inference	0.50
ENGG*4430	Neuro-Fuzzy and Soft Computing Systems	0.50
ENGG*4460	Robotic Systems	0.50
STAT*4000	Statistical Computing	0.50

And an acceptable AI-related thesis.

Requirements of this collaborative specialization may also serve as core and/or elective requirements in the student's home program.

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[1]

Students can elect to take a second Elective Core course in lieu of a Complementary AI-related course.

Courses

Required Courses

UNIV*6080 Computational Thinking for Artificial Intelligence Fall Only [0.25]
This course will provide students with an overview of the mathematical and computational foundation that is required to undertake artificial intelligence and machine learning research. Students will also gain an understanding of the historical context, breadth, and current state of the field. Students are expected to have already taken undergraduate courses in probability & statistics, calculus, linear algebra, and data structures & algorithms (STAT*2120, MATH*1210, ENGG*1500, and CIS*2520, or equivalents).
Offering(s): Offered through Distance Education format only.
Department(s): Dean's Office, College of Engineering and Physical Sciences
Location(s): Guelph

UNIV*6090 Artificial Intelligence Applications and Society Unspecified [0.50]
This multidisciplinary, team-taught course provides an in-depth study of how artificial intelligence methodologies can be applied to solve real-world problems in different fields. Students will work in groups to propose solutions whilst considering social and ethical implications of artificial intelligence technologies.
Prerequisite(s): UNIV*6080
Restriction(s): Restricted to students in the collaborative specialization in Artificial Intelligence
Department(s): Dean's Office, College of Engineering and Physical Sciences
Location(s): Guelph

Elective Core

CIS*6020 Artificial Intelligence Unspecified [0.50]
An examination of Artificial Intelligence principles and techniques such as: logic and rule based systems; forward and backward chaining; frames, scripts, semantic nets and the object-oriented approach; the evaluation of intelligent systems and knowledge acquisition. A sizeable project is required and applications in other areas are encouraged.
Department(s): School of Computer Science
Location(s): Guelph

ENGG*6500 Introduction to Machine Learning Unspecified [0.50]
The aim of this course is to provide students with an introduction to algorithms and techniques of machine learning particularly in engineering applications. The emphasis will be on the fundamentals and not specific approach or software tool. Class discussions will cover and compare all current major approaches and their applicability to various engineering problems, while assignments and project will provide hands-on experience with some of the tools.
Department(s): School of Engineering
Location(s): Guelph

STAT*6801 Statistical Learning Unspecified [0.50]
Topics include: nonparametric and semiparametric regression; kernel methods; regression splines; local polynomial models; generalized additive models; classification and regression trees; neural networks. This course deals with both the methodology and its application with appropriate software. Areas of application include biology, economics, engineering and medicine.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

Complementary AI-related

BINF*6970 Statistical Bioinformatics Winter Only [0.50]
This course presents a selection of advanced approaches for the statistical analysis of data that arise in bioinformatics, especially genomic data. A central theme to this course is the modelling of complex, often high-dimensional, data structures.
Offering(s): Annually
Restriction(s): Restricted to Bioinformatics students.
Department(s): Dean's Office, College of Biological Science
Location(s): Guelph

CIS*6050 Neural Networks Unspecified [0.50]
Artificial neural networks, dynamical recurrent networks, dynamic input/output sequences, communications signal identification, syntactic pattern recognition.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6060 Bioinformatics Unspecified [0.50]
Data mining and bioinformatics, molecular biology databases, taxonomic groupings, sequences, feature extraction, Bayesian inference, cluster analysis, information theory, machine learning, feature selection.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6070 Discrete Optimization Unspecified [0.50]
This course will discuss problems where optimization is required and describes the most common techniques for discrete optimization such as the use of linear programming, constraint satisfaction methods, and genetic algorithms.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6080 Genetic Algorithms Unspecified [0.50]
This course introduces the student to basic genetic algorithms, which are based on the process of natural evolution. It is explored in terms of its mathematical foundation and applications to optimization in various domains.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6120 Uncertainty Reasoning in Knowledge Representation Unspecified [0.50]
Representation of uncertainty, Dempster-Schafer theory, fuzzy logic, Bayesian belief networks, decision networks, dynamic networks, probabilistic models, utility theory.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6160 Multiagent Systems Unspecified [0.50]
Intelligent systems consisting of multiple autonomous and interacting subsystems with emphasis on distributed reasoning and decision making. Deductive reasoning agents, practical reasoning agents, probabilistic reasoning agents, reactive and hybrid agents, negotiation and agreement, cooperation and coordination, multiagent search, distributed MDP, game theory, and modal logics.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6170 Human-Computer Interaction Unspecified [0.50]
This course concentrates on the theoretical and practical issues related to the design and study of interactive technologies for human use. Topics include: general principles of design, qualitative and quantitative research methods, prototyping techniques, theoretical issues underlying designing to individuals and groups, and ethical issues related to conducting research involving humans.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6180 Analysis of Big Data Unspecified [0.50]
This course introduces software tools and data science techniques for analyzing big data. It covers big data principles, state-of-the-art methodologies for large data management and analysis, and their applications to real-world problems. Modern and traditional machine learning techniques and data mining methods are discussed and ethical implications of big data analysis are examined. May be offered in conjunction with DATA*6300.
Offering(s): Odd-numbered years
Restriction(s): Credit may be obtained for only one of CIS*6180 or DATA*6300
Department(s): School of Computer Science
Location(s): Guelph

CIS*6190 Machine Learning for Sequential Data Processing Unspecified [0.50]
This course emphasizes machine learning for sequential data processing. It covers common challenges and pre-processing techniques for sequential data such as text, biological sequences, and time series data. Students are exposed to machine learning techniques, including classical methods and more recent deep learning models, so that they obtain the background and skills needed to confront real-world applications of sequential data processing. May be offered in conjunction with DATA*6400.
Offering(s): Odd- numbered years
Restriction(s): Credit may be obtained for only one of CIS*6190 or DATA*6400
Department(s): School of Computer Science
Location(s): Guelph

CIS*6320 Image Processing Algorithms and Applications Unspecified [0.50]
Brightness transformation, image smoothing, image enhancement, thresholding, segmentation, morphology, texture analysis, shape analysis, applications in medicine and biology.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

CIS*6420 Soft Computing Unspecified [0.50]
Neural networks, artificial intelligence, connectionist model, back propagation, resonance theory, sequence processing, software engineering concepts.
Offering(s): Odd-numbered years
Department(s): School of Computer Science
Location(s): Guelph

ENGG*6100 Machine Vision Unspecified [0.50]
Computer vision studies how computers can analyze and perceive the world using input from imaging devices. Topics covered include image pre-processing, segmentation, shape analysis, object recognition, image understanding, 3D vision, motion and stereo analysis, as well as case studies.
Department(s): School of Engineering
Location(s): Guelph

ENGG*6140 Optimization Techniques for Engineering Unspecified [0.50]
This course serves as a graduate introduction into combinatorics and optimization. Optimization is the main pillar of Engineering and the performance of most systems can be improved through intelligent use of optimization algorithms. Topics to be covered: Complexity theory, Linear/Integer Programming techniques, Constrained/Unconstrained optimization and Nonlinear programming, Heuristic Search Techniques such as Tabu Search, Genetic Algorithms, Simulated Annealing and GRASP.
Department(s): School of Engineering
Location(s): Guelph

ENGG*6570 Advanced Soft Computing Unspecified [0.50]
Neural dynamics and computation from a single neuron to a neural network architecture. Advanced neural networks and applications. Soft computing approaches to uncertainty representation, multi-agents and optimization.
Prerequisite(s): ENGG*4430
Department(s): School of Engineering
Location(s): Guelph

MATH*6020 Scientific Computing Unspecified [0.50]
This course covers the fundamentals of algorithms and computer programming. This may include computer arithmetic, complexity, error analysis, linear and nonlinear equations, least squares, interpolation, numerical differentiation and integration, optimization, random number generators, Monte Carlo simulation; case studies will be undertaken using modern software.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

MATH*6021 Optimization I Unspecified [0.50]
A study of the basic concepts in: linear programming, convex programming, non-convex programming, geometric programming and related numerical methods.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

MATH*6051 Mathematical Modelling Unspecified [0.50]
The process of phenomena and systems model development, techniques of model analysis, model verification, and interpretation of results are presented. The examples of continuous or discrete, deterministic or probabilistic models may include differential equations, difference equations, cellular automata, agent based models, network models, stochastic processes.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

PHIL*6400 Ethics of Data Science Unspecified [0.50]
A study of the philosophical implications (ethical, legal, social, political, epistemological, etc.) of recent developments in data science, artificial intelligence, and machine learning.
Department(s): Department of Philosophy

STAT*6721 Stochastic Modelling Unspecified [0.50]
Topics include the Poisson process, renewal theory, Markov chains, Martingales, random walks, Brownian motion and other Markov processes. Methods will be applied to a variety of subject matter areas.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

STAT*6821 Multivariate Analysis Unspecified [0.50]
This is an advanced course in multivariate analysis and one of the primary emphases will be on the derivation of some of the fundamental classical results of multivariate analysis. In addition, topics that are more current to the field will also be discussed such as: multivariate adaptive regression splines; projection pursuit regression; and wavelets. Offered in conjunction with STAT*4350. Extra work is required for graduate students.
Restriction(s): Credit may be obtained for only one of STAT*4350 or STAT*6821
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

STAT*6841 Computational Statistical Inference Unspecified [0.50]
This course covers Bayesian and likelihood methods, large sample theory, nuisance parameters, profile, conditional and marginal likelihoods, EM algorithms and other optimization methods, estimating functions, Monte Carlo methods for exploring posterior distributions and likelihoods, data augmentation, importance sampling and MCMC methods.
Department(s): Department of Mathematics and Statistics
Location(s): Guelph

Undergraduate Complementary AI-related Courses

Code	Title	Credits
ENGG*4430	Neuro-Fuzzy and Soft Computing Systems	0.50
ENGG*4460	Robotic Systems	0.50
STAT*4000	Statistical Computing	0.50