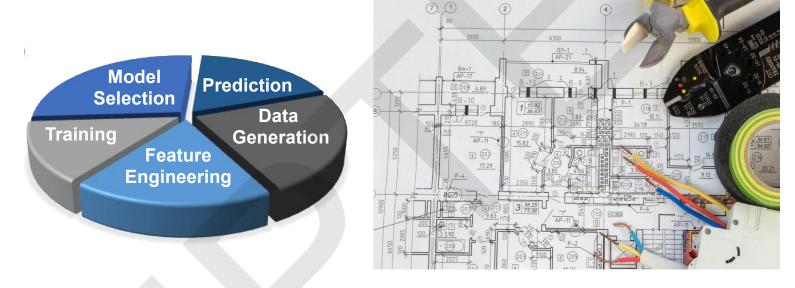
#### **Machine Learning for Core Engineering Disciplines**



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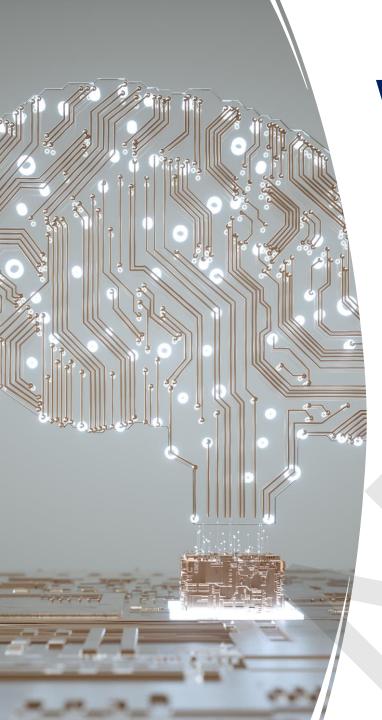
Email: ananthgr@iisc.ac.in



#### Introduction to data science

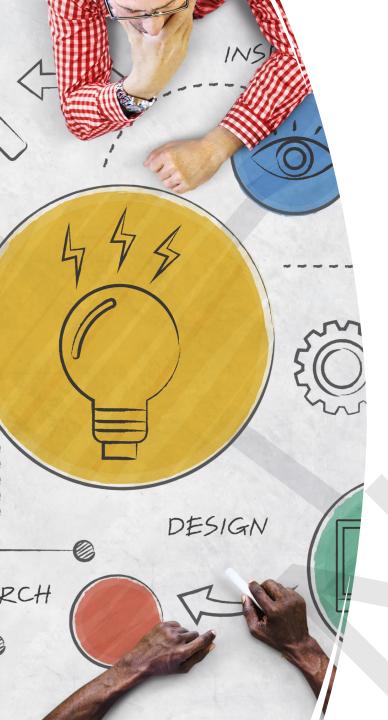
 Data science is the application of statistical and mathematical principles to analyze and understand data

 Probability and statistics play a major role in data science owing to the probabilistic (stochastic) nature of many physical, chemical, and biological processes around us



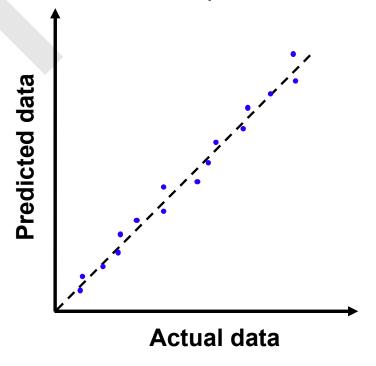
# What is artificial intelligence (AI)?

- Artificial intelligence (AI) involves imparting human-like cognitive functions to machines so that they can make inferences and decisions based on input data
- Given a certain situation/data, an AI can take an informed decision and perform some action based on that
- **Examples:** chatbots, self-driving cars, speech recognition, computer vision, etc.

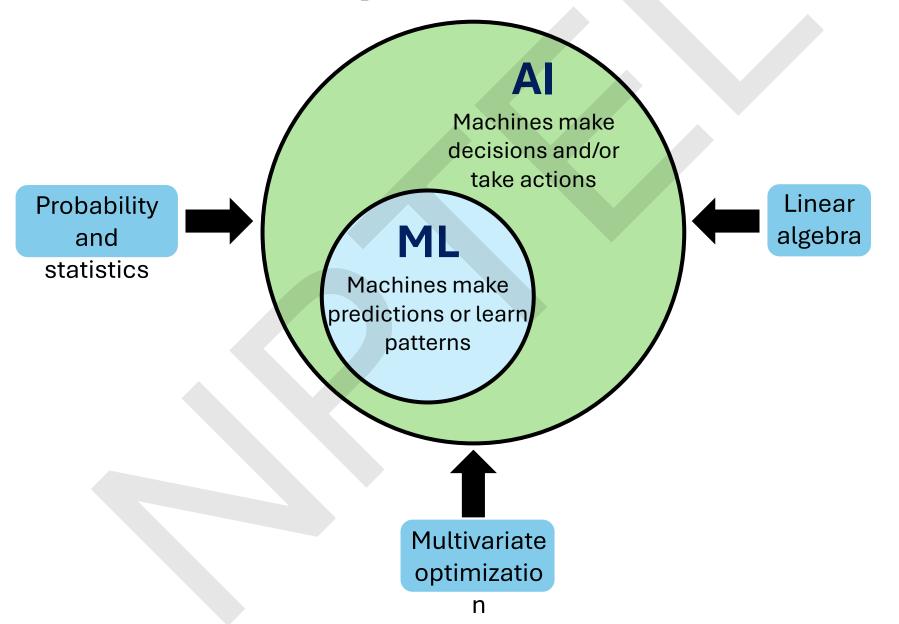


# What is machine learning (ML)?

• Machine learning (ML) is the use of computers to learn (rather than memorize) datasets involving a number of variables, so that they can make predictions corresponding to unseen data points.



# Relationship between AI and ML



# A very brief history of AI/ML

- 1950s-1970s: Birth of Al
  - 1950: Alan Turing proposed the Turing Test
  - 1956: Dartmouth workshop led by Claude Shannon, John McCarthy, Nathaniel Rochester, and Marvin Minsky coined the term AI
  - 1959: Arthur Samuel defined ML as the ability of a computer to learn without being explicitly programmed
  - Focus on symbolic AI: rule-based reasoning, problemsolving



#### A very brief history of AI/ML

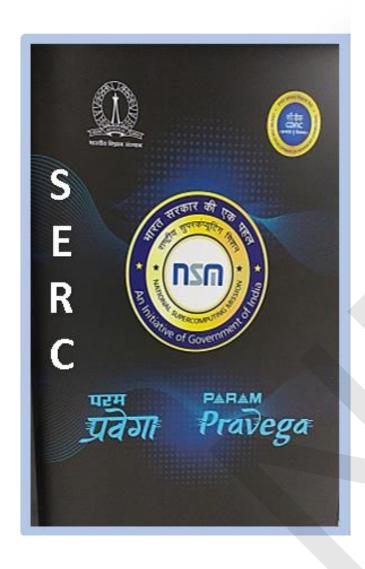
- 1980s-1990s: Rise of ML
  - Shift from rules to data-driven learning
  - Rediscovery of backpropagation enabled training of ANNs
  - Resurgence of recurrent neural networks: Hopfield networks and long short-term memory
  - Rise of statistical methods (e.g., classification and regression trees, SVMs, gradient-boosted trees, etc.)



#### A very brief history of AI/ML

- 2000s-2020s: Deep learning revolution
  - Explosion of big data and GPU computing
  - Breakthroughs in vision (ImageNet) and natural language processing (gated recurrent units, transformers, attention)
  - Applications to healthcare, self-driving cars, and virtual assistants
  - 2024 Nobel Prize in Physics to John Hopfield and Geoffrey Hinton for foundational work in ML and ANNs

#### Why are AI and ML gaining popularity?



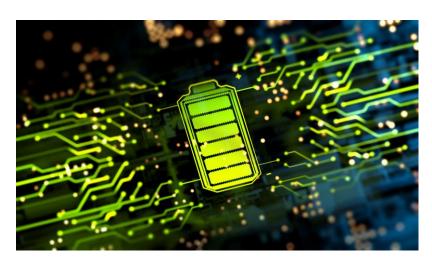
- In recent years, artificial intelligence (AI) and machine learning (ML) have gained immense popularity in various core branches of engineering due to
  - Availability of large amounts of data (albeit of variable quality)
  - Development of new and advanced algorithms related to understanding and predicting data
  - Ability to automate experiments and simulations
  - Rise of field-specific large-language models

#### **Advantages of ML**

 Mitigates challenges associated with a lack of closed form expressions or theories

- Helps demystify datasets with a high degree of dimensionality, i.e., with a large number of independent variables, where each one's effect is unclear
- Once trained, the model can reduce computational cost of making predictions by several orders of magnitude

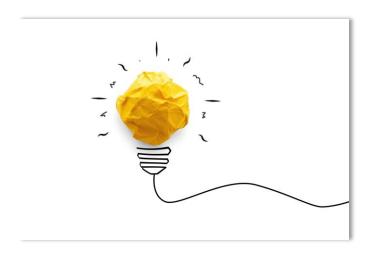




#### Disadvantages of ML

- Models typically require a large amount of data to train which may not always be available or may be of poor quality
  - Mitigated recently by the introduction of foundation models and fine-tuning strategies
- May obscure the physics or chemistry or biology of the problem in some cases, since all the focus is on data
  - Physics-informed or physics-inspired ML has become popular recently

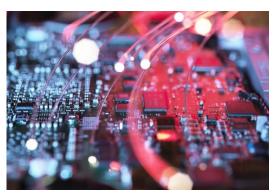
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.60 9217.67 EUR F +5083.11 +07
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#### Examples of ML applied to engineering problems

- Chemical: Optimization of operating conditions for a chemical plant to increase process efficiency
- Materials: Discovery of new electrocatalysts for green hydrogen production
- Electrical: Circuit design for reducing power consumption in processors
- Civil: Optimizing structural layouts of skyscrapers for earthquake resistance
- Mechanical/Aerospace: Automobile or aeroplane design for increased fuel efficiency

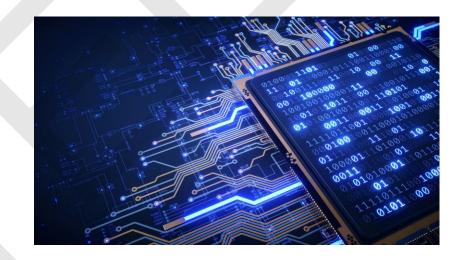






#### Learning outcomes of the course

- Aim: To enable students and practitioners of core engineering disciplines to understand and deploy machine learning for various applications
- Reference books:



- Trevor Hastie, Robert Tibshirani, and Jerome Friedman, "The Elements of Statistical Learning: Data Mining, Inference, and Prediction," Springer
- Christopher M. Bishop, "Pattern Recognition and Machine Learning," Springer
- Ian Goodfellow, Yoshua Bengio, and Aaron Courville, "Deep Learning," MIT Press