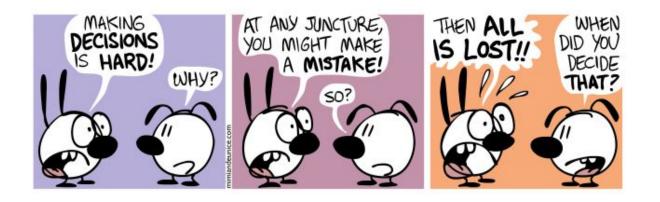


# Steve Kroon

PLEASED: Planning, Learning, and Search for Decision-making. http://www.cs.sun.ac.za/~kroon/decision.html

Maties Machine Learning: 25 October 2019



"This group considers almost any aspect of the general decision-making problem, including sequential decision-making under uncertainty. Major sub-problems we consider are planning, machine learning, and search algorithms. Our approach is grounded in probability theory and game theory for managing uncertainty and multi-agent systems."

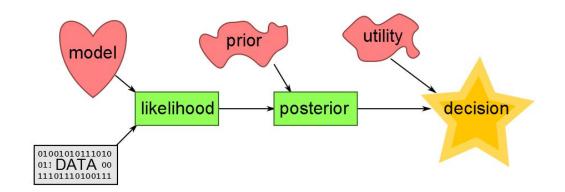
# Single agent, single decision

#### Principled - grounded in:

- Probability theory
- Decision theory
- Game theory

#### Typically requires:

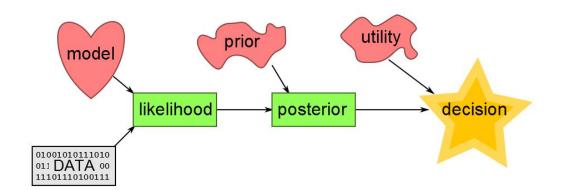
- A model (perhaps >1)
- Data
- Payoff function



Good foundation: Bayesian decision theory

### **Extensions**

- Sequential decision making
  - Search
  - Planning
  - Bayes filter
  - Reinforcement learning
- Multi-agent settings
  - Adversarial
  - Collaborative
- Tractable inference/decision making
  - Inference approaches
  - Search techniques
  - Choice of approximations



# **Group members**

- 2008-: Steve Kroon (staff)
- 2016-: Jordan Masakuna (PhD student, co-supervising with Simukai Utete) coordination of solitary robots.
- 2016-: Marc Christoph (Masters student, co-supervising with Cornelia Inggs) distributed Monte Carlo tree search.
- 2017-: Arnu Pretorius (PhD student, co-supervising with Herman Kamper) noise-regularized neural networks.
- 2018-: Marno Basson (Masters student, co-supervising with Jamie Cripwell, Lidia Auret and Roelof Coetzer) Bayesian ODE parameter inference.
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- 2018-: Scott Cameron (Master student, co-supervising with Hans Eggers) evidence estimation with stochastic likelihood approximations.
- 2018-: Dirko Coetsee (PhD student, co-supervising with McElory Hoffmann and Luc de Raedt) automated spreadsheet integration.
- 2019-: Hendri Krijt (Honours student) news feed topic clustering.
- 2019-: Ignazio Ferreira (Honours student) Wasserstein shapeshifting.



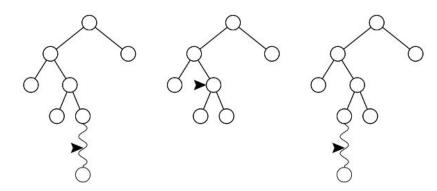
# Continuous time analysis Align weight matrices $\sum_{w_{i1}} V_{i1} V_{i2} V_{i3} V_{i4} V_{i4} V_{i5} V_{i$

#### Current

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\*understanding relationships between and properties of machine learning/statistical models and approaches to fitting them

# Search/Planning



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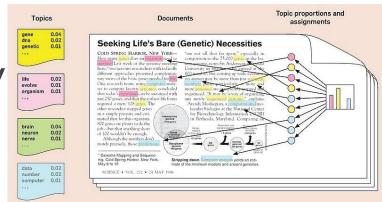


# Likelihood Data Prior Bayes' Theorem Posterior Distribution

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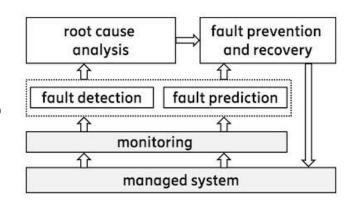


# Latent variable models/ variational inference



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# Process monitoring and fault detection/diagnosis



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Learning Theory\* (mostly NNs)

Search/Planning (mostly MCTS)

Bayesian analysis

Latent variable models and variational inference

Process monitoring, fault detection and diagnosis

#### Common elements:

- Regularizing effects of model, inference, and optimization
- Tractable inference/search
- Dynamical systems

### **THANK YOU - QUESTIONS?**