

## **Learning goals**

### **1. Introduction**

1. Recall Marr's three levels of analysis and an example thereof (barn owl)
2. Recall the Bayesian brain hypothesis
3. Explain what is meant by predictive coding
4. Explain the difference between Bayesian models and ANN models as methods to understand brain function

### **2. Theory**

1. Understand the basics of Bayesian inference (prior, likelihood, posterior)
2. Be able to apply Bayes' rule and explain its components
3. Understand ML and MAP estimation. Know what is meant by Bayesian model comparison and write down the equation for the Bayes factor
4. Understand what a multilayer perceptron is
5. Be able to explain Q-learning, policy, action-value function
6. Explain how neural networks can be used to implement Q-learning

### **3. Models of memory**

1. Understand the similarities and differences of the models of working memory
2. Explain the differences between procedural and declarative memory
3. Understand what conjunctive information is
4. Explain why the hippocampus is ideally suited to support conjunctive representations
5. Be able to explain pattern separation and completion (and their neural correlates)
6. Understand the possible mechanisms behind the hippocampal-neocortical dialogue
7. Be able to explain replay as a consolidation mechanism

### **4. Neuromodulation**

1. Understand why organisms need to optimize their behaviour, and how simulated annealing is an apt metaphor for this.

2. Explain the concepts of exploration and exploitation, and why a trade-off is necessary between them.
3. Understand the difference between phasic and tonic modes of locus coeruleus firing, and how these relate to cognitive performance, exploration, and exploitation.
4. Describe the mutual inhibition model of decision making, and explain how norepinephrine can be incorporated into this model to influence responses.
5. Explain how tonic and phasic firing modes might be related to short- and long-term utility.
6. Describe the evidence supporting the hypothesis that norepinephrine subserves the optimization of behaviour (for example, how it can influence the learning rate in reinforcement learning paradigms).
7. Outline possible research approaches for investigating the role of norepinephrine in adaptive behaviour; propose a hypothesis and explain how you would design an experiment to test it.

## **5. Bayesian connectomics**

1. Understand the difference between structural, functional and effective connectivity.
2. Outline the principles of generative modeling and Bayesian inference.
3. Outline how structural or functional connectivity may be estimated using a Bayesian generative approach.
4. Explain why a generative approach enables principled integration of different data modalities, and outline how structural and functional connectivity inform each other.
5. List a number of pros and cons of Bayesian approach to connectivity compared to traditional approaches.

## **6. Optimal control**

1. Understand which computational problems the brain has to solve in order to successfully execute a movement
2. Understand the optimal control model, including each of the elements and how they are linked to each other and its features and assumptions/limitations
3. Understand the state estimation (Kalman filter) model, including each of the elements and how they are linked to each other and its features and assumptions/limitations
4. Understand Optimal Feedback Control Theory, including each of the elements and how they are linked to each other and its features and assumptions/limitations

5. Be able to formalize an Optimal (Feedback) Control model by formulating the state equation, the measurement equation, the cost function, the state estimation and the control policy based on a Linear Quadratic Gaussian (LQG) controller
6. Be able to explain and interpret the differences between optimal control and Optimal Feedback Control (OFC)
7. Be able to make predictions for experiments that address neural responses or human behaviour from the three covered theories (Optimal control, state estimation, and Optimal Feedback Control)
8. Be able to design behavioural or (single-)neuron experiments to test predictions from the three covered theories (Optimal control, state estimation, and Optimal Feedback Control)
9. Be able to explain which brain areas are thought to play an important role in each of the components of the three covered theories (Optimal control, state estimation, and Optimal Feedback Control)

## **7. Reinforcement learning**

1. Understand why we believe that Pavlovian conditionings is driven by error-based learning
2. Recall the equations and use these to explain the two basic features of the Rescorla-Wagner model
3. Understand the evidence is that midbrain dopamine firing reflects the reward prediction error
4. Explain the limitations of the Rescorla-Wagner model (ie. which phenomena it cannot explain)
5. Explain how temporal difference learning addresses these
6. Explain how goal-directed behaviour cannot be understood in terms of classic learning theory (ie. RW and TD learning)
7. Understand how goal-directed and habitual behaviour can be distinguished experimentally

## **8. Predictive processing**

1. Understand how predictions benefit different brain functions (e.g. perception, motor control).

2. Recall some behavioral as well as neural evidence that the brain uses predictions based on prior knowledge.
3. Be able to explain the main theories of predictive processing (i.e. Bayesian brain, predictive coding, free energy principle).

## **9. Neural representations**

1. Understand different ways of modeling the stimulus response relationship as well as their strengths and weaknesses.
2. Have a high level understanding of convolutional neural networks, and how they can and have been used to probe neural representations in different sensory areas.
3. Know how recurrent neural networks are different than other models and what problems with neural coding in fMRI they can solve.