

iBehave:  
Towards the Sequencing of Behaviour

Mike Dewar

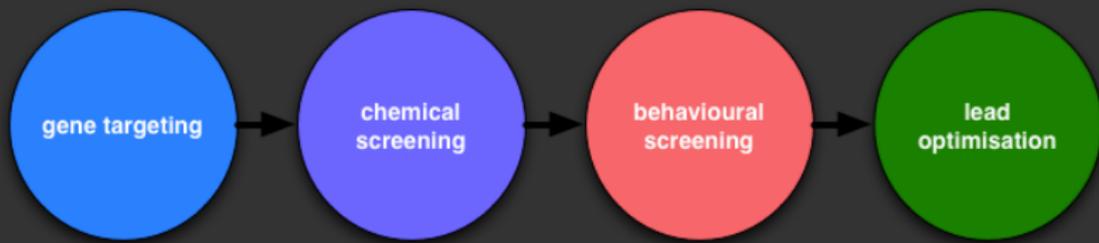
School of Informatics, University of Edinburgh

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# Structure

- ▶ Motivation
- ▶ Automatic Annotation
- ▶ Sequencing Behaviour

## iBehave: Motivation



solving the bottlenecks: \$300 000 000

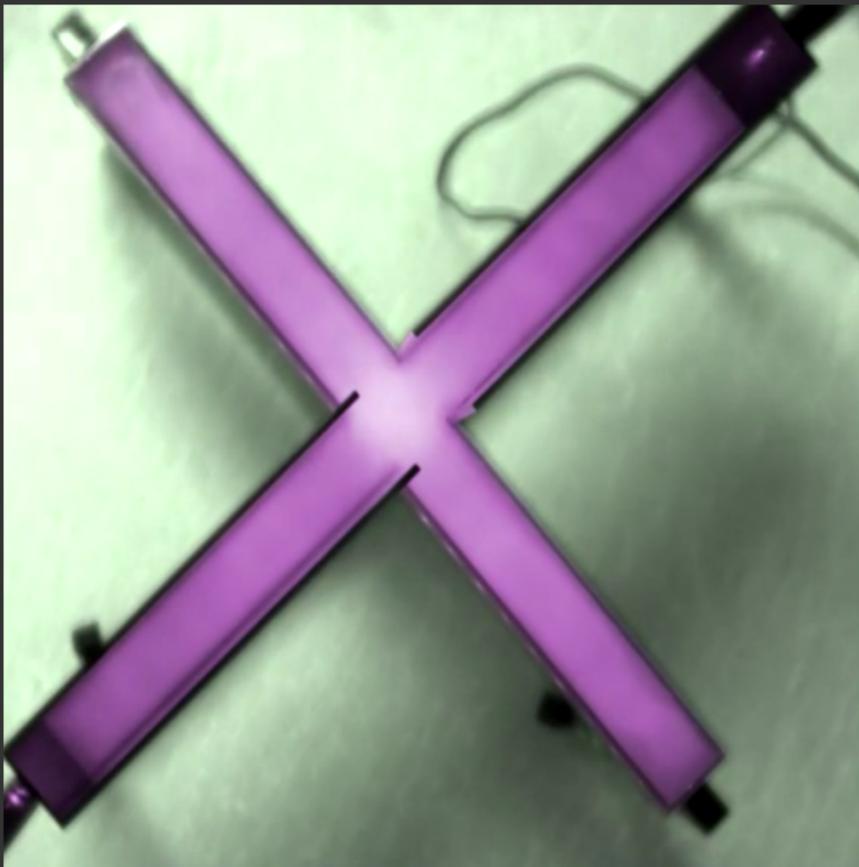


Figure: The elevated plus maze - a typical behavioural assay

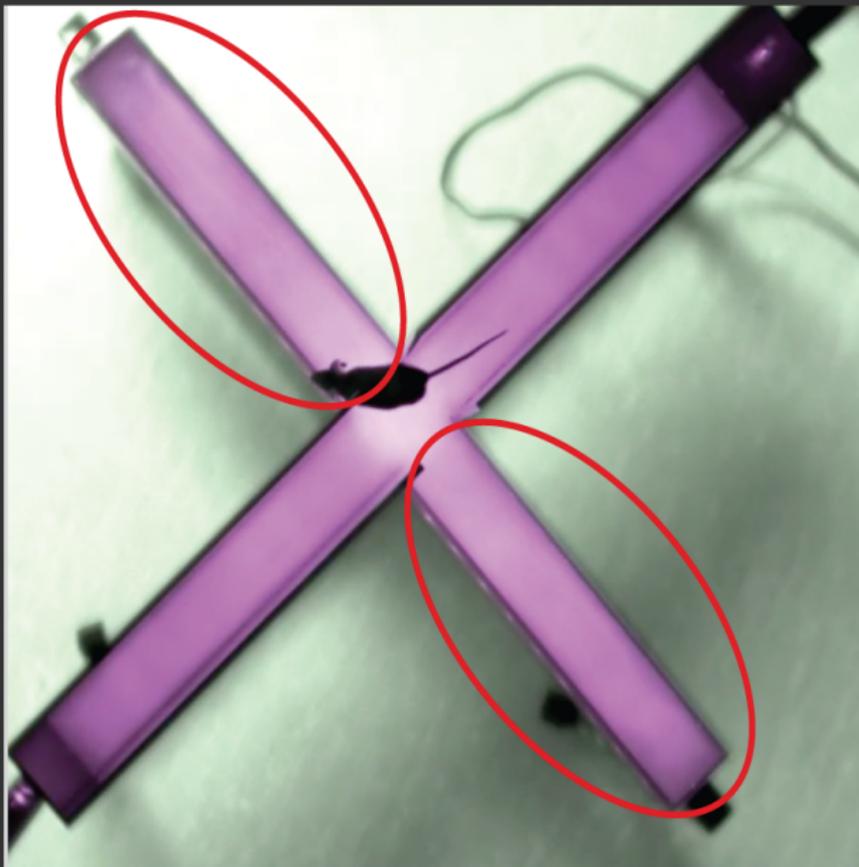


Figure: The captured dynamics are typically ignored in favour of crude aggregated behavioural indices

# Zebra Fish



Figure: Zebra fish used in aggression assays

# Chickens



Figure: Chickens studied in a welfare monitoring context

## Low Hanging Fruit: Automatic Annotation

# Automatic Annotation: Aims

- ▶ To automatically infer aggregated behavioural indices.
- ▶ To mimic expert annotation - to allow individual labs to define behaviour.
- ▶ To work at (faster than) real time.
- ▶ To be consistent within and across labs.

# Fruit Flies

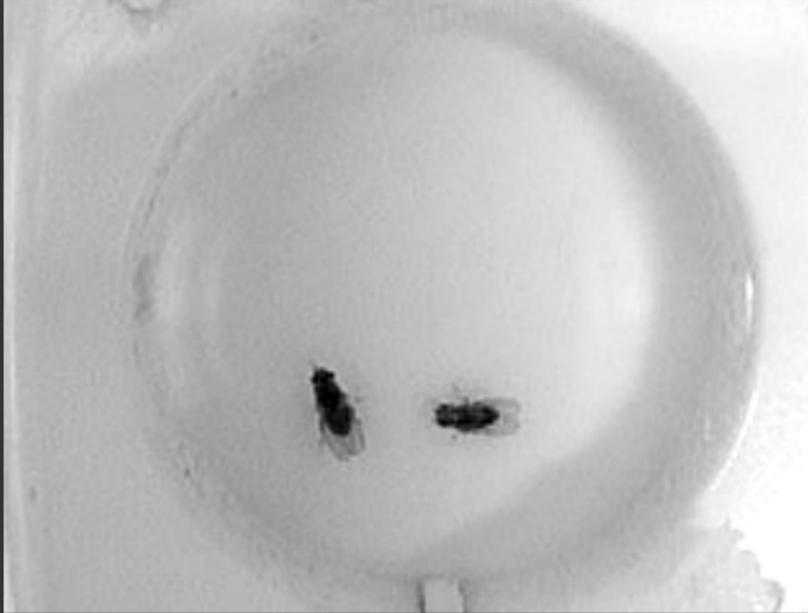


Figure: Fruit flies in a courtship assay

# Rats



Figure: Rats in a libido study

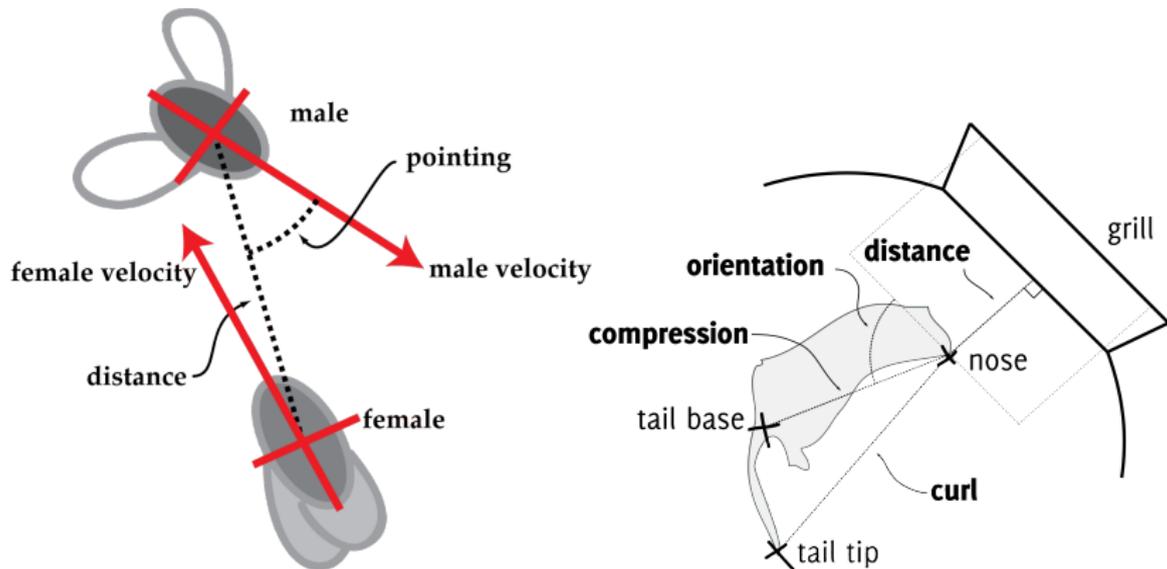


Figure: Fly and rodent features used in the static machine learning

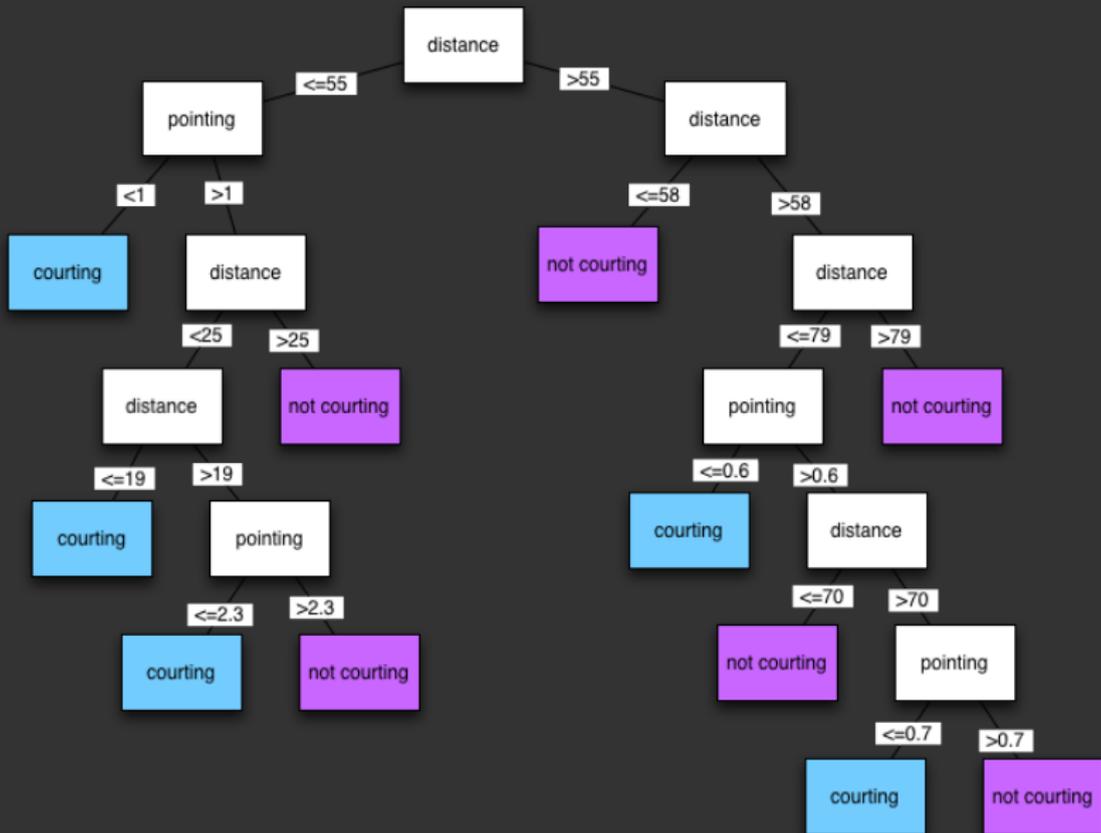


Figure: Extracted decision tree for the flies



Figure: Results of the classification exercise in flies

Automatic AI Intact  
Manual AI Intact

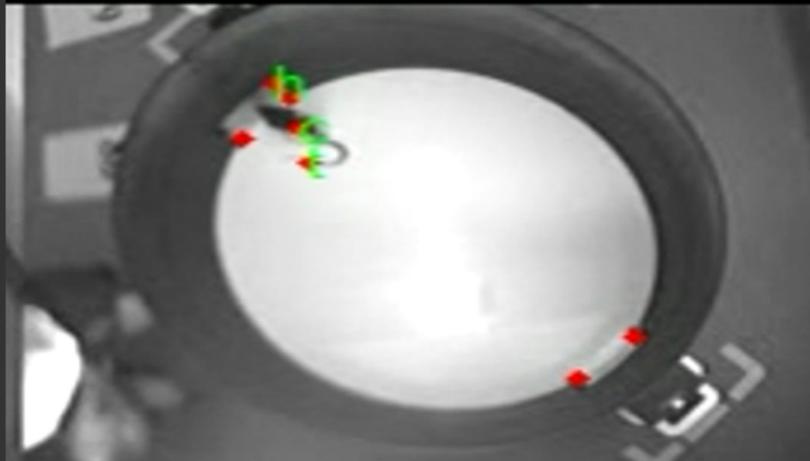
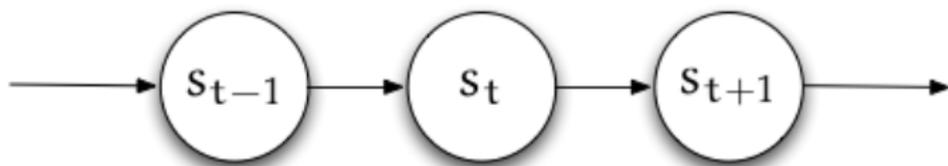


Figure: Results of the classification exercise in rats

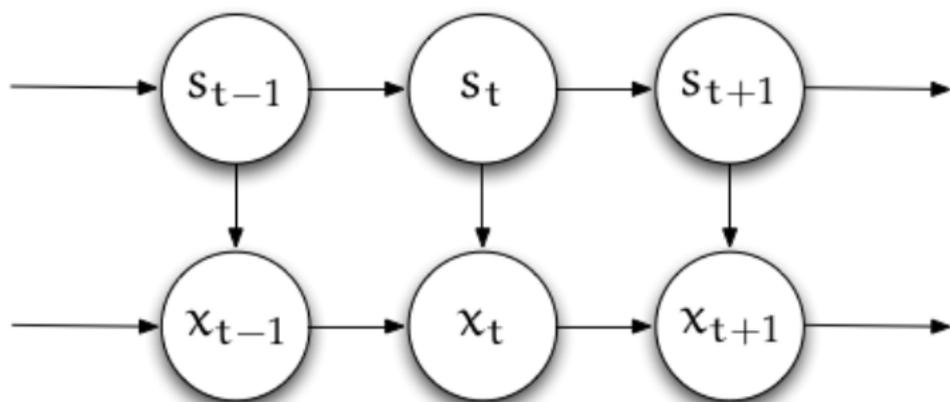
Future Work: Sequencing Behaviour

# Sequencing Behaviour: Aims

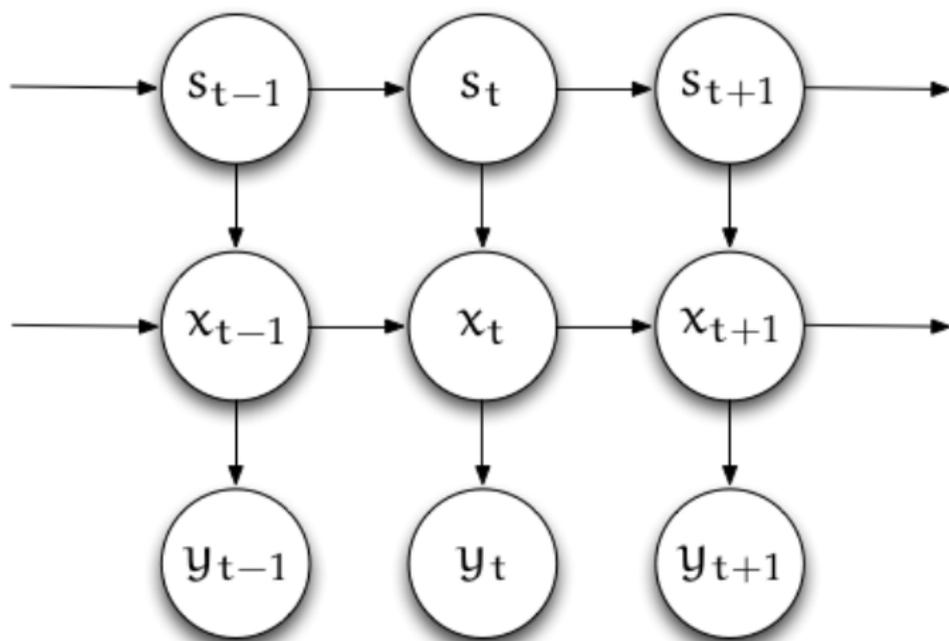
- ▶ Extract sequences of behaviour in an unsupervised way
- ▶ Allow individual labs assign meaning
- ▶ Automatically generate ethograms/Markov Chains



$s_t$ : behavioural state



$x_t$ : dynamic model state



$y_t$ : observed feature vector

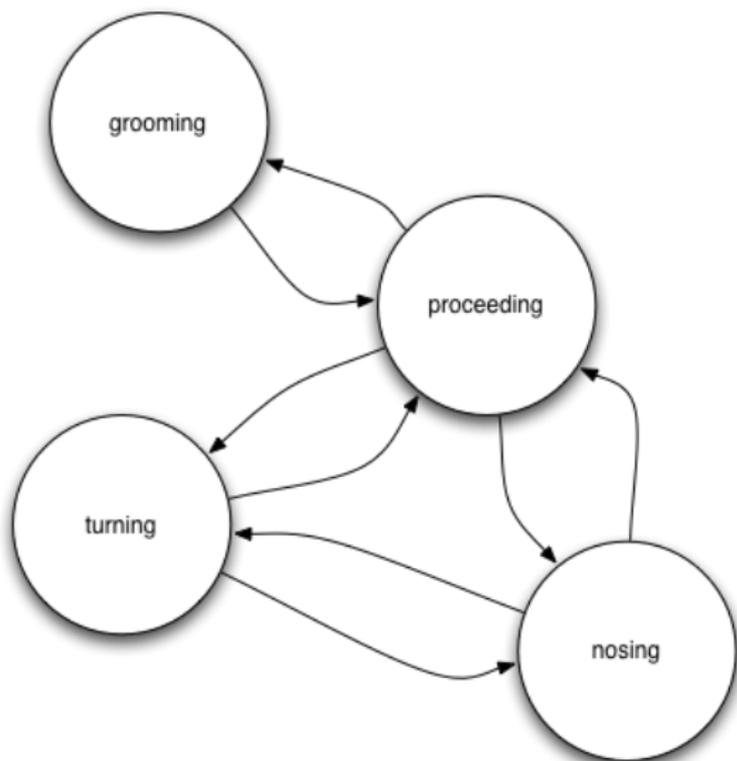


Figure: An extracted model of normal behaviour

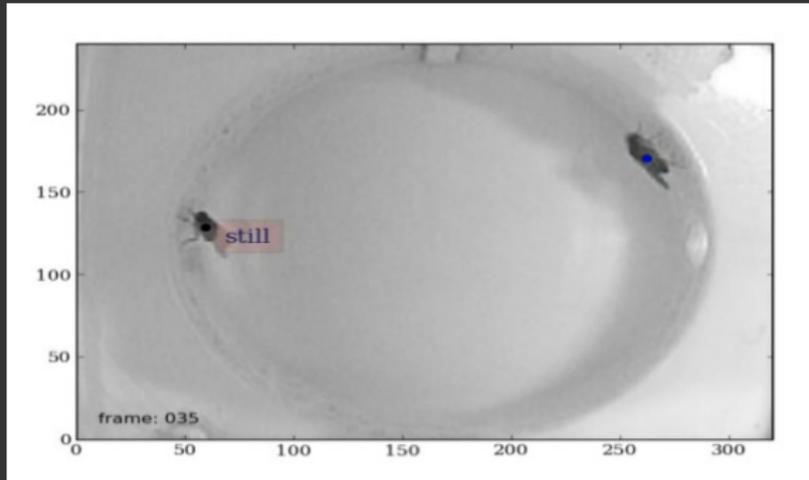


Figure: Results of the sequencing behaviour experiment

# Summary

- ▶ Drug discovery's bottle neck: behavioural phenotyping.
- ▶ Supervised learning: quick and profitable.
- ▶ Unsupervised modelling: promising yet challenging.

# Acknowledgments

- ▶ iBehave is Douglas Armstrong, James Heward, Tim Lukins and Mike Dewar
- ▶ The iBehave proof-of-concept project is supported by Scottish Enterprise