

Data Driven Optimization of Reduced Neural Models

With a Large Scale Analysis of Models and Data

by

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Doctor of Philosophy

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## ABSTRACT

## ACKNOWLEDGMENTS

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## 0.1 Further Validation of Optimized Models

Models can continue to undergo validation checks subsequent to optimization. One way to do this is to move from a single spiking stimulus regime, to a multispiking regime, and then use different feature extraction libraries using a much larger number of features. The higher dimensional feature space can be reduced to a low dimensional space, where it is easier to discriminate between models and data.

Agreement between the optimized.



## RESULTS

### 0.2 PCA and tSNE



Figure 1. Principal Component Analysis

Feature Variance distributed though-out a plane, the plane was output from applying dimension reduction to a high dimensional (552 dim) feature Space. The plane is related to two projection vectors that were point in the directions of maximal variance in the data. Data is comprised by a collection of reduced neuronal models, and real recordings of voltage traces from neurons. Data and models are so different in this space that they are easily discriminated, and they fall into several natural clusters. Random Forests variance explained was later used to identify, dimensions that contributed the most variance. *T-Distributed Stochastic Nearest Neighbour Spatial Embedding*

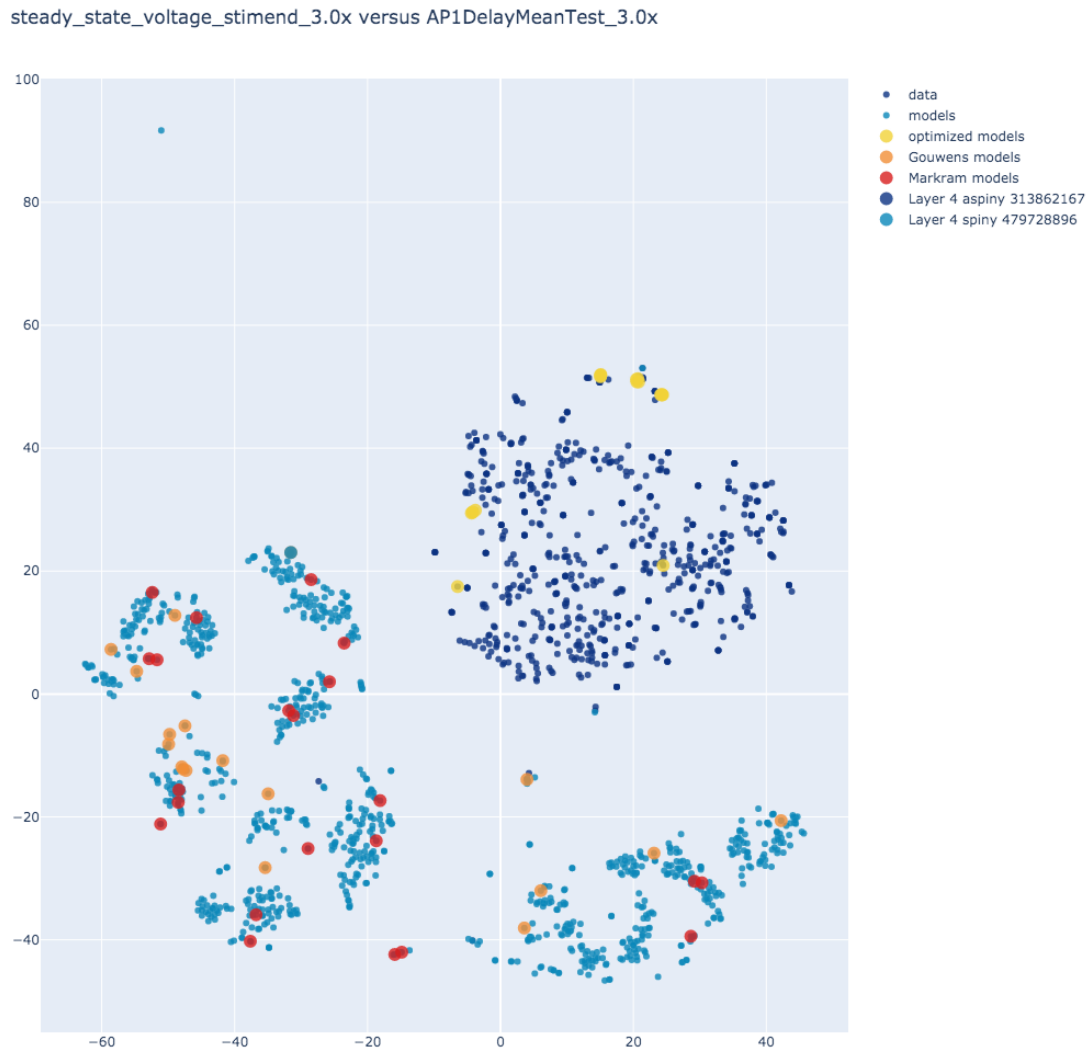


Figure 2. t distributed stochastic Neigherset Neighbour Spatial Embedding

*Source:* Krishnappa (2012)

*Note:* Here is a note that is especially long to show what happens when it extends to more than one line.

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## Chapter 1

### INTRODUCTION

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In this research effort,

#### 1.1 Specific Aims

##### 1.1.0.1 1A:

Optimize reduced neuronal models across four different cell types, using two different classes of models:

olfactory bulb mitral cell	layer IV pyramidal neuron	cerebellar purkinje cell	cal pyramidal
HH model score	HH model score	HH Model score	HH model score
Izhikitich model score	Izhikitich model score	Izhikitich model score	Izhikitich model

#### 1.1.0.2 2A:

By fitting cellular models to experimental data, using spike waveform shape features, we can then take optimized models, and characterize and cellular behaviors using Allen SDK and EFEL feature extraction software to evaluate electrical robustness across a large number of features.

#### 1.1.0.3 Aim 2:

Characterize and evaluate region-specific differences of cortical neuron-type data and models.

#### 1.1.0.4 2A:

Using large, publicly available datasets for neuron classes, we will characterize region-specific differences and evaluate neuron-type models for agreement with experimental data.

#### 1.1.0.5 2B:

Using models of neuron-types from different cortical regions we will identify the features underlying differences among neuron types and across regions, as well as the biophysical mechanisms that underlie those features.

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## 1.2 Citation examples

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## 1.3 Footnote examples



## NOTES

## REFERENCES

- Krishnappa, Yathin S. 2012. *Adult springbok (Antidorcas marsupialis) male in Etosha National Park*, November 24. Accessed September 25, 2014. [https://commons.wikimedia.org/wiki/File:Antidorcas\\_marsupialis,\\_male\\_\(Etosha,\\_2012\).jpg](https://commons.wikimedia.org/wiki/File:Antidorcas_marsupialis,_male_(Etosha,_2012).jpg).
- Pathak, P, SP Wani, R Sudi, AK Chourasia, SN Singh, and Kesava Rao. 2007. *Rural Prosperity through Integrated Watershed Management: A Case Study of Gokulpura–Goverdhanpura in Eastern Rajasthan*. Global Theme on Agroecosystems 36. Patancheru, India: International Crops Research Institute for the Semi-Arid Tropics (ICRISAT). Accessed September 7, 2014. <http://www.icrisat.org/Journal/volume5/aes/aes6.pdf>.
- Searchinger, Tim, Craig Hanson, Janet Ranganathan, Brian Lipinski, Richard Waite, Robert Winterbottom, Ayesha Dinshaw, and Ralph Heimlich. 2013. *World Resources Report 2013–14: Interim Findings—Creating a sustainable food future*. Washington, DC: World Resources Institute. Accessed June 6, 2014. [http://www.wri.org/sites/default/files/WRI13\\_Report\\_4c\\_WRR\\_online.pdf](http://www.wri.org/sites/default/files/WRI13_Report_4c_WRR_online.pdf).

## APPENDIX A

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