



# EXPANDING THE HORIZONS OF REHABILITATIVE NEUROSCIENCE THROUGH DEEP NEURAL NETWORKS

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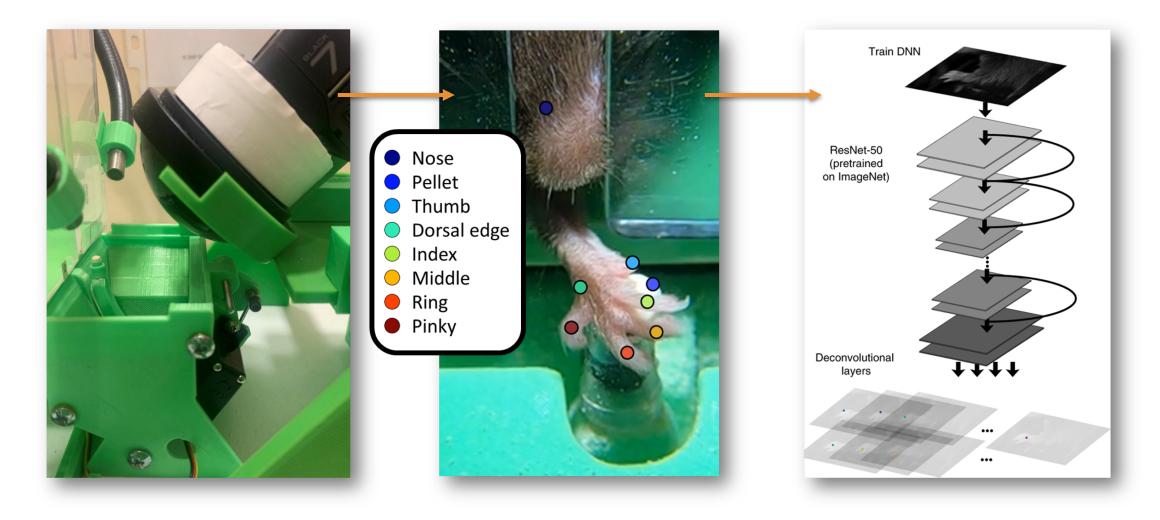
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### MILLER SCHOOL of MEDICINE



### DeepLabCut



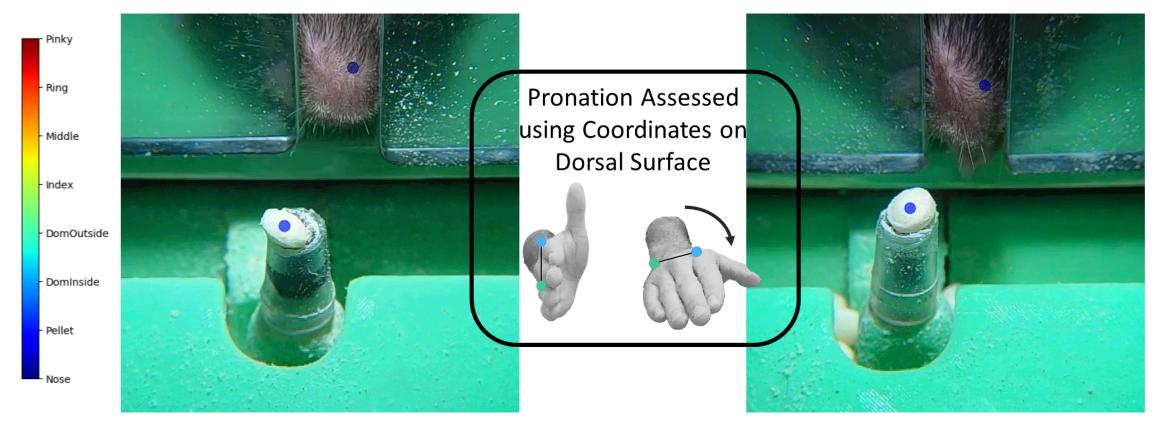


# DNNs allow us to automate behavioral analysis of normal and injured mice



**Pre-Injury** 

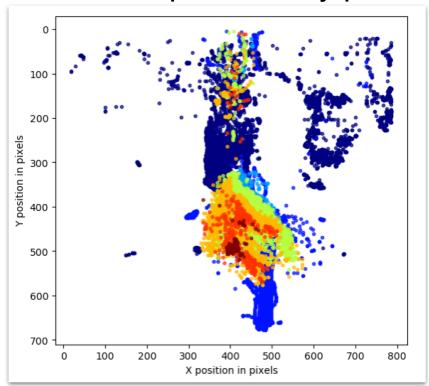
**Post-Injury** 



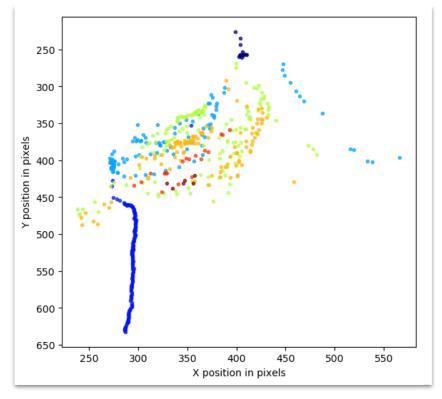
## Visual Study of a Mouse's Recovery Post Spinal Cord Injury (PSCI)

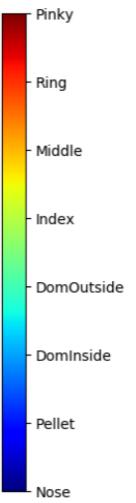


#### 6-minutes plot of body parts



#### Single success - 1 second

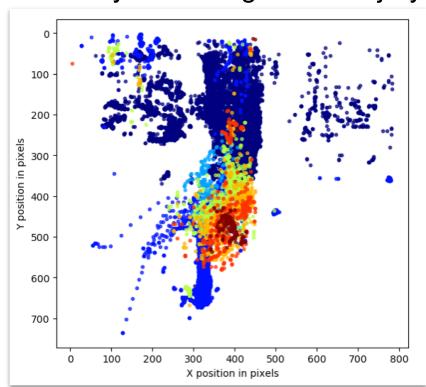




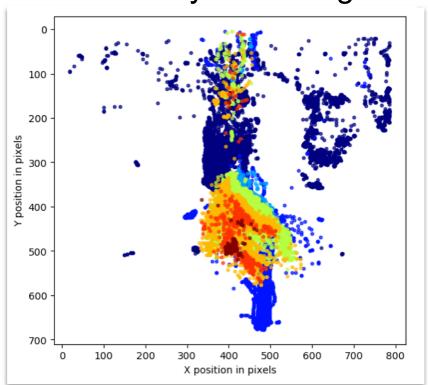
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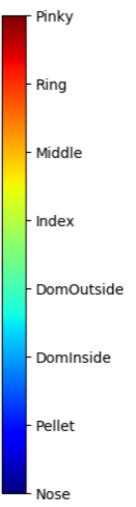


1<sup>st</sup> day of training – PRE-Injury



Last day of training

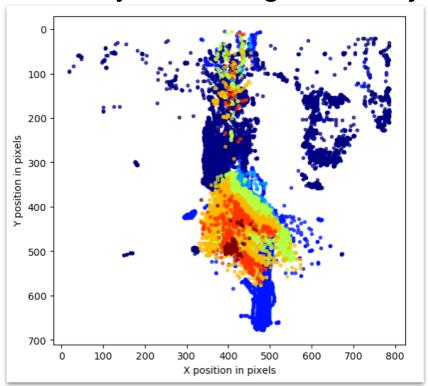




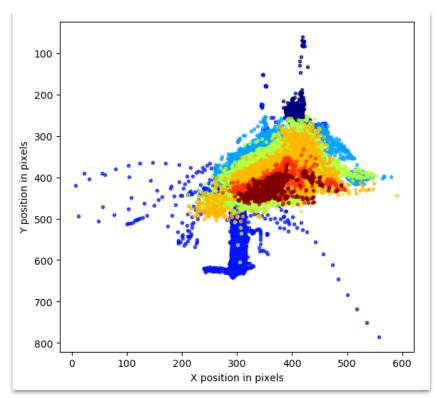
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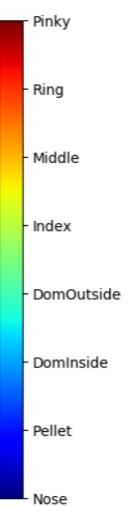


#### Last day of training - PRE-injury



#### 3-week PSCI





### Performance of DNN is optimized through multiple parameters

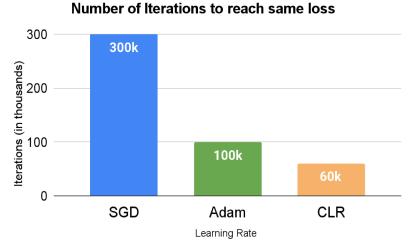


Depth	Training Error
Resnet50	~4.60
Resnet101	~4.00
Resnet152	~4.00

Learning Rate	Training Error	Iterations
SGD	4.62	~300k
Adam	4.13	~100k
CLR	3.83	~75k

Image Augmentation	Training Error
Default (adam, Resnet101)	4.62
Image Augmentation	3.90
Image Augmentation +Tensorpack	3.83

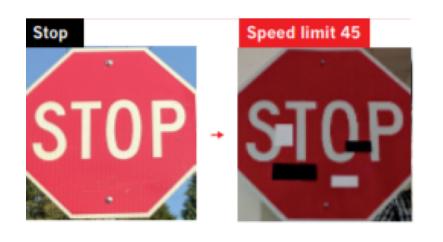


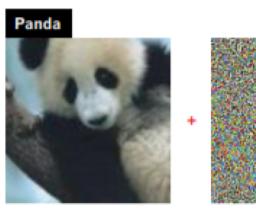




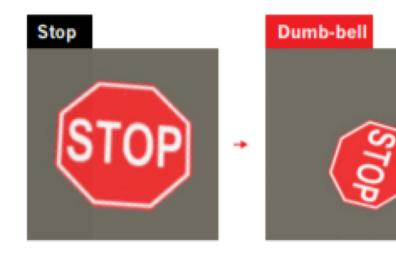


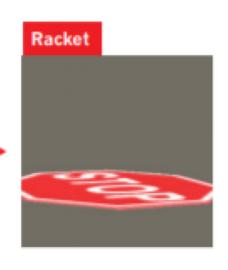
### Miniscule distortions can destroy even the most robust neural network

















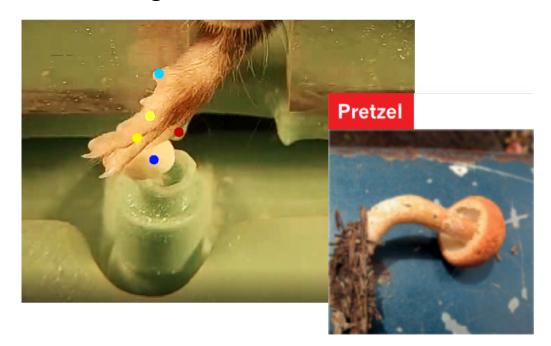


DNN	Resnet <b>101</b> , Adam	Resnet152, Adam+CLR, Tensorpack, Image Augmentation
Training Error	3.80	3.80

# Future Directions: How to further prime the DNN to become foolproof



- Augmenting image dataset through matrix transformations (rotations, shears, etc)
- 2. Extracting outlier frames







### Team Science Is The Way To Go



#### **LemBix Lab (2021 version)**

### Vance Lemmon John Bixby

Nick O'Neill (computation, AI, behavior) Kar Men Mar (in vivo, behavior)

Hassan Al-Ali (thinking, math, screening)
Yania Martinez (screening, AAVs)
Yan Shi (high content analysis)
Matt Danzi (computation, Al, genomics)
Melissa Munoz (everything wet, behavior)



Zheng Wang Tong Liu



Supported by the NIH (U01EY027257, NS080145, NS059866, HD057521)

The State of Florida,

The Miami Project to Cure Paralysis, and the Walter G. Ross Foundation