

# Bioacoustics... beyond birds!

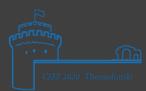
Shyam Madhusudhana & Yu Shiu

Center for Conservation Bioacoustics,

Cornell Lab of Ornithology, Cornell University, NY, USA











### Al in bioacoustics



#### **Terrestrial**

Birds & bats

Mammals

**Anurans** 

Insects



#### Marine/Aquatic

**Mammals** 

Fish

Coral reefs

CCB projects as of January 2020



# Present disconnect



BirdCLEF, DCASE, Kaggle



DCLDE, ASA's bioacoustics session



Insects. (Anybody cares?)



**Ecoacoustics vs bioacoustics** 

CCB projects as of January 2020 bioacoustics.cornell.edu





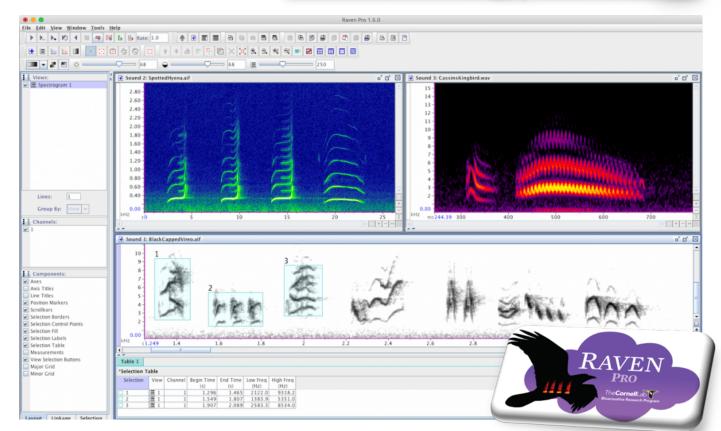
#### CCB – What we do

- Conservation science using bioacoustics
- Facilitate research
  - Hardware
  - Software (RavenPro: ~1500 citations)
- Global collaborations

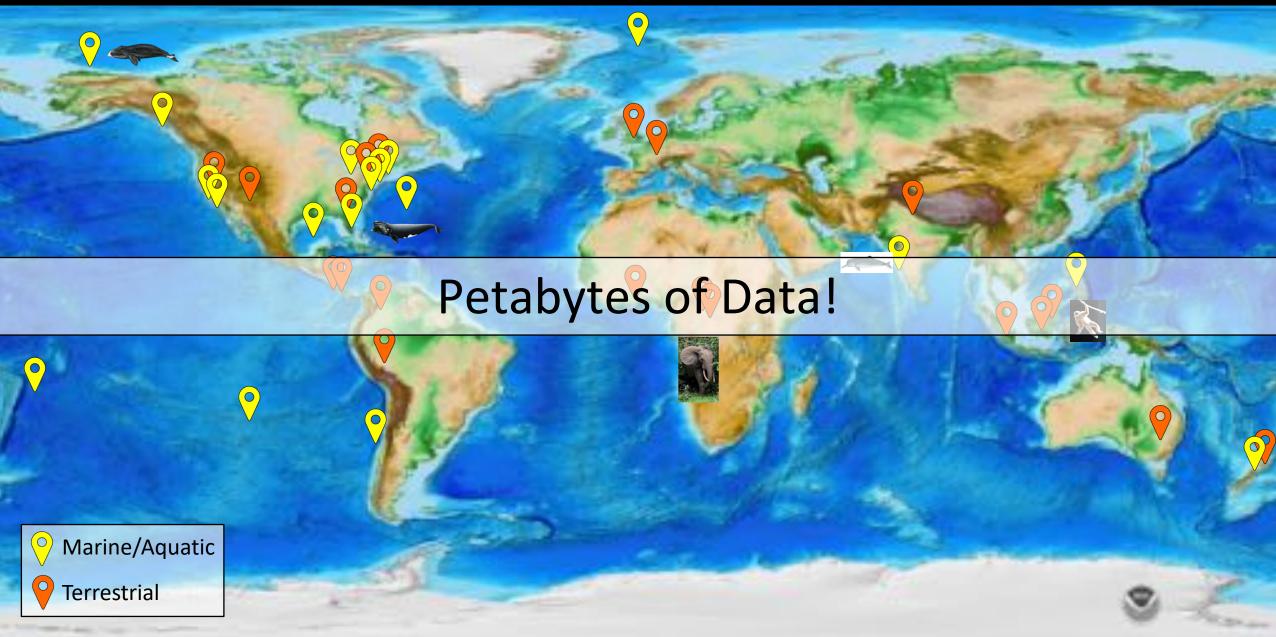


SWIFT: CCB's Terrestrial Recording Unit









CCB projects as of January 2020 bioacoustics.cornell.edu

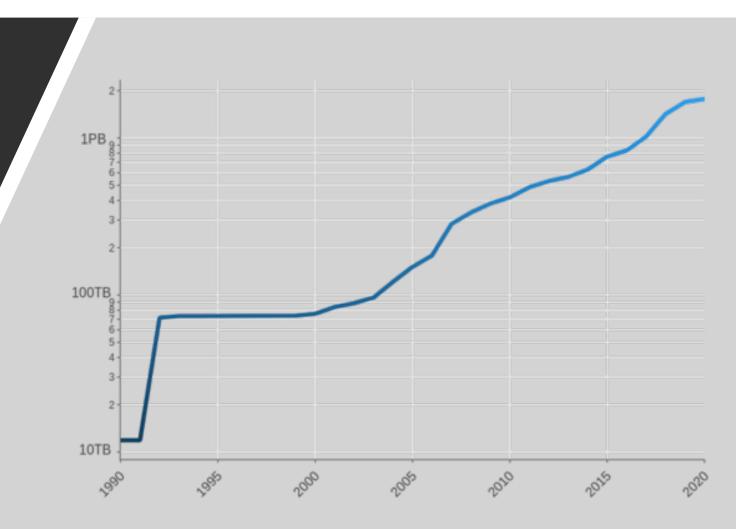


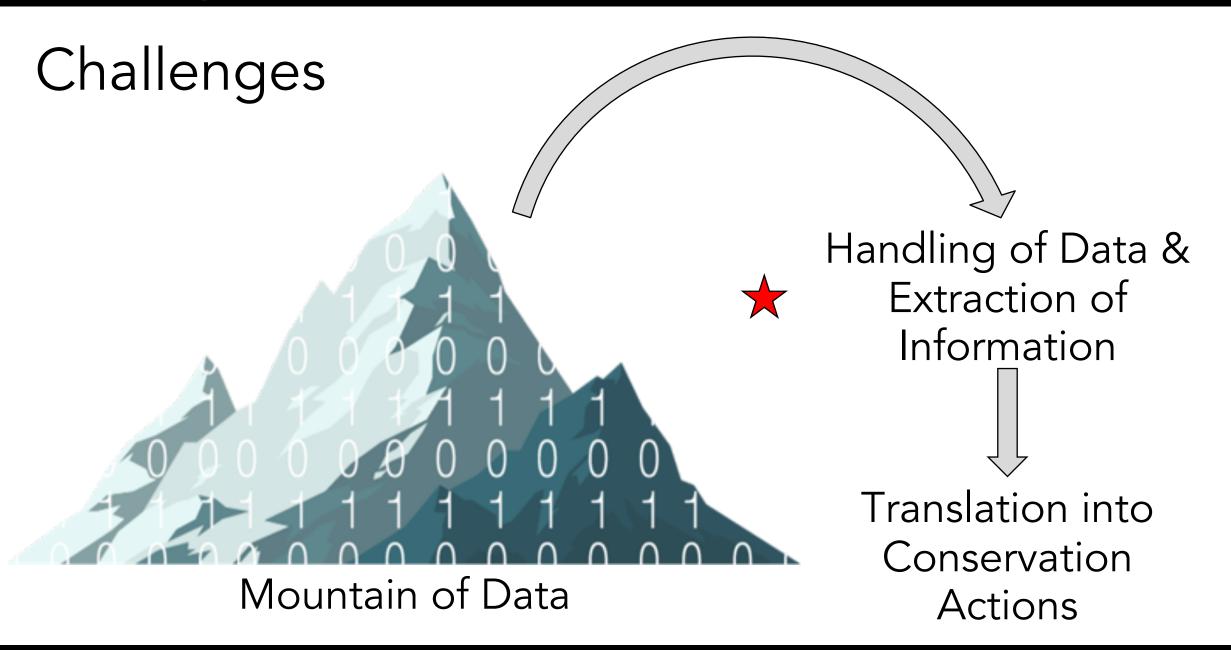
#### Data collection & growth



Terrestrial [48 kHz @ 16 bit]: ~8 GB/channel/day

Marine [200 kHz @ 24 bit]: ~50 GB/channel/day





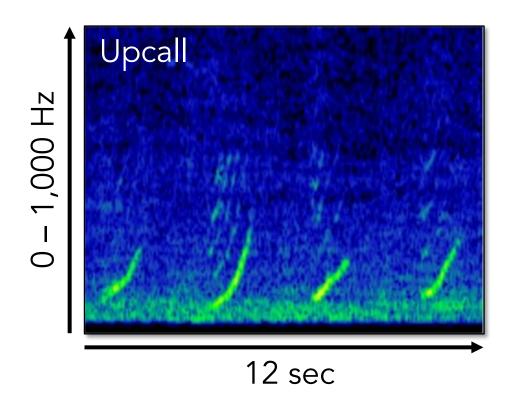


#### WhaleNET (1 species model, LeNet-5)

Focus on critically endangered North Atlantic right whales, Eubalaena glacialis

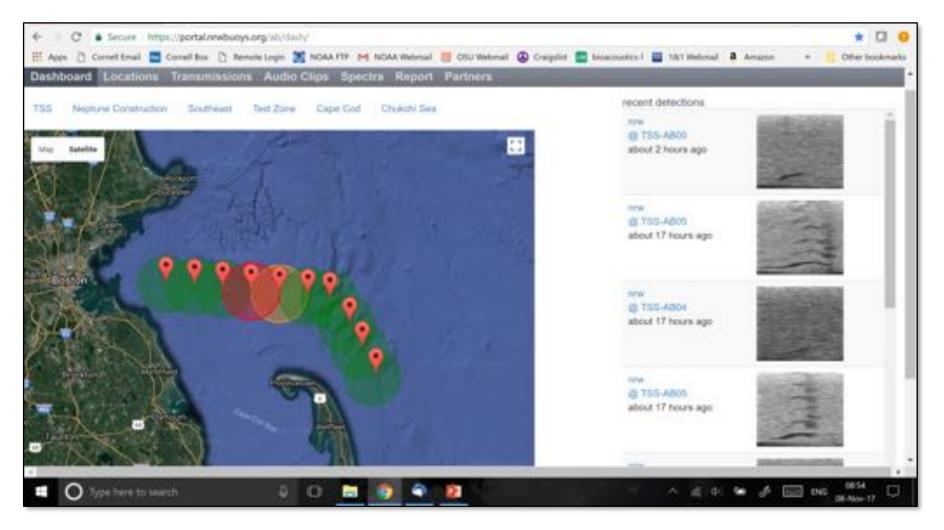


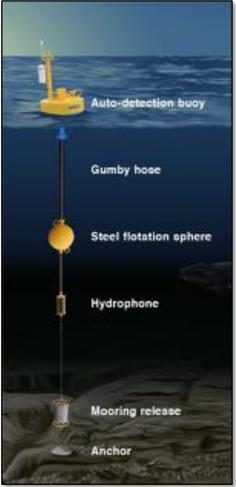
Illustration Source: The Atlantic, July 30, 2018



# $WhaleNET \ {\it (listen for whales.org)}$



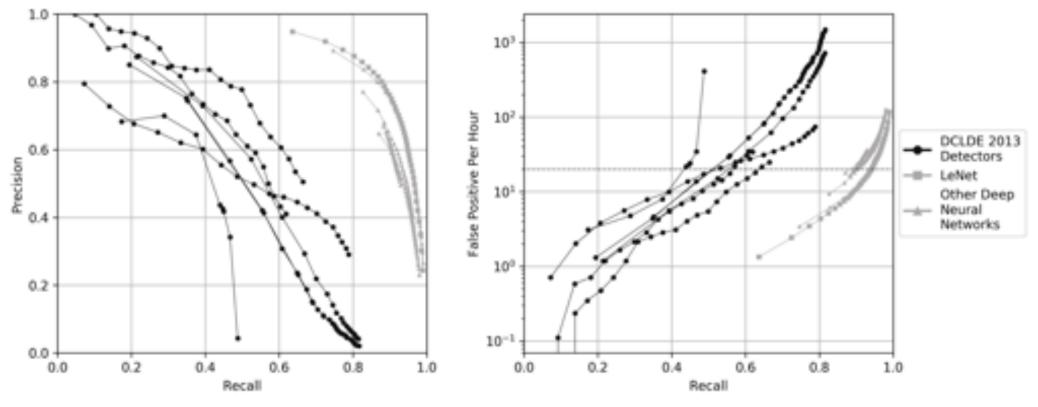




#### WhaleNET

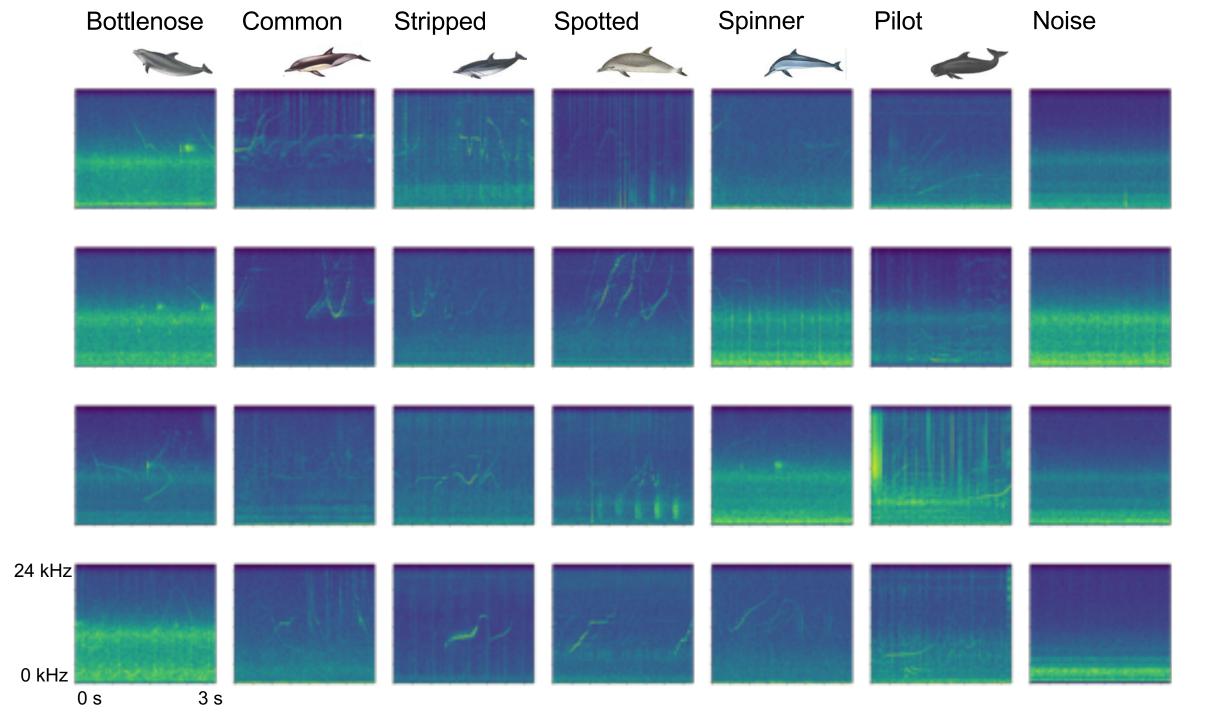




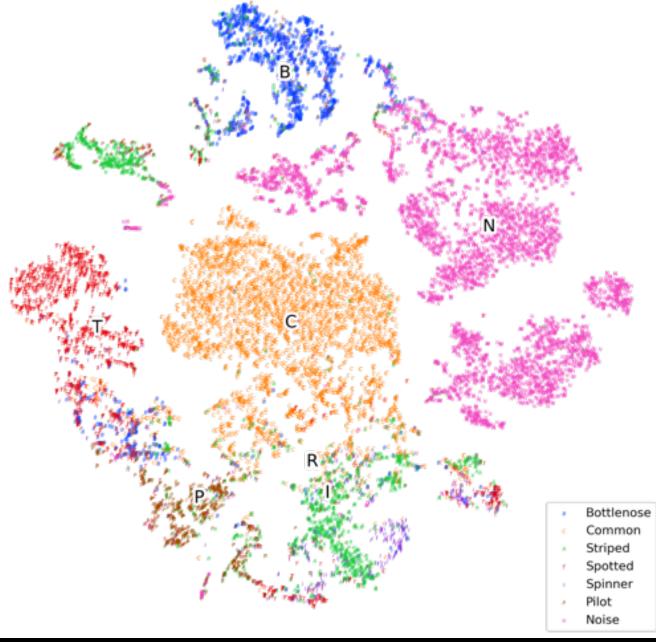


Shiu, Y. et al. (2020): Deep neural networks for automated detection of marine mammal species. Scientific Reports, https://doi.org/10.1038/s41598-020-57549-y





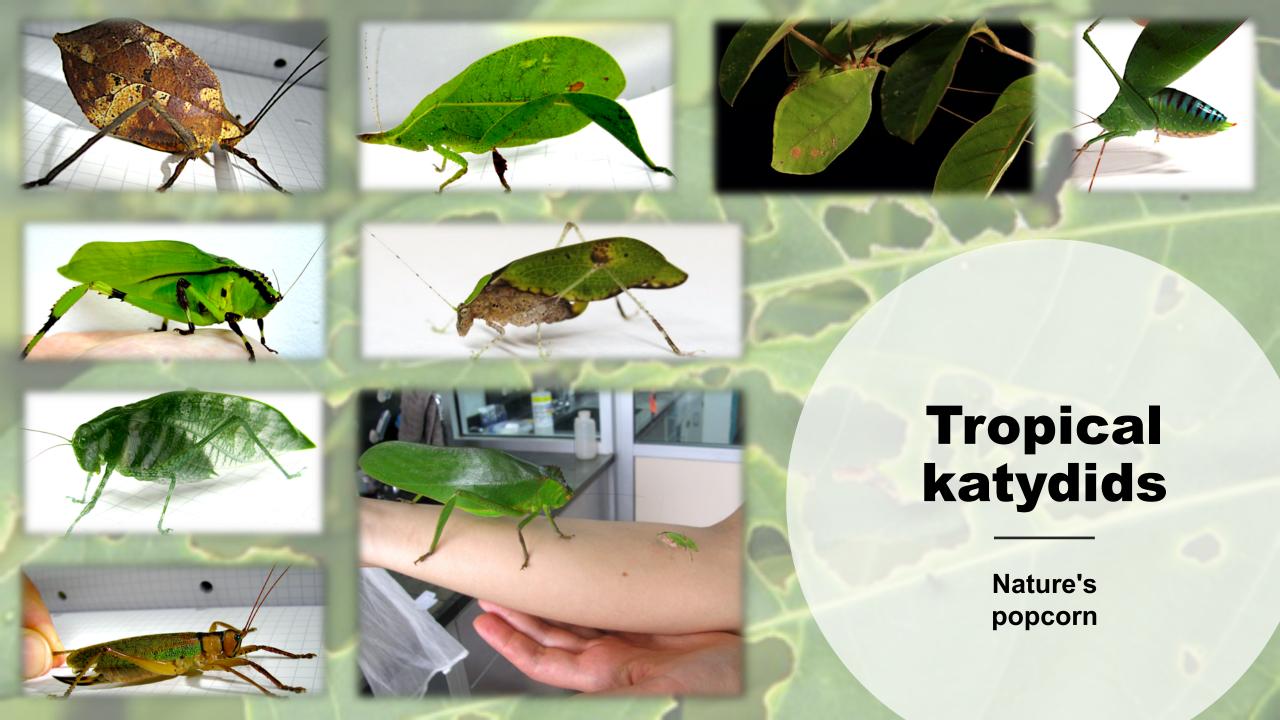
# Audio Embedding Using Triplet Loss



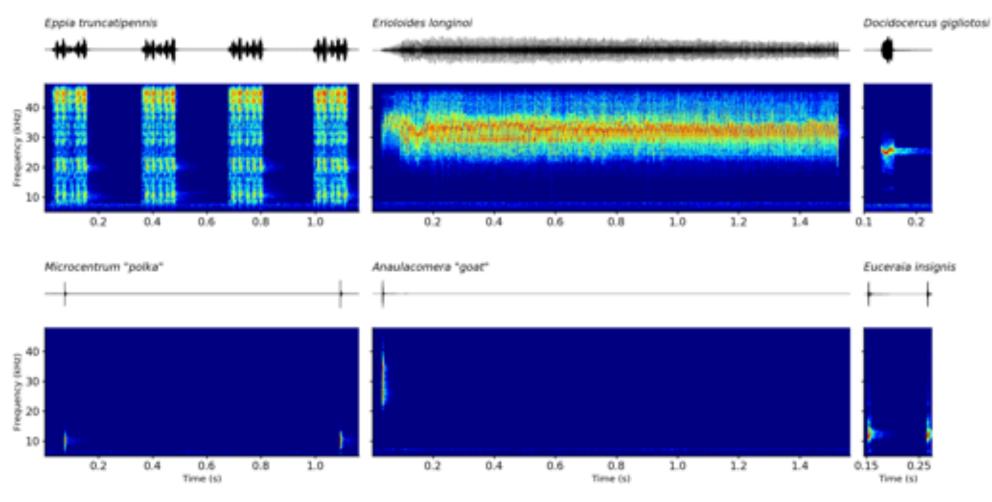








# Katydid sounds



Hofstede HM, Symes LB, ... Madhusudhana S., ... (2020): Calling songs of katydids (Orthoptera, Tettigoniidae) from Panama. Journal of Orthoptera Research (in press)

# KatydID

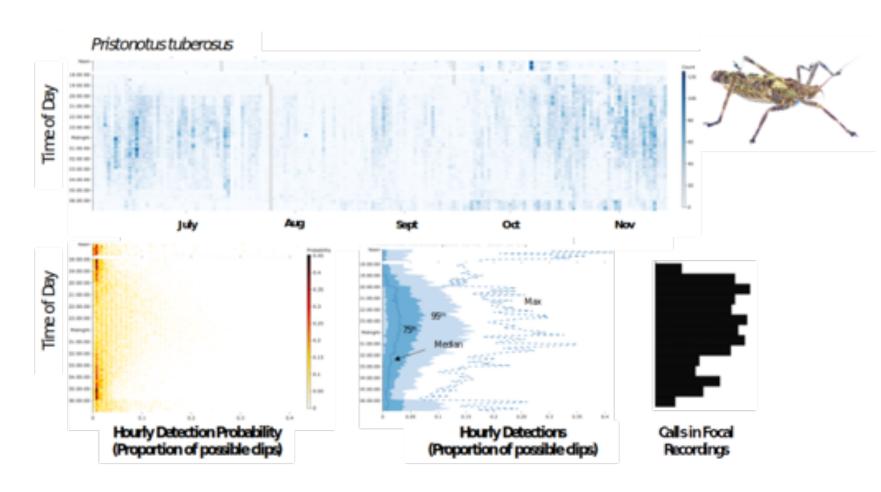




#### Challenges



- Domain mismatch
- Data non-abundance



Madhusudhana, S. et al. (2020): A deep convolutional neural network-based classifier for passive acoustic monitoring of neotropical katydids. The Journal of the Acoustical Society of America, https://doi.org/10.1121/1.5137323

# Conservation Applications

 Long-term monitoring & Seasonal phenology

Especially important given documented changes in the duration and intensity of tropical wet and dry seasons.

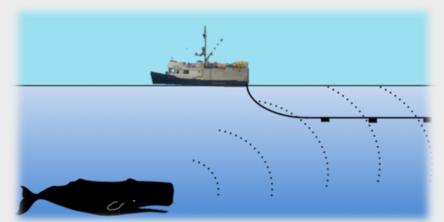
Agricultural management





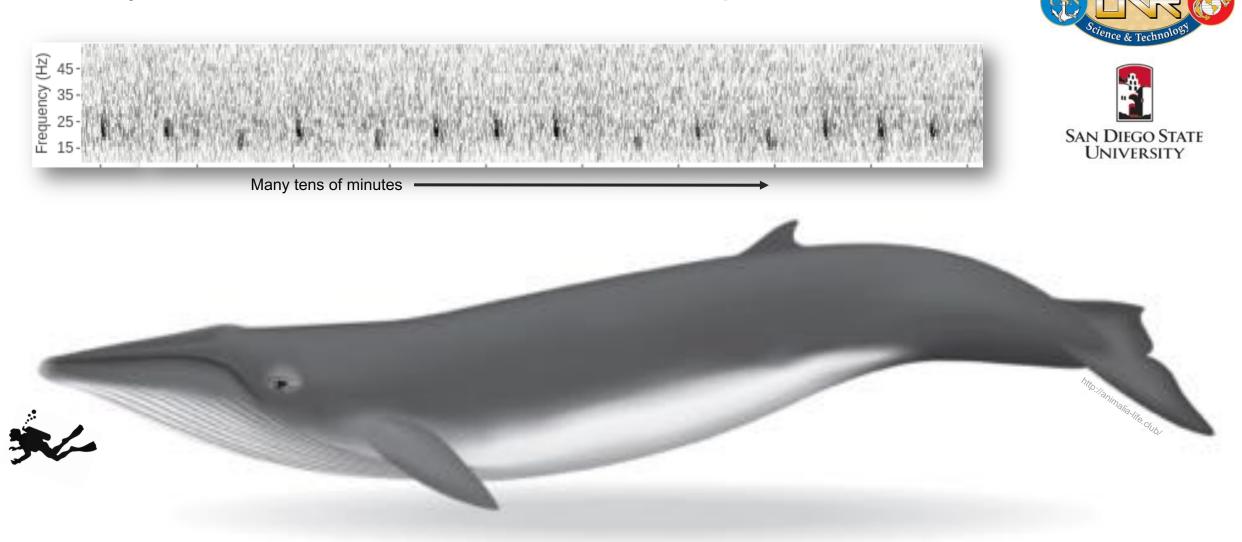
# Utilize context

within the recognition system

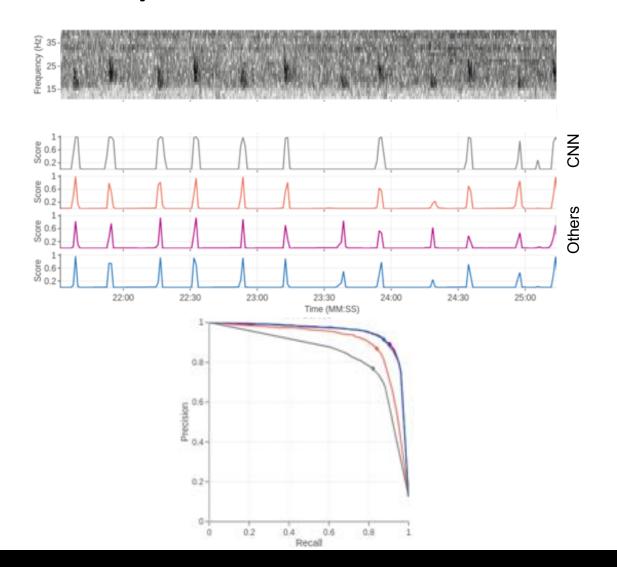




## Temporal context within songs



#### Temporal context within songs



#### **Benefits**

- Improved recognition
- Possible source separation
- Better density estimation
- Transferable





### Next steps!

- Convert detections to conservation actions!
- Need for cross-pollination: Why reinvent the wheel, over and over again?
- Reuse & recycle
  - knowledge
  - experience
  - resources
- Collaborate!

