

# Wildlife Census via LSH-based animal tracking

APOORV PATWARDHAN

# National Parks and wildlife conservation



Jim Corbett National  
Park, India



And many more ...



# The Challenge

- ▶ Surveillance around the sanctuary
- ▶ Tracking animals and their lifestyle
- ▶ Finding the habitat of animals, especially rare species
- ▶ Carrying out animal census – eg: number of tigers in the sanctuary?

# Current techniques

- ▶ Video surveillance through cameras at specific locations around the sanctuary territory.
- ▶ Manual surveillance
  - Tedious to manually process large amounts of video data collected through various sources and answer questions.

# From Data to Solutions ...

- ▶ Video Processing for foreground/background estimation
  - Additive Matrix Factorization

Hybridized with

- ▶ Image Processing for Object recognition
  - LSH based object recognition

# Additive Matrix Factorization

Decompose matrix  $\mathbf{Z}$  such that,

$$\mathbf{Z} = \mathbf{L} + \mathbf{S}$$

Where  $\mathbf{L}$  is a low-rank matrix and  $\mathbf{S}$  is sparse

- ▶ Used extensively in foreground/background separation for videos
- ▶ Can be solved efficiently by Convex Optimization techniques

$\mathbf{Z}_i \rightarrow$



$\mathbf{L}_i \rightarrow$



$\mathbf{S}_i \rightarrow$



# LSH-based object recognition

Decompose matrix  $\mathbf{Z}$  such that,

$$\mathbf{Z} = \mathbf{L} + \mathbf{S}$$



- ▶ Process the sparse matrix  $\mathbf{S}$  to recognize the mobile object
- ▶ Relevant work in Liu, Wei, et al. "Supervised hashing with kernels." *Computer Vision and Pattern Recognition (CVPR), 2012 IEEE Conference on*. IEEE, 2012.

$\mathbf{Z}_i \rightarrow$



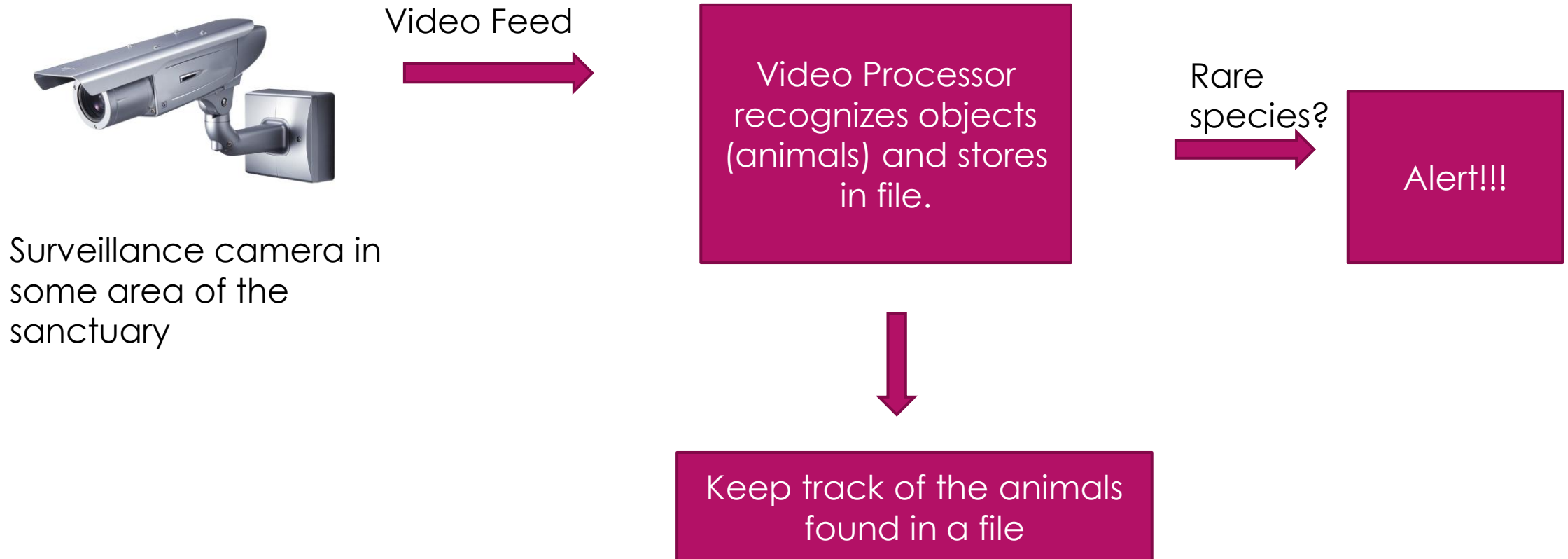
$\mathbf{L}_i \rightarrow$



$\mathbf{S}_i \rightarrow$



# Pipeline



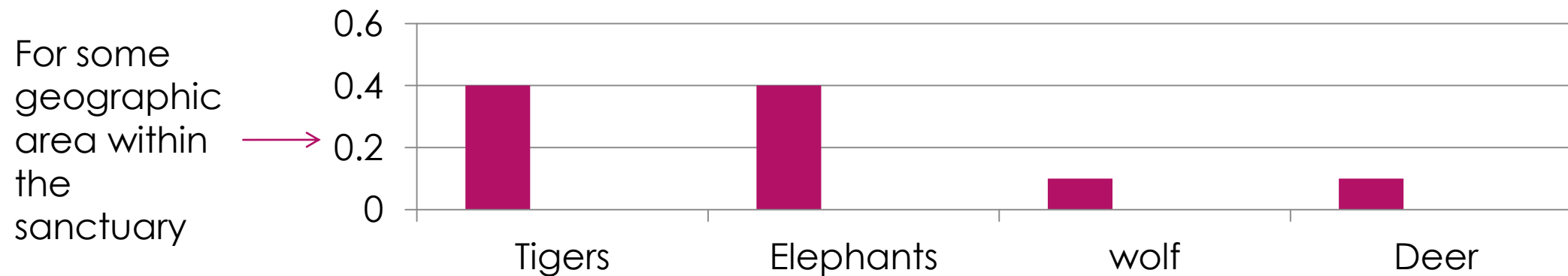


# Animal Census

- ▶ Certain animals are recognizable by certain features
  - For example, every tiger has a unique pattern of stripes on their body
  - Similarly for zebras
- ▶ Can train LSH for identifying different individuals within the same specie.
- ▶ This can lead to a more accurate estimate of the number of individuals within a specie than manual counting and saves time.

# And Topic Modeling ...

- ▶ Each file corresponds to a video.
- ▶ Can run topic modeling algorithms on the file corpus to organize the data.
- ▶ Topic modeling can help to analyze composition of species according to geographic area



# Tools and Evaluation

## Tools:

- 1) Lin, Zhouchen, Minming Chen, and Yi Ma. "The augmented lagrange multiplier method for exact recovery of corrupted low-rank matrices." arXiv preprint arXiv:1009.5055 (2010). [Matlab code]
- 2) Kulis, Brian, and Kristen Grauman. "Kernelized locality-sensitive hashing for scalable image search." Computer Vision, 2009 IEEE 12th International Conference on. IEEE, 2009. [Matlab code]

## Evaluation:

### Motion-based Segmentation and Recognition Dataset

- Brostow, Gabriel J., et al. "Segmentation and recognition using structure from motion point clouds." *Computer Vision–ECCV 2008*. Springer Berlin Heidelberg, 2008. 44-57.
- Brostow, Gabriel J., Julien Fauqueur, and Roberto Cipolla. "Semantic object classes in video: A high-definition ground truth database." *Pattern Recognition Letters* 30.2 (2009): 88-97.

# References

- ▶ <http://www.mapsofindia.com/maps/uttaranchal/jim-corbett-national-park.html>
- ▶ <http://www.mouthshut.com/product-reviews/Jim-Corbett-National-Park-reviews-925003708>
- ▶ <http://www.radiomastfm.com/amboseli-national-park-kenya-4955>
- ▶ <https://www.safaribookings.com/tours/t1407>
- ▶ Surveillance camera: <http://ipcameraguide.com/2016/04/protecting-yourself-using-home-surveillance-cameras/>
- ▶ He, Jun, Laura Balzano, and John Lui. "Online robust subspace tracking from partial information." *arXiv preprint arXiv:1109.3827* (2011).