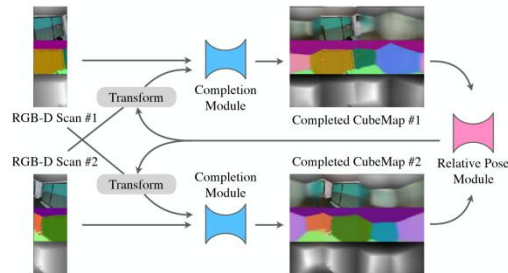
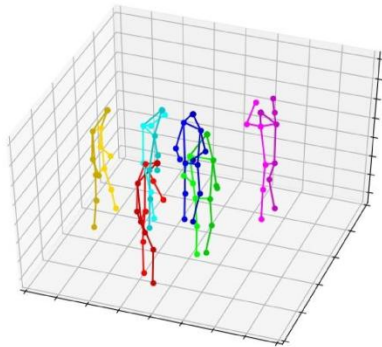
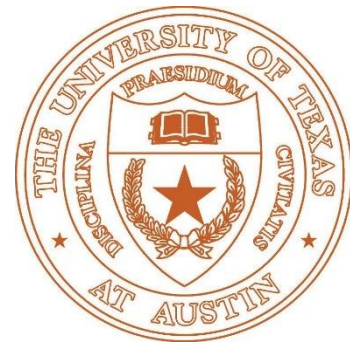
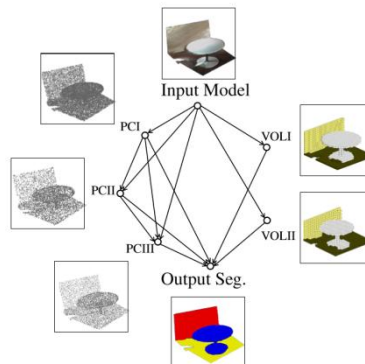


# CS376 Computer Vision

## Lecture 18: Introduction to Visual Recognition



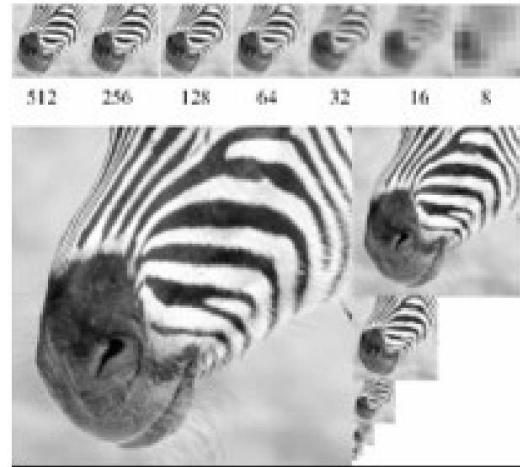
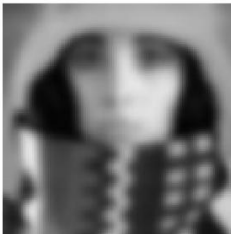
Qixing Huang  
April 3<sup>th</sup> 2019



# Topics covered/to be covered

- Features & filters
- Grouping & fitting
- Multiple views
- Recognition

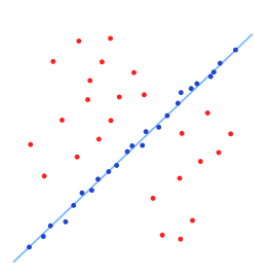
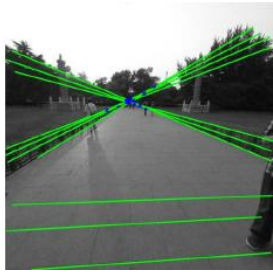
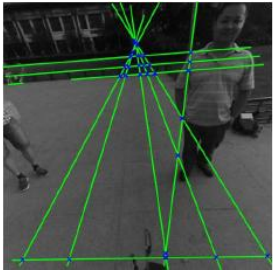
# Features and filters



Transforming and  
describing images;  
Textures, colors, edges

Building blocks for  
neural networks

# Grouping & fitting



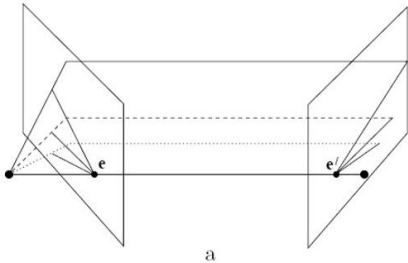
Shi et al.

Clustering, Segmentation, fitting; what parts belong together?



# Multiple Views

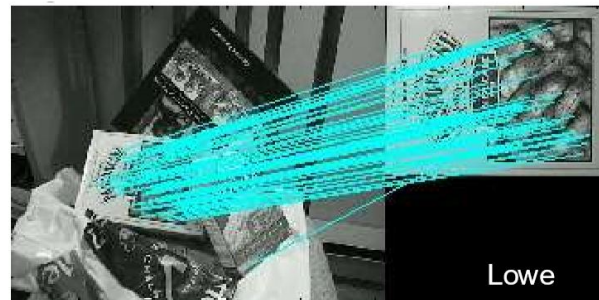
Invariant features, matching  
Epipolar geometry  
Structure-from-motion, stereo



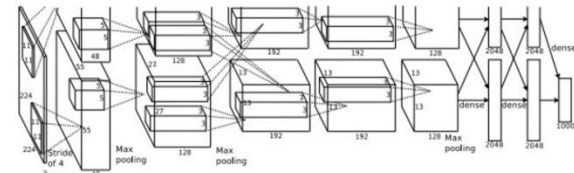
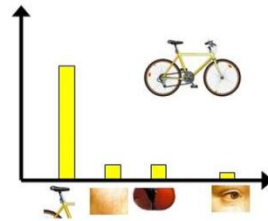
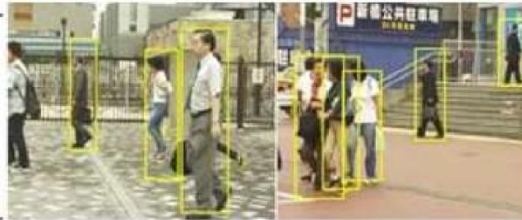
a



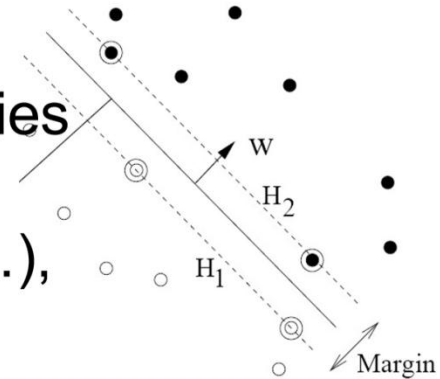
Hartley and Zisserman



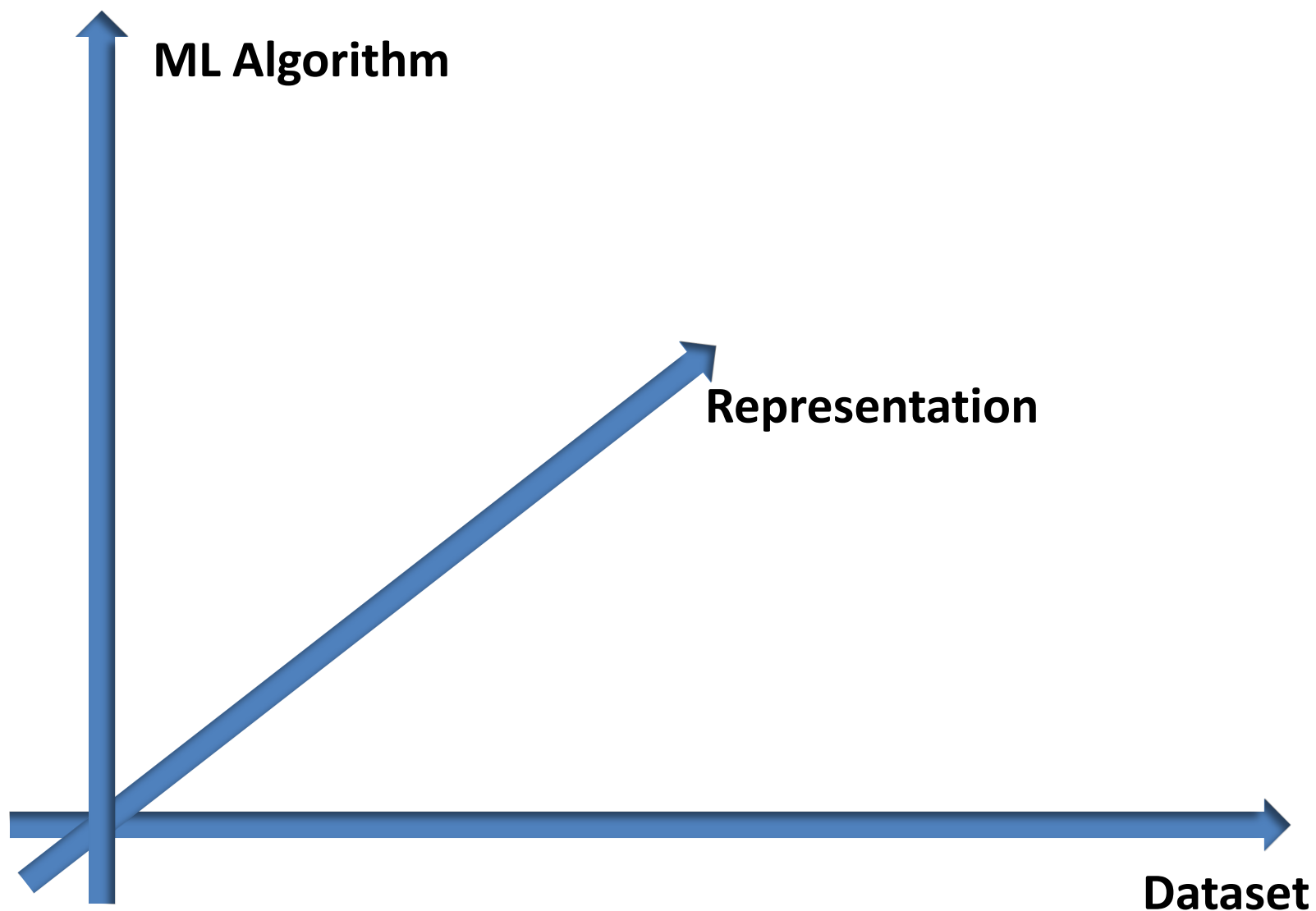
# Recognition and learning



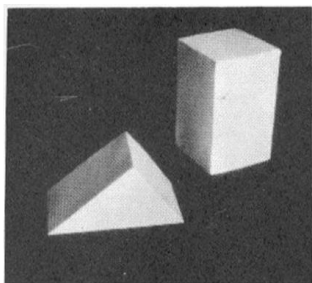
Recognizing categories  
(objects, scenes,  
activities, attributes...),  
learning techniques



Data representation (vectorized) -> machine learning techniques



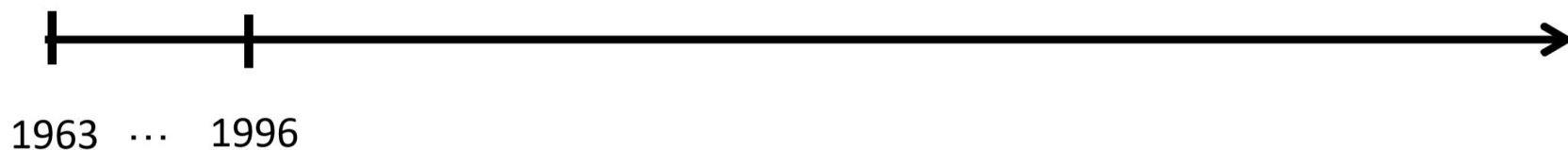
# Progress charted by datasets



**Roberts 1963**



**COIL**





# Progress charted by datasets



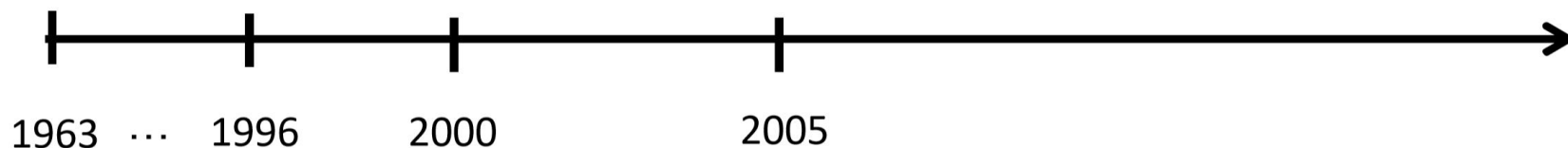
**MSRC 21 Objects**



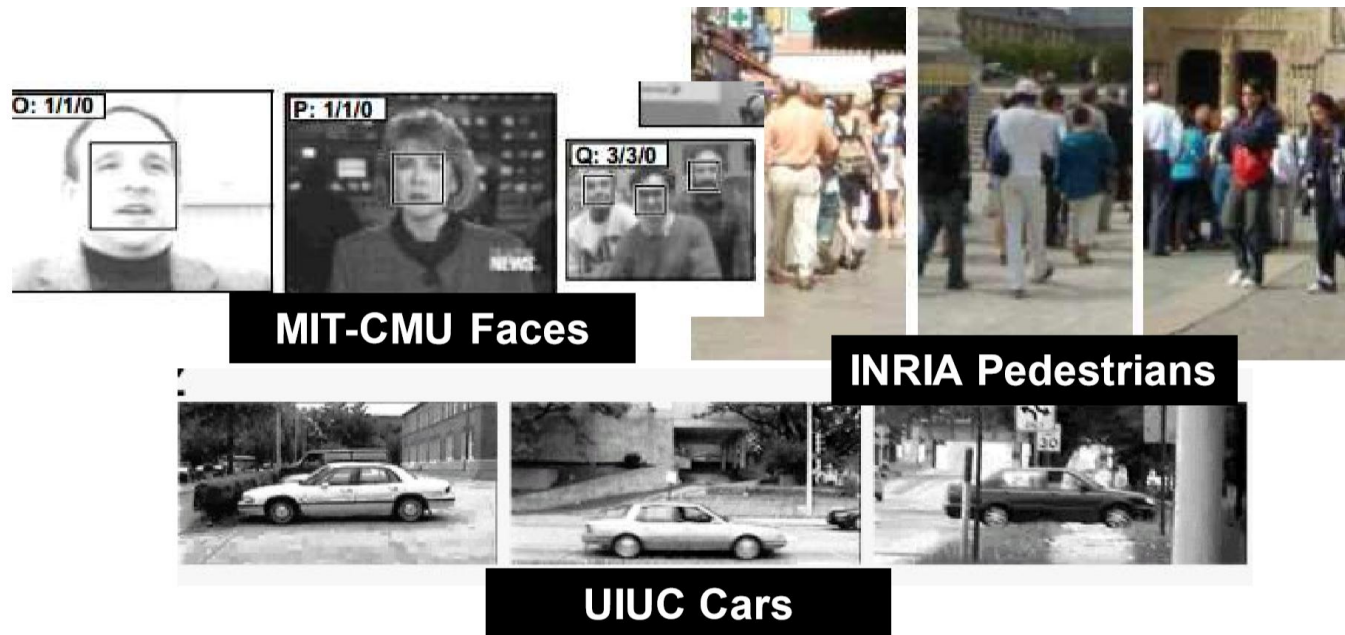
**Caltech-101**



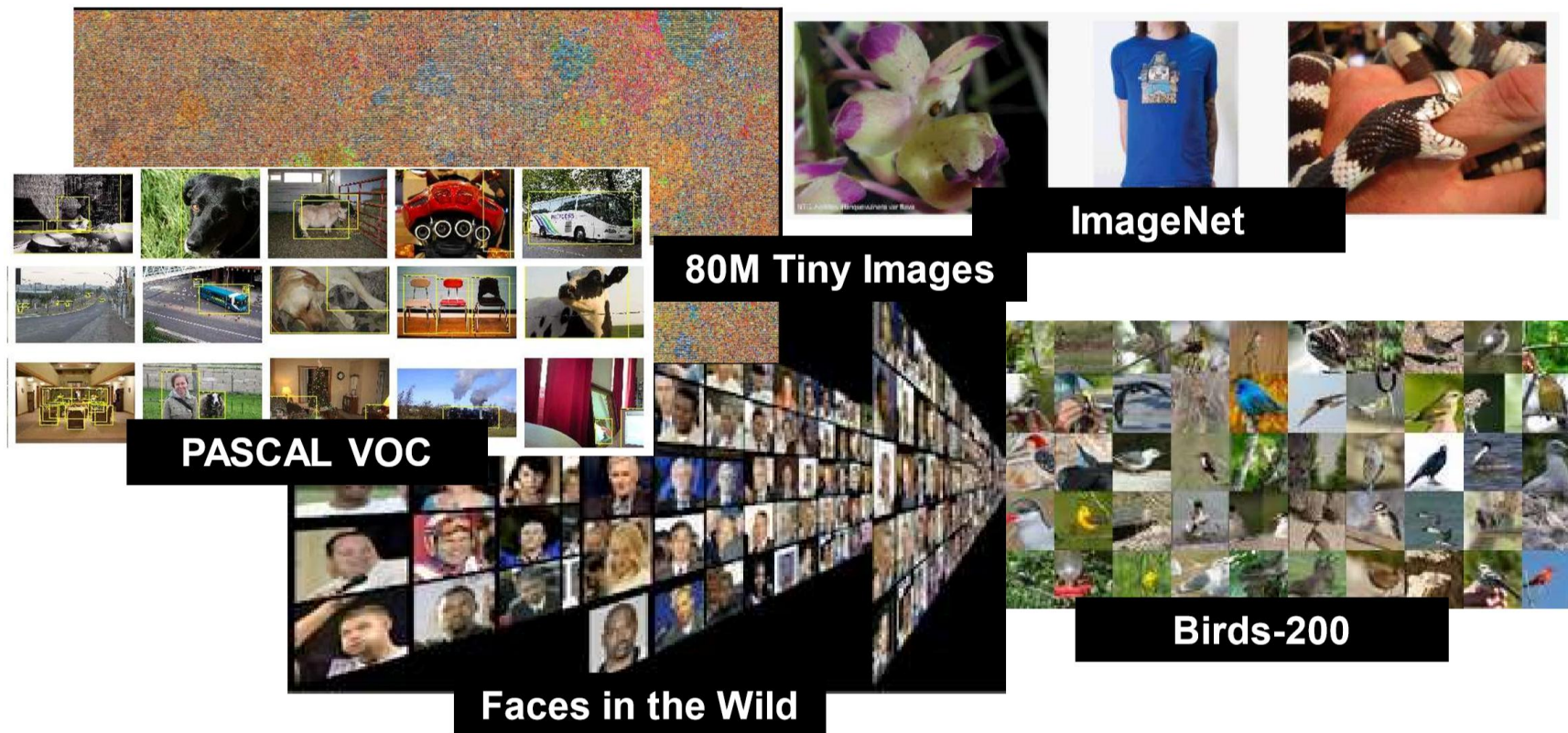
**Caltech-256**



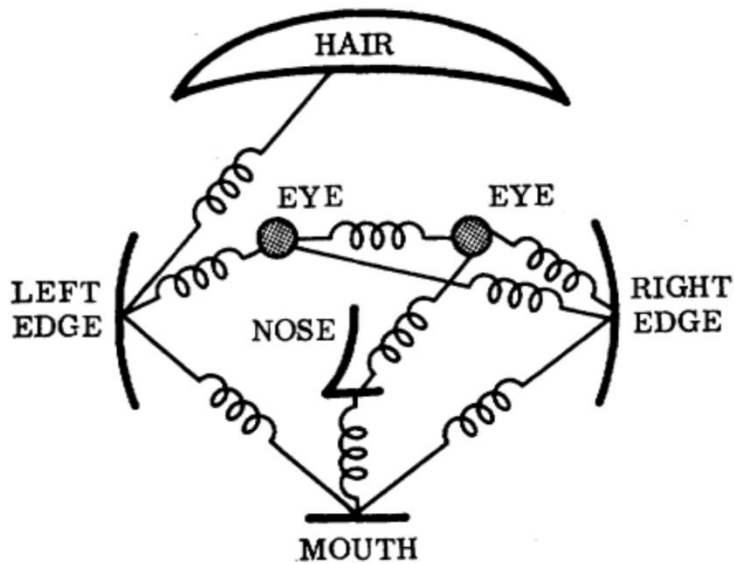
# Progress charted by datasets



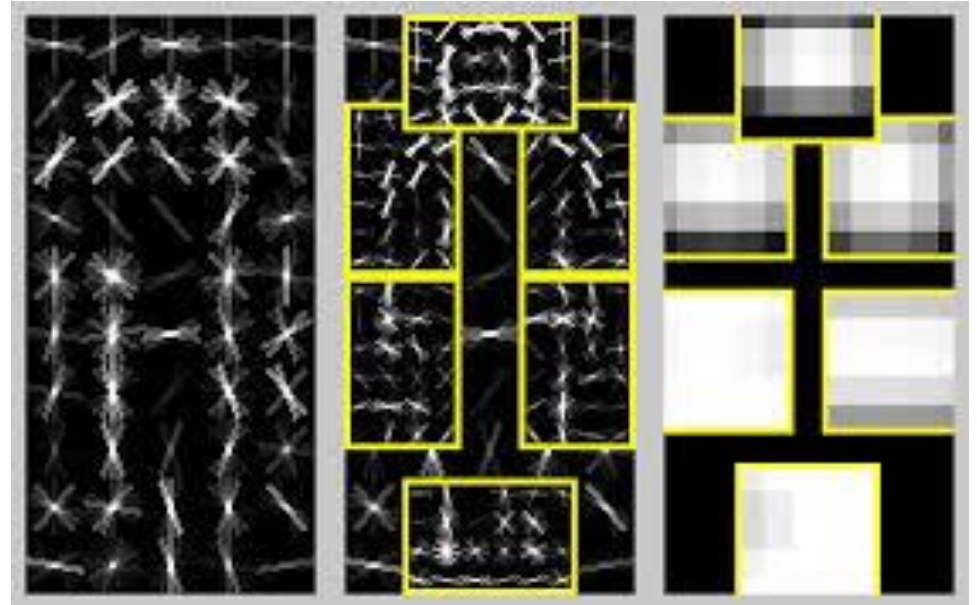
# Progress charted by datasets



# Data Representations



Pictorial Structures  
(Fischler et al. 73)

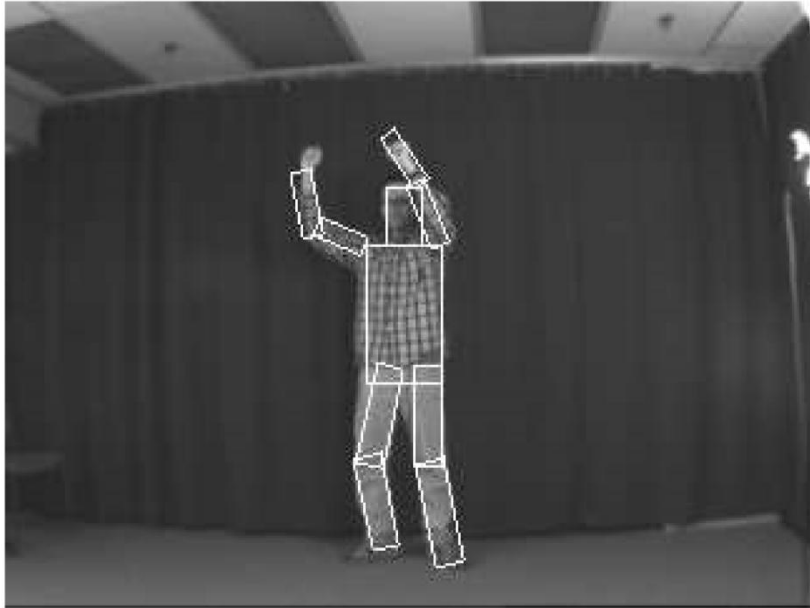


Deformable-Part-Model  
(Felzenszwalb et al. 10)

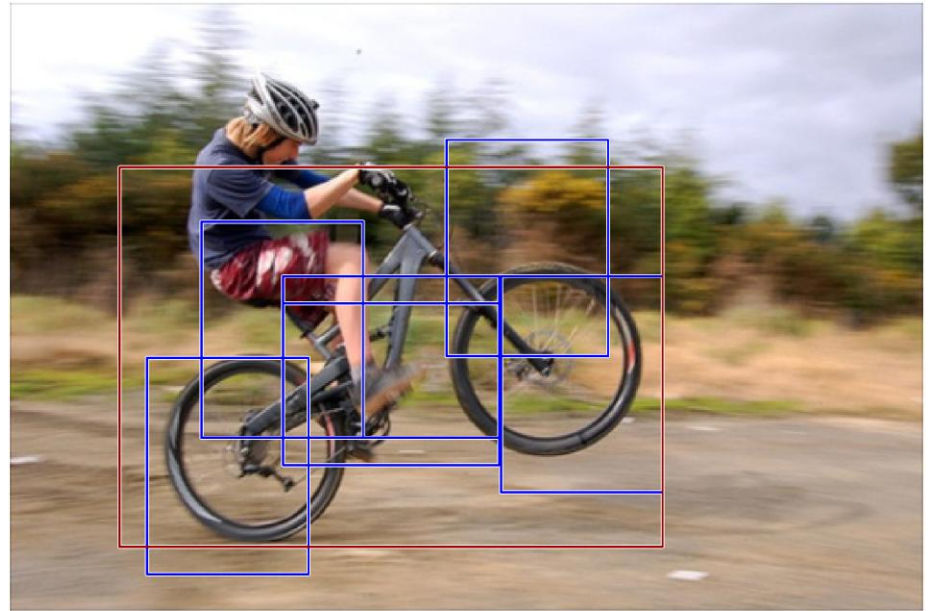
1973

2010

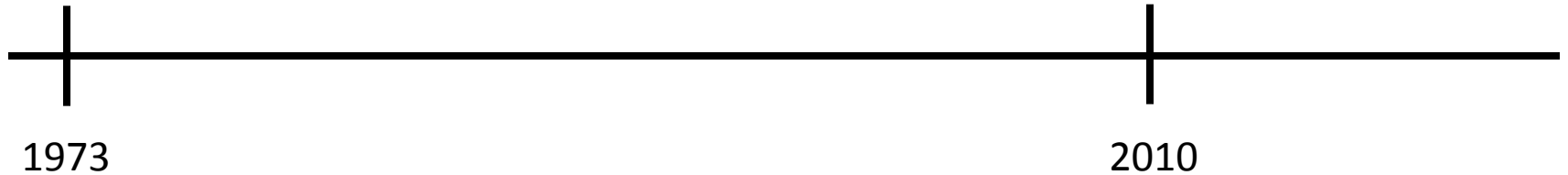


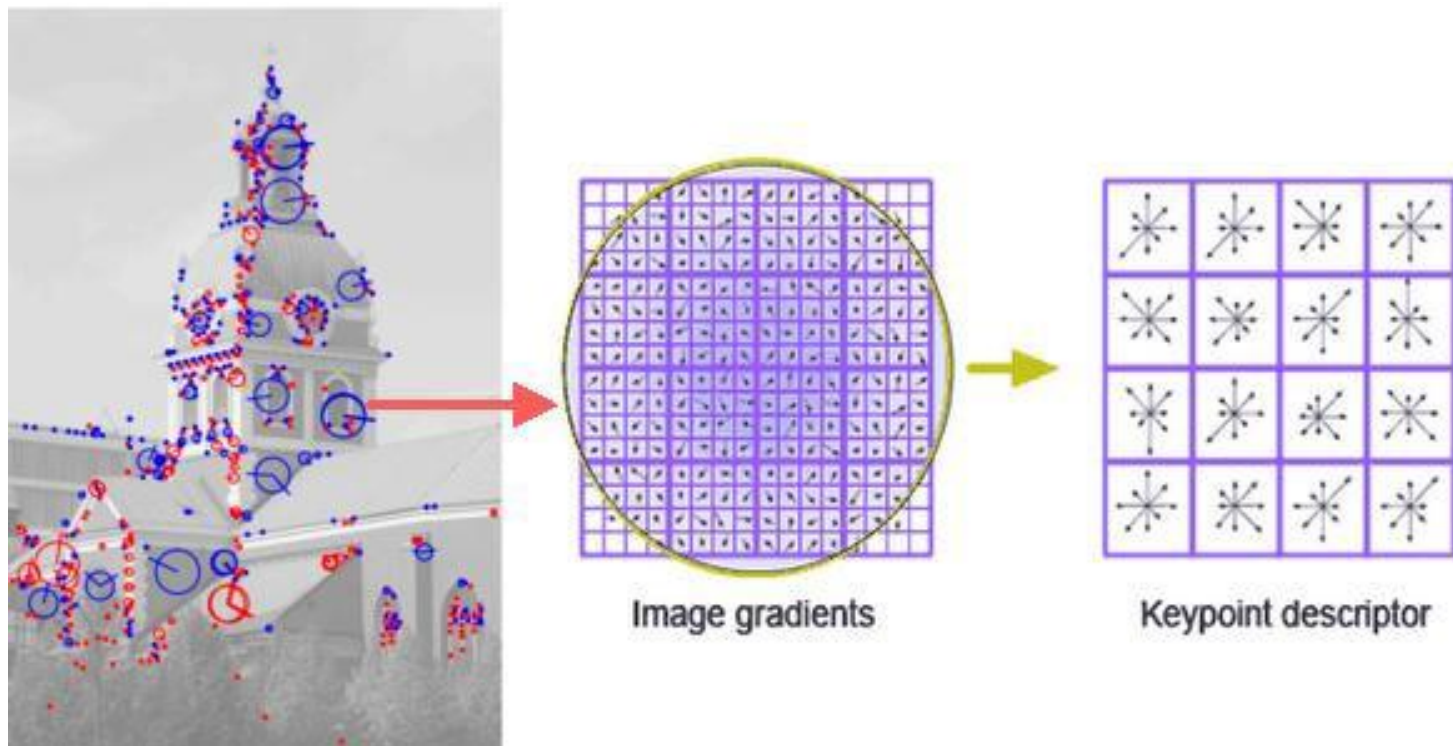


Pictorial Structures  
(Fischler et al. 73)

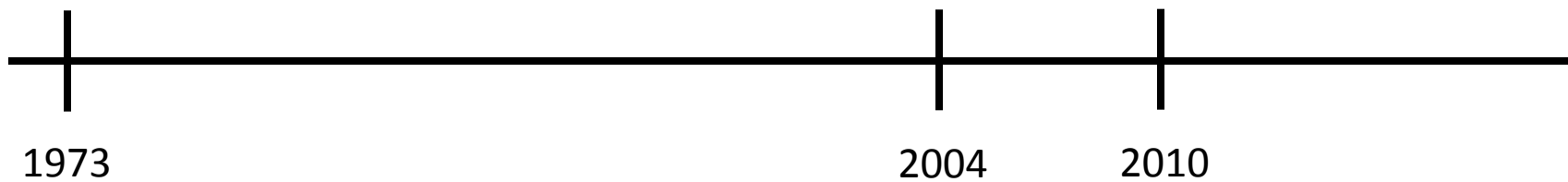


Deformable-Part-Model  
(Felzenszwalb et al. 10)

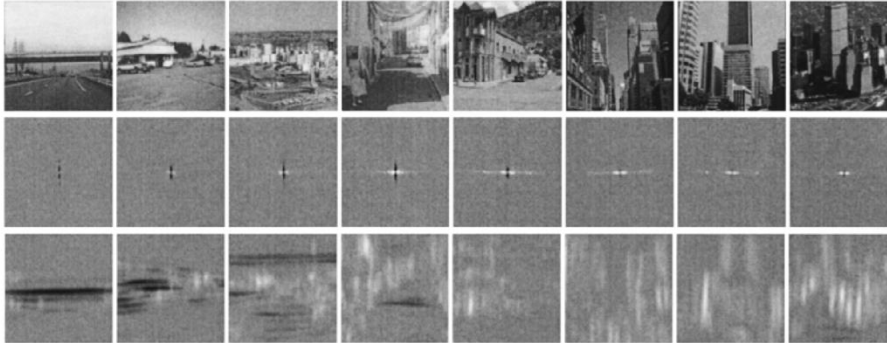




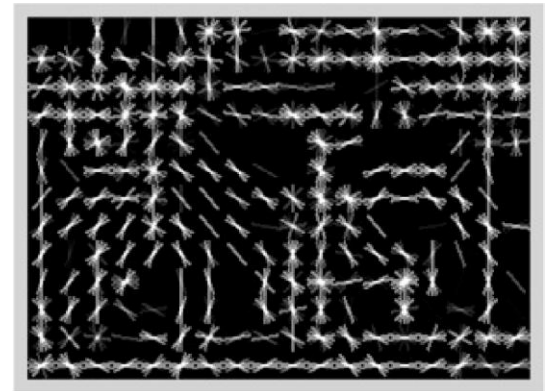
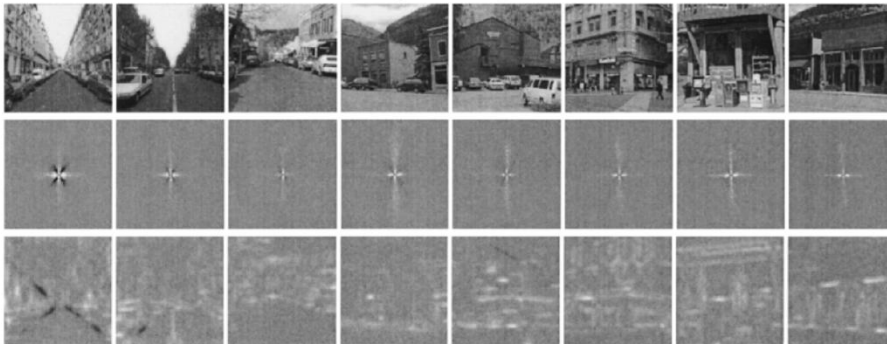
SIFT (Lowe 04)



a) Degree of Openness

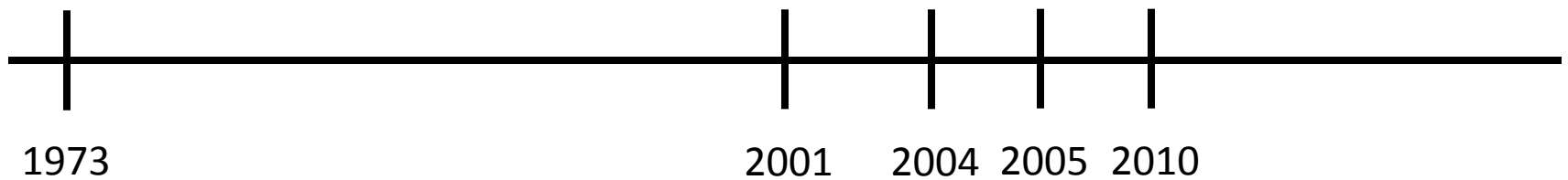


b) Degree of Expansion

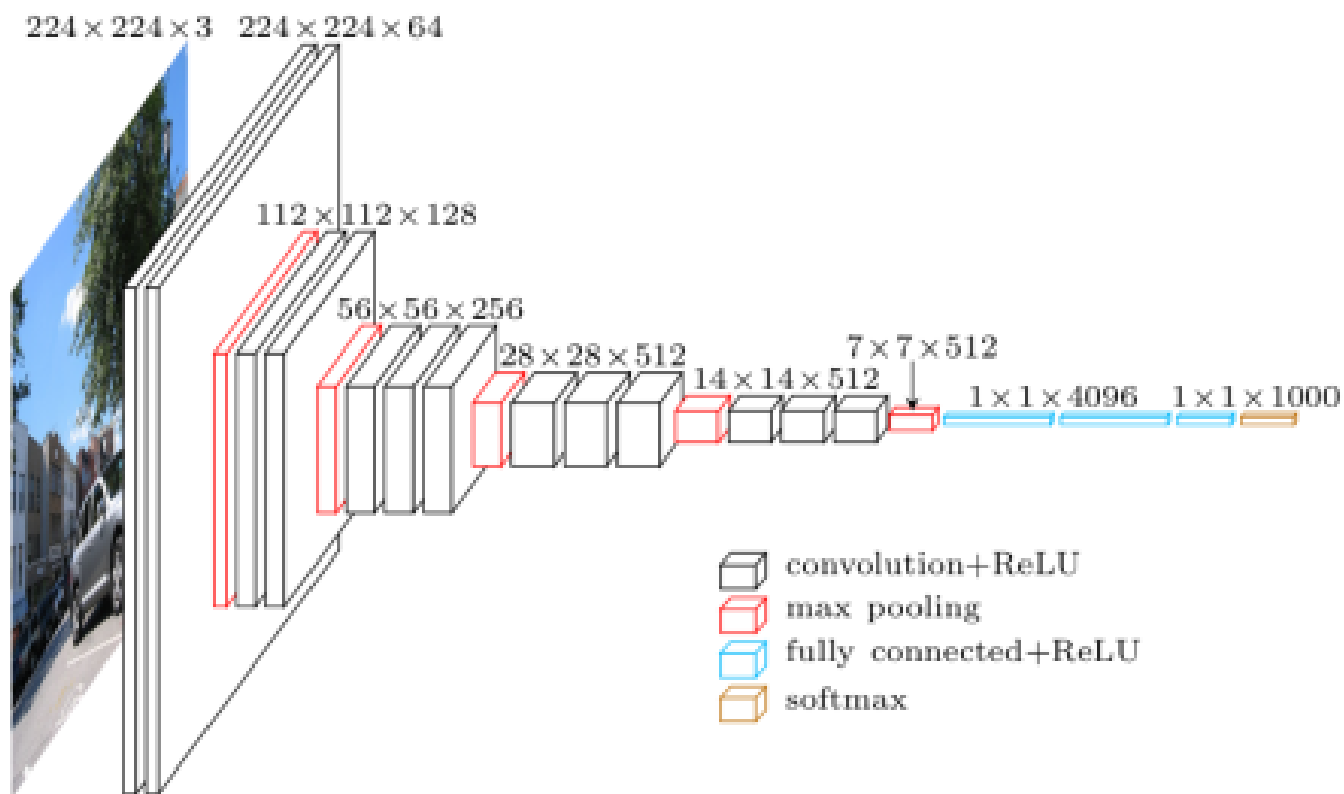


GIST (Oliva and Torralba 01)

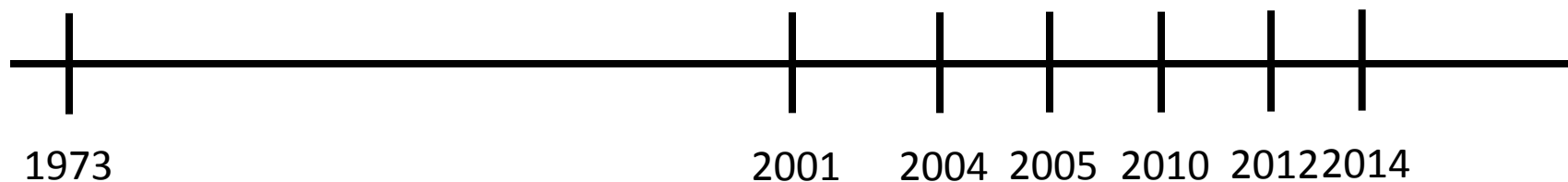
HOG (Dalal and Triggs 05)





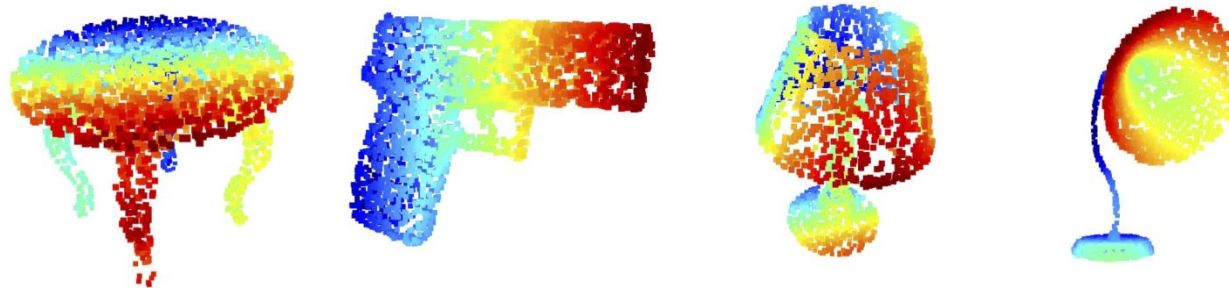


VGG19 (Simonyan and Zisserman 14)

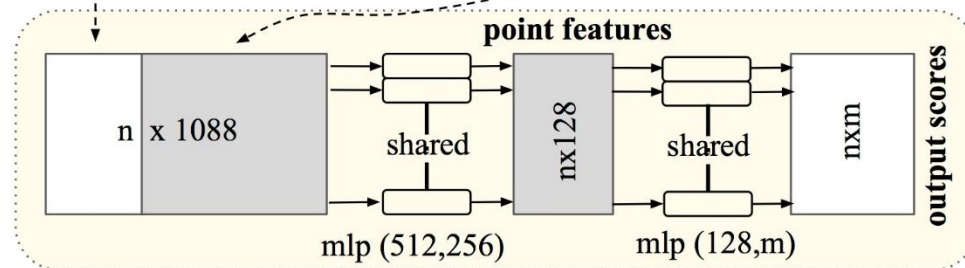
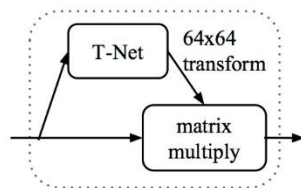
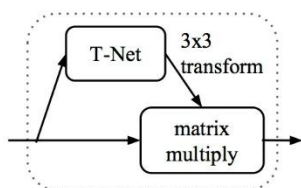
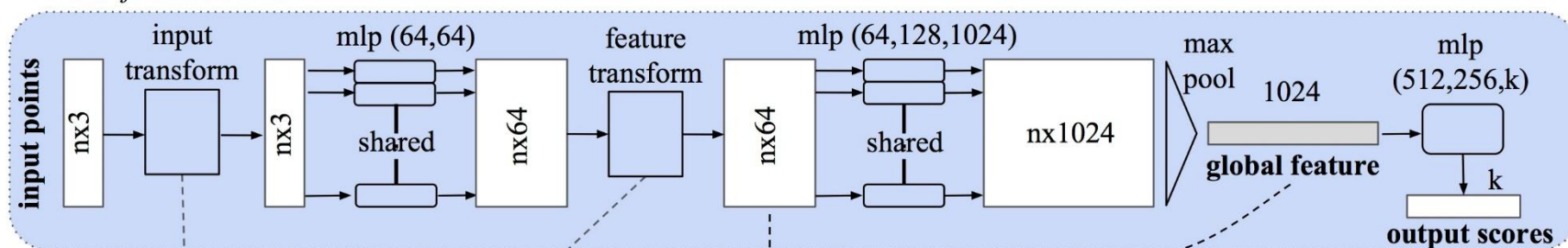






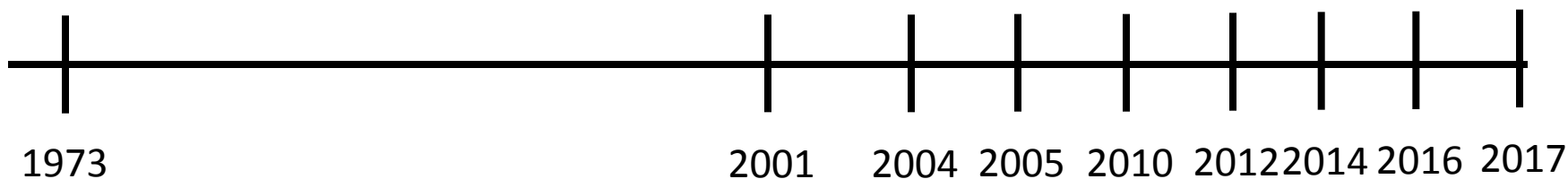


*Classification Network*

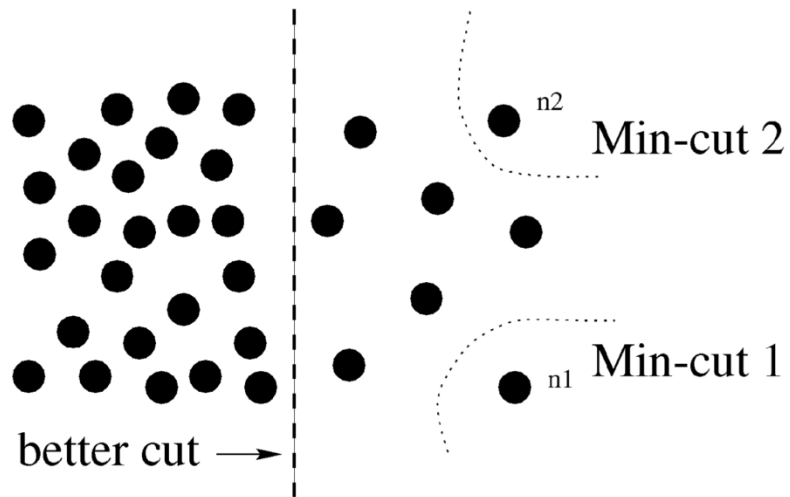


*Segmentation Network*

PointNet (R. Qi and Su et al. 17)



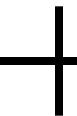
# Machine Learning Algorithms

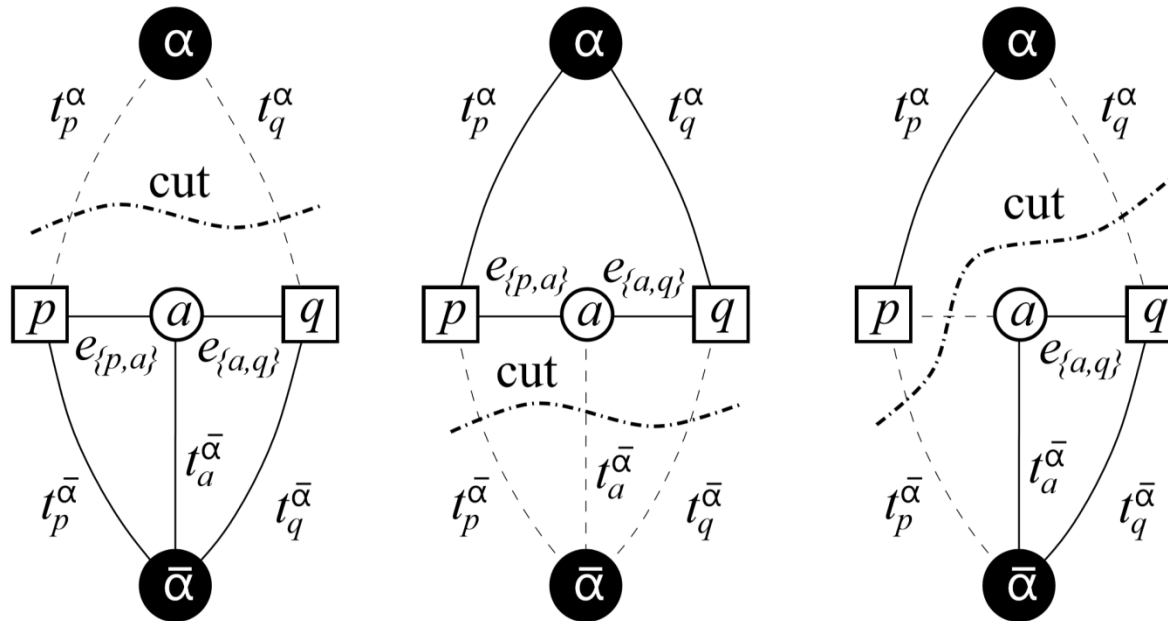


$$Ncut(A, B) = \frac{cut(A, B)}{assoc(A, V)} + \frac{cut(A, B)}{assoc(B, V)}$$



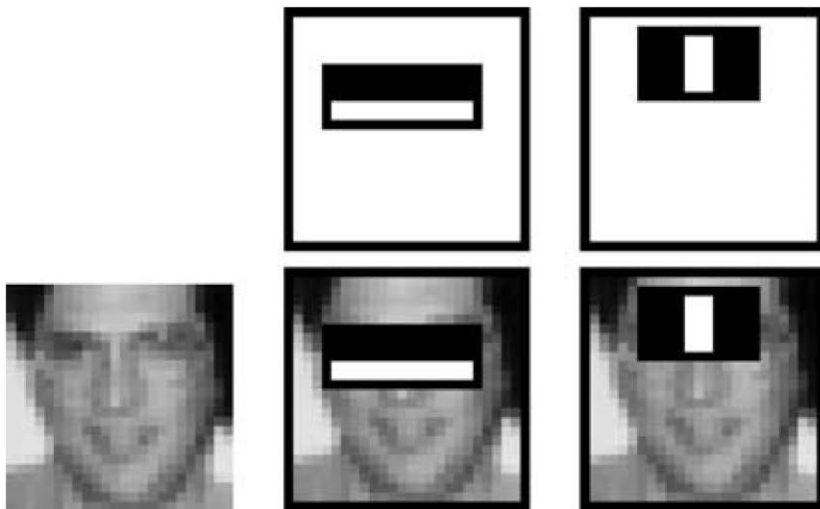
Normalized Cut (Shi and Malik 97)



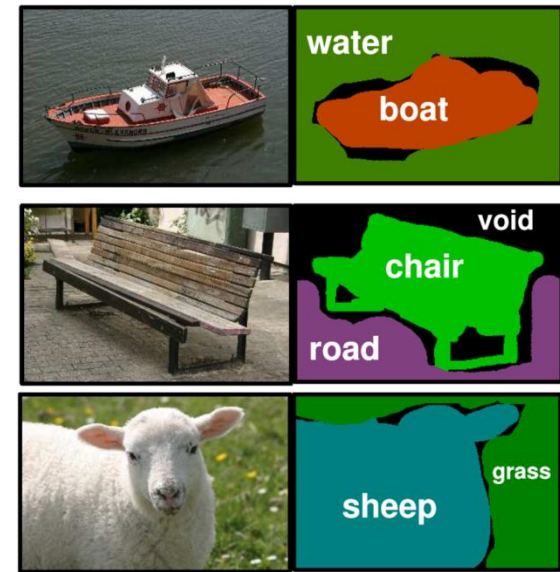


Graph Cut (Boykov et al. 99)

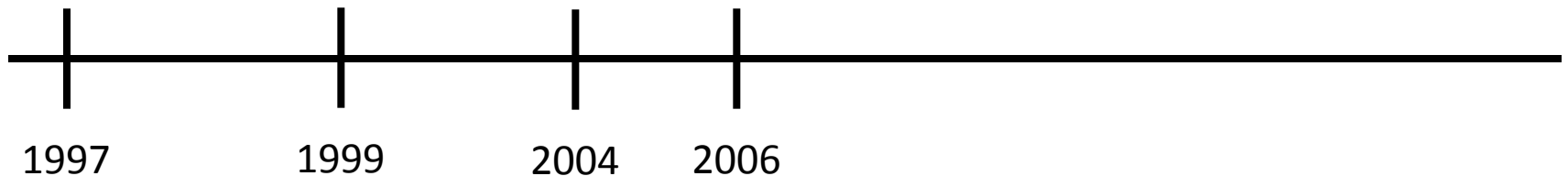


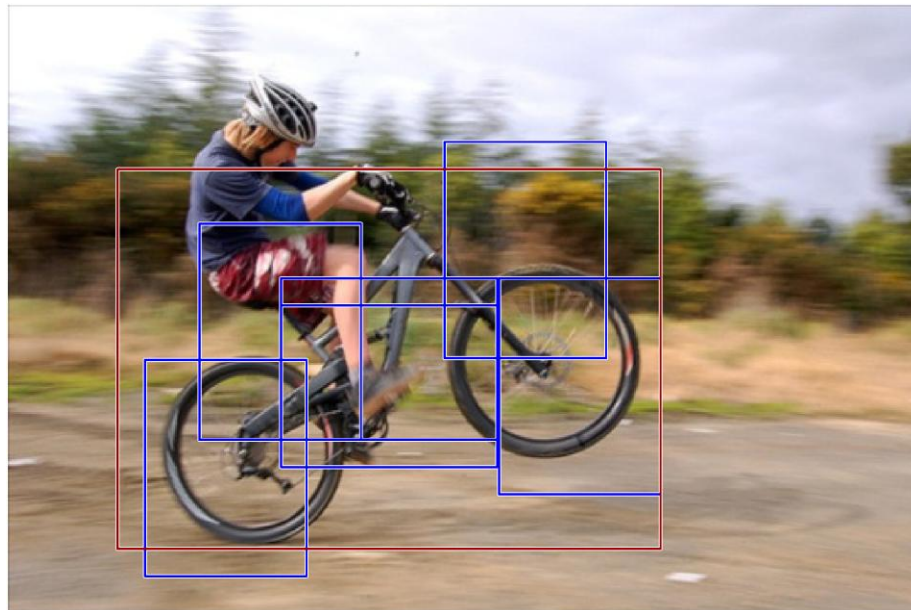
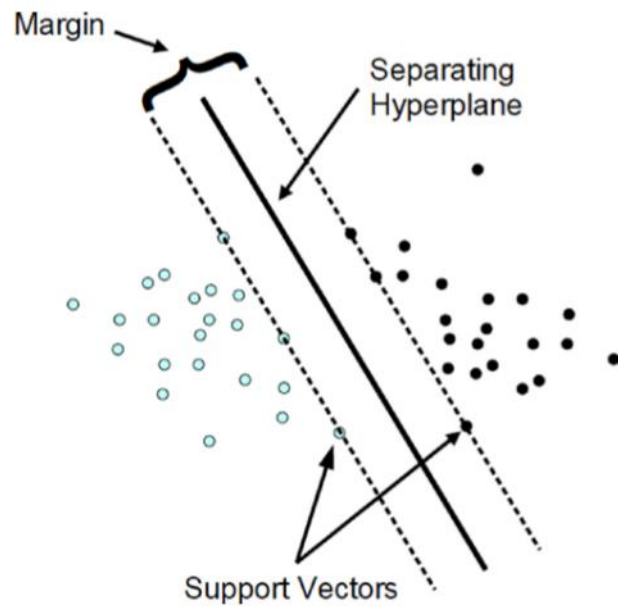


AdaBoosting for face detection  
(Viola and Jones 04)

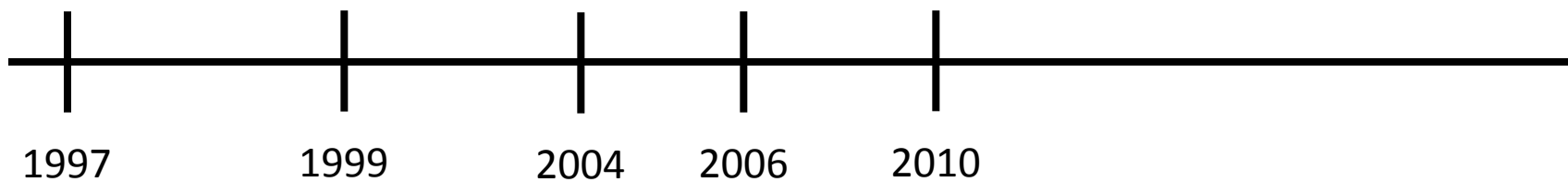


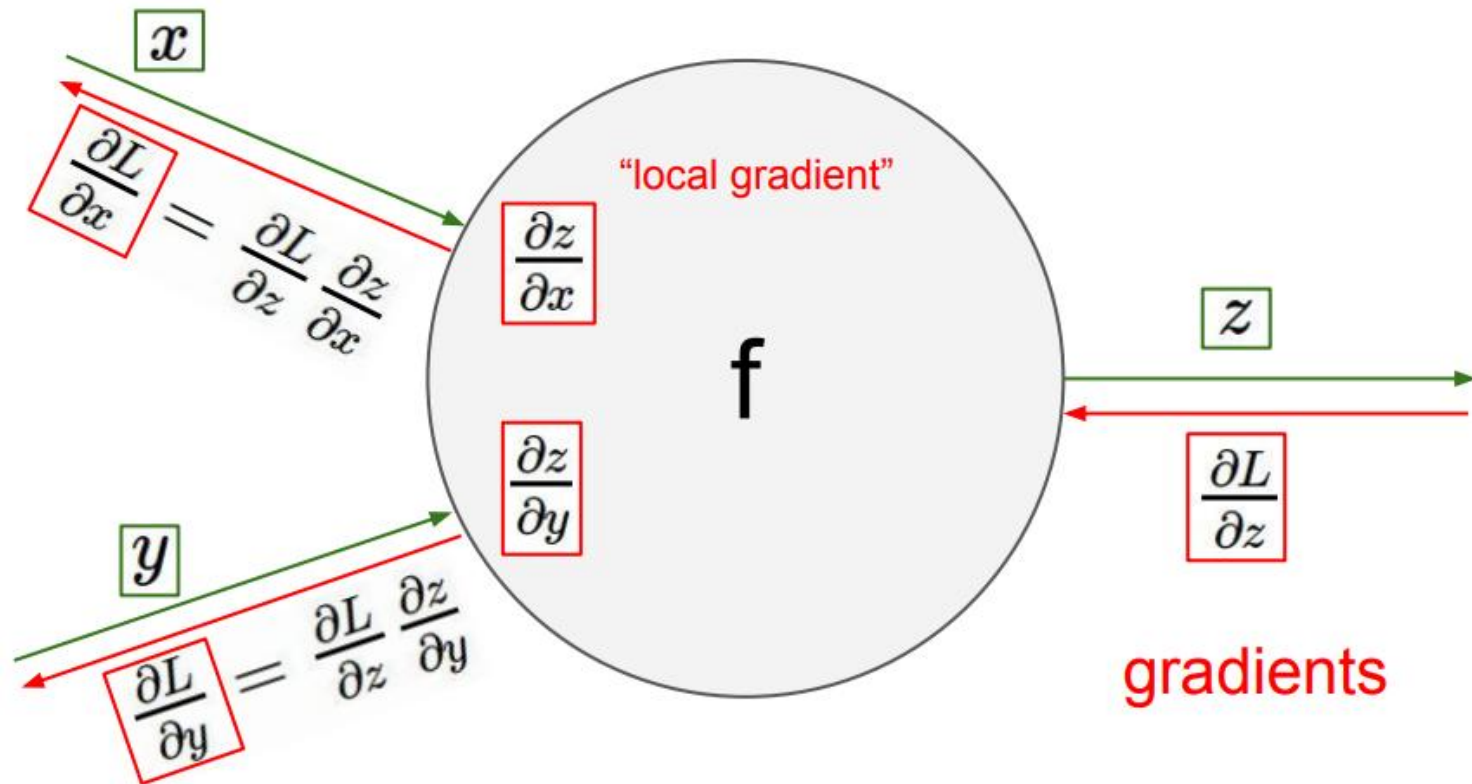
TextonBoost for segmentation  
(Shotton et al. 06)



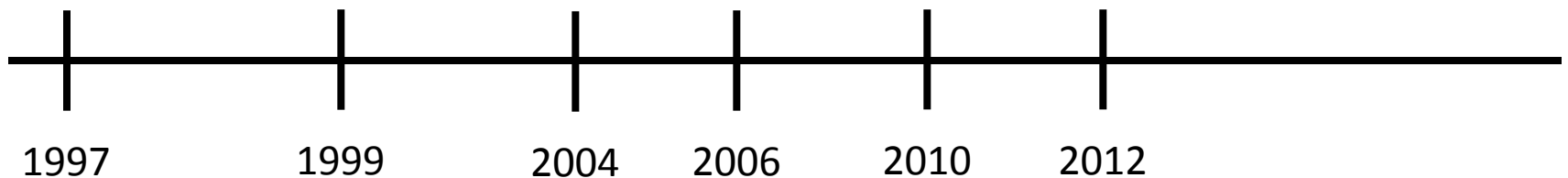


Support Vector Machine in Deformable Part Model  
(Felzenszwalb et al. 10)

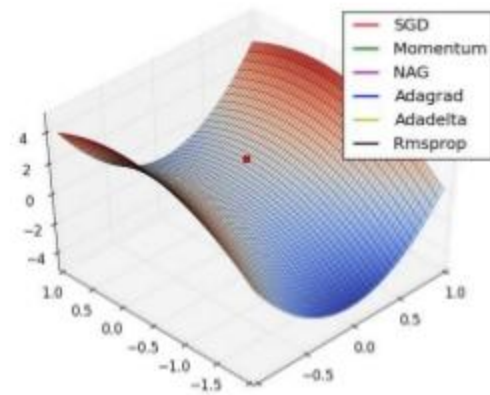
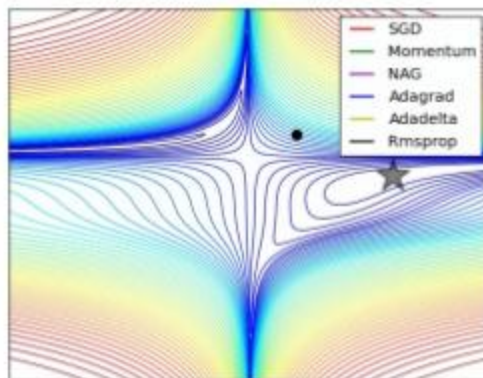




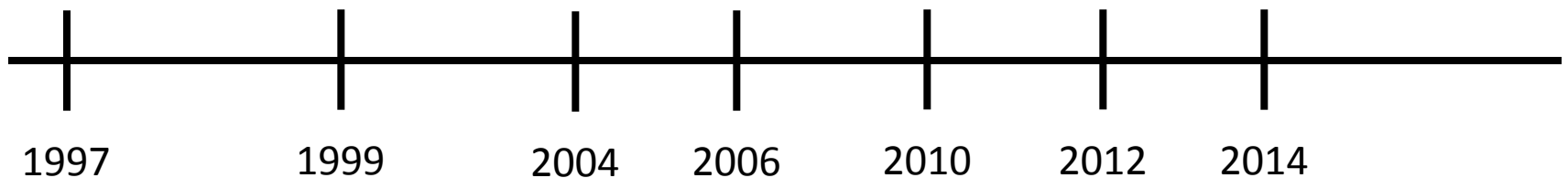
Back-propagation in neural network training/implementation  
(Rumelhart et al. 86, LeCun et al. 98, Abadi et al. 16)



## Optimization



Adam: A method for stochastic optimization  
(Kingma and Ba 14)



# Topics to be Covered

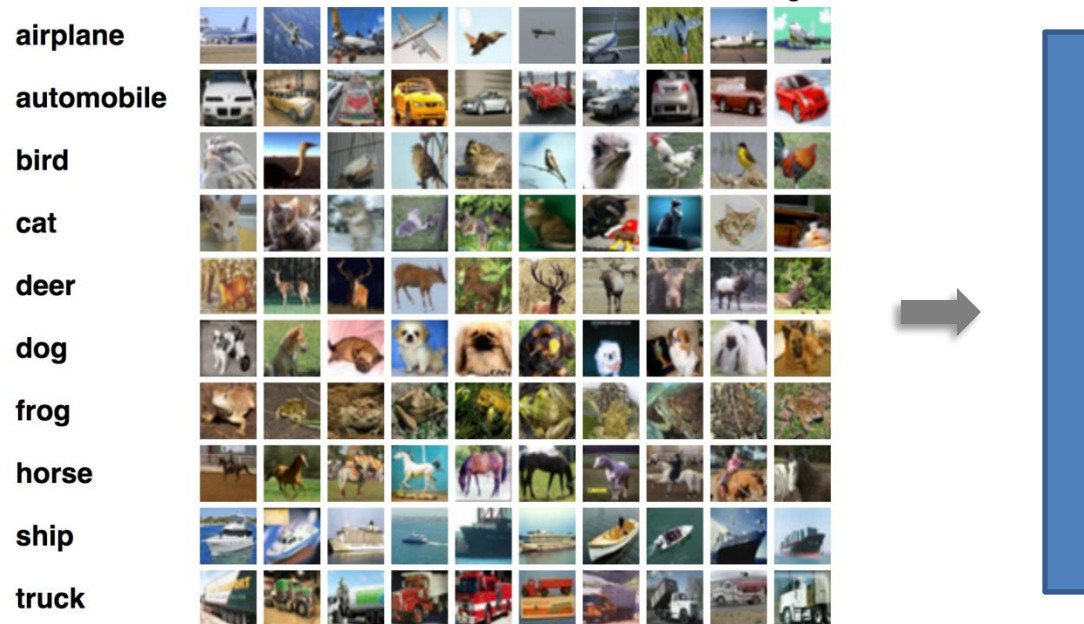


# Machine Learning Basics

- Unsupervised Learning
  - K-means
  - K-nearest
  - Graph cut (Mincut, Normalized Cut)
- Supervised Learning
  - SVM
  - Random forests
  - Boosting

# Machine Learning Basics

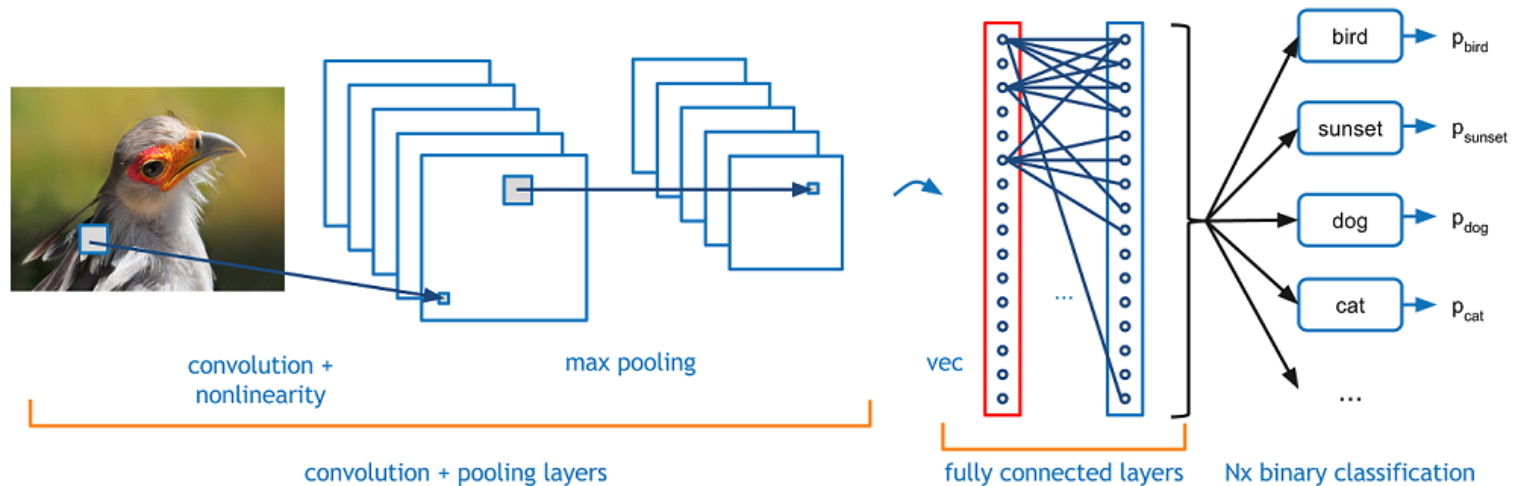
- Convert data in their vectorized forms



What we have learned in class?

# Deep Learning Basics

- Convolution layers/Fully connection layers/Max pooling/RELU
- Stochastic gradient descent/Dropout/ADAM



# Image Classification

- K-nearest neighbor classification
- SVM classification
- Boosting
- AlexNet

airplane



automobile



bird



cat



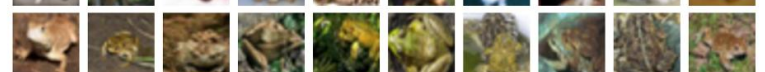
deer



dog



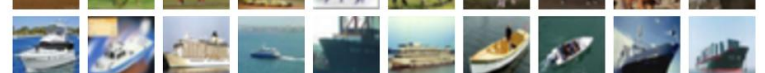
frog



horse



ship

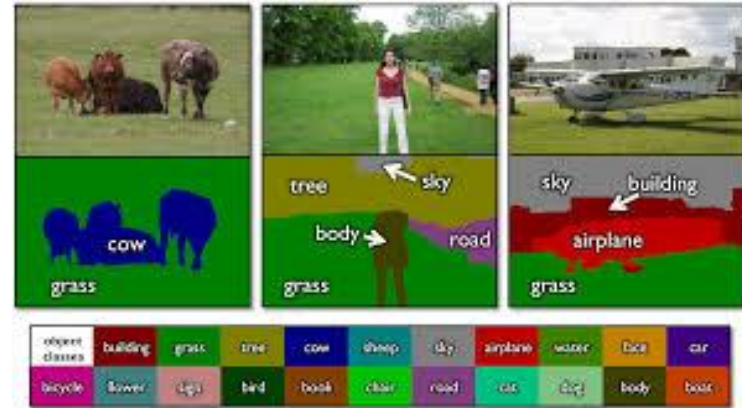


truck

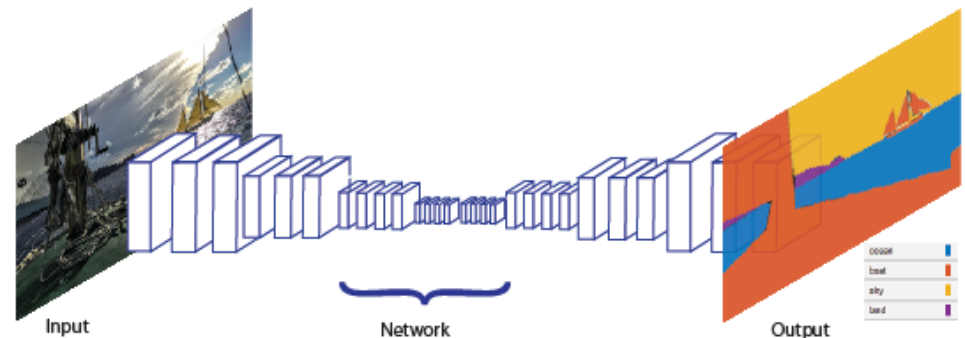


# Semantic Segmentation

- Texton boosting  
[Shotton et al. 07]
  - MRF Formulation

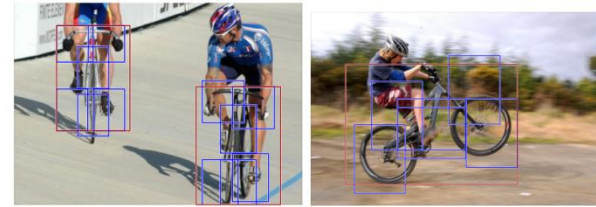


- Fully connected neural networks
  - Conv + Deconv  
[Noh et al. 15]

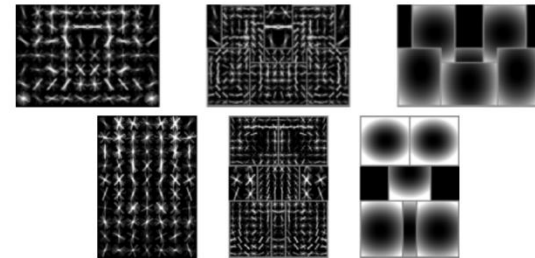


# Object Detection

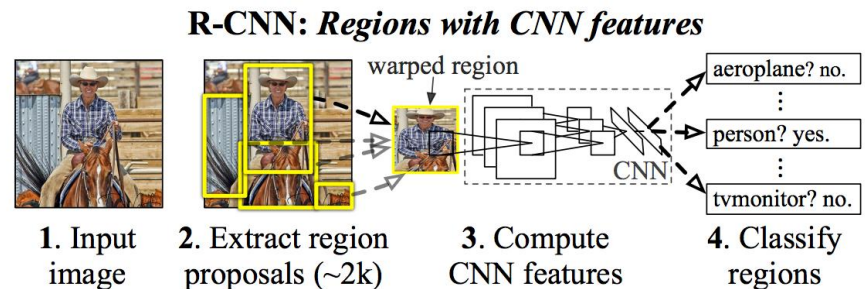
- Deformable part model [Felzenszwalb et al. 10]



- Region CNN and variants [Girshick et al. 14]



- Regression-based techniques [Law and Deng 18]





# Other Topics

- Human pose estimation
- Monocular reconstruction
- 3D understanding

# Announcement

- Last lecture is the final exam
- Last assignment is due later