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# Master in Computer Vision Barcelona

[\[http://pagines.uab.cat/mcv/\]](http://pagines.uab.cat/mcv/)



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## Module 6

# Deep Learning for Video: Object Tracking

22nd March 2018



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BARCELONATECH

Department of Signal Theory  
and Communications  
*Image Processing Group*

# Object Tracking: Feature Extractor only

DNN were firstly used for feature learning to later be used by a tracker.

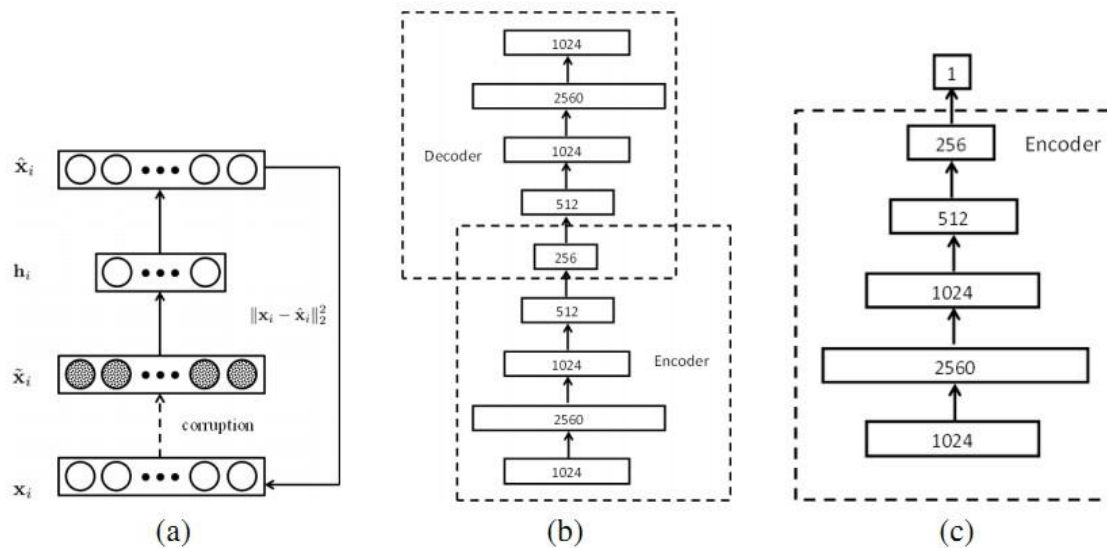
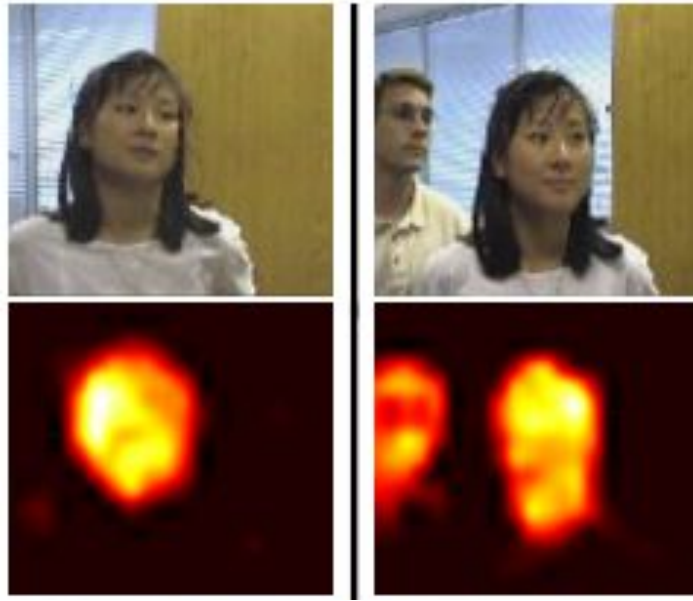


Figure 1: Some key components of the network architecture: (a) denoising autoencoder; (b) stacked denoising autoencoder; (c) network for online tracking.

# Object Tracking: FCNT: Localization

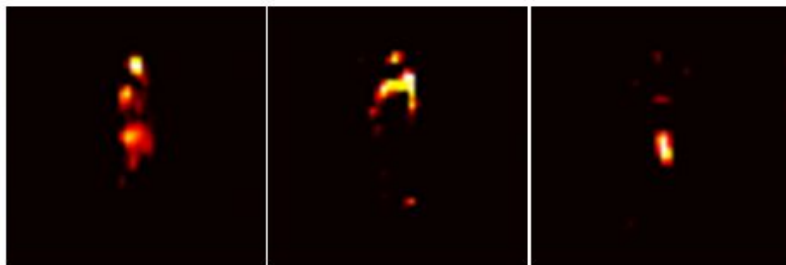
Despite trained for image classification, feature maps in **conv5-3** enable object localization...but are not discriminative enough to discriminate between instances of the same class.



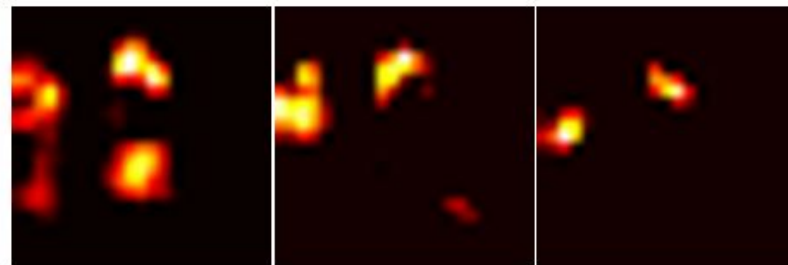
# Object Tracking: FCNT: Localization

On the other hand, feature maps from **conv4-3** are more sensitive to intra-class appearance variation...

conv4-3 (specific)



conv5-3 (general)



# Object Tracking: FCNT: Localization

SNet=Specific Network (online update)

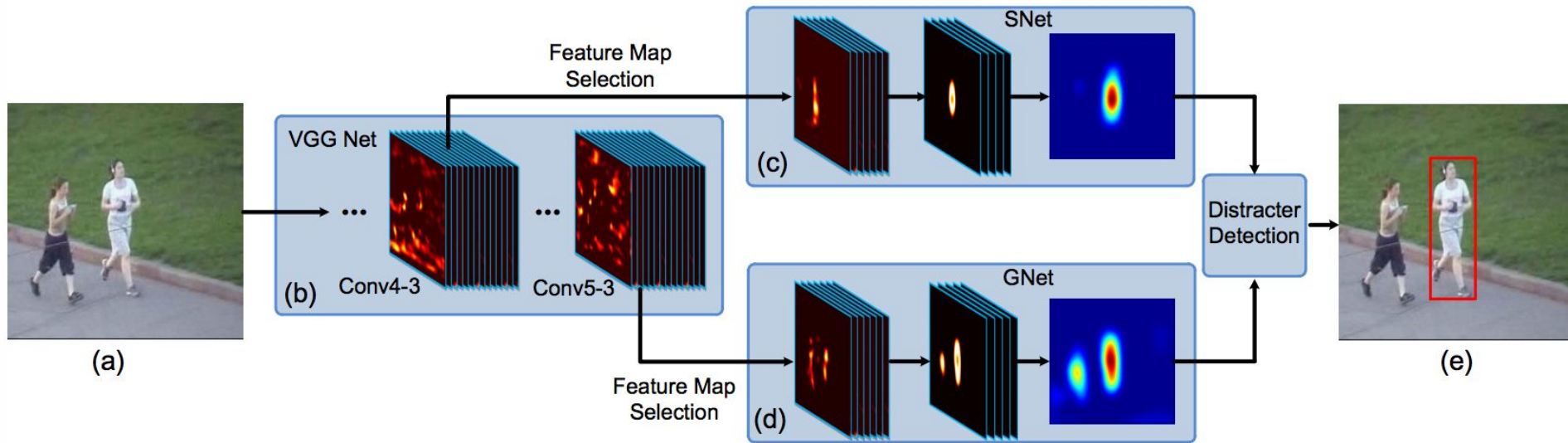
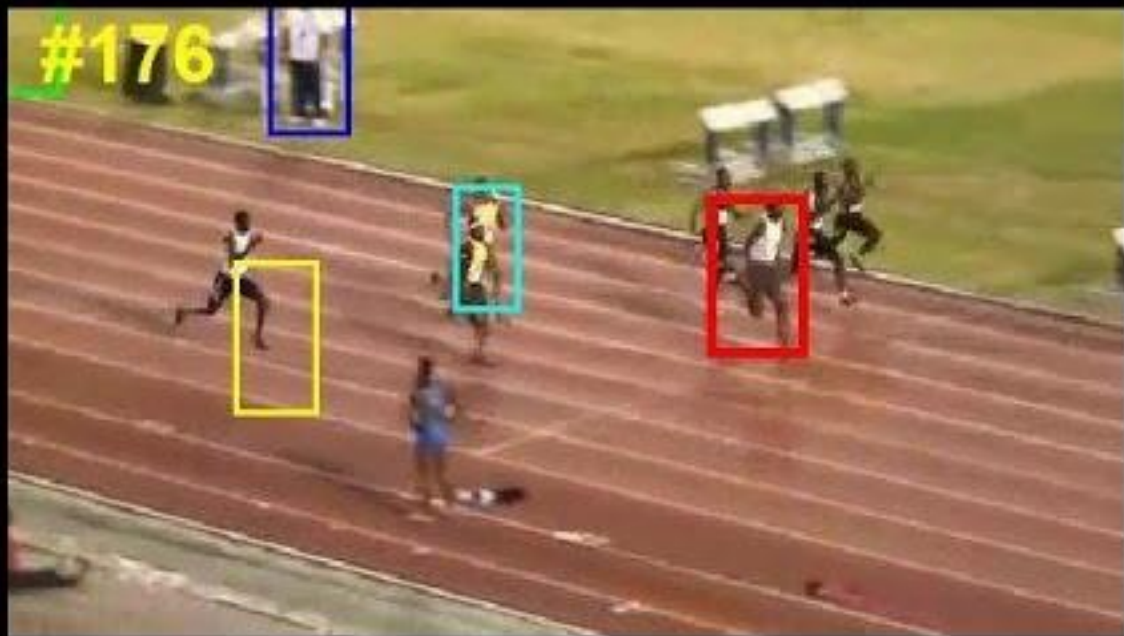


Figure 5. Pipeline of our algorithm. (a) Input ROI region. (b) VGG network. (c) SNet. (d) GNet. (e) Tracking results.

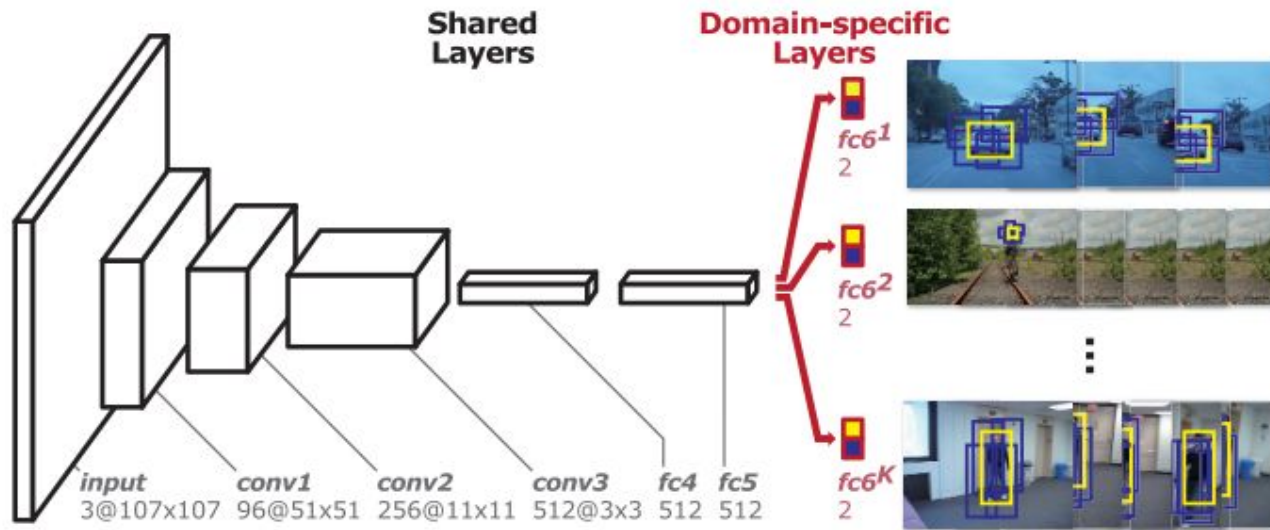
GNet=General Network (fixed)



— MDNet (Ours) — CNN-SVM — MUSTer — MEEM — DSST

Nam, Hyeonseob, and Bohyung Han. "[Learning multi-domain convolutional neural networks for visual tracking.](#)" CVPR 2016.

# Object Tracking: MDNet

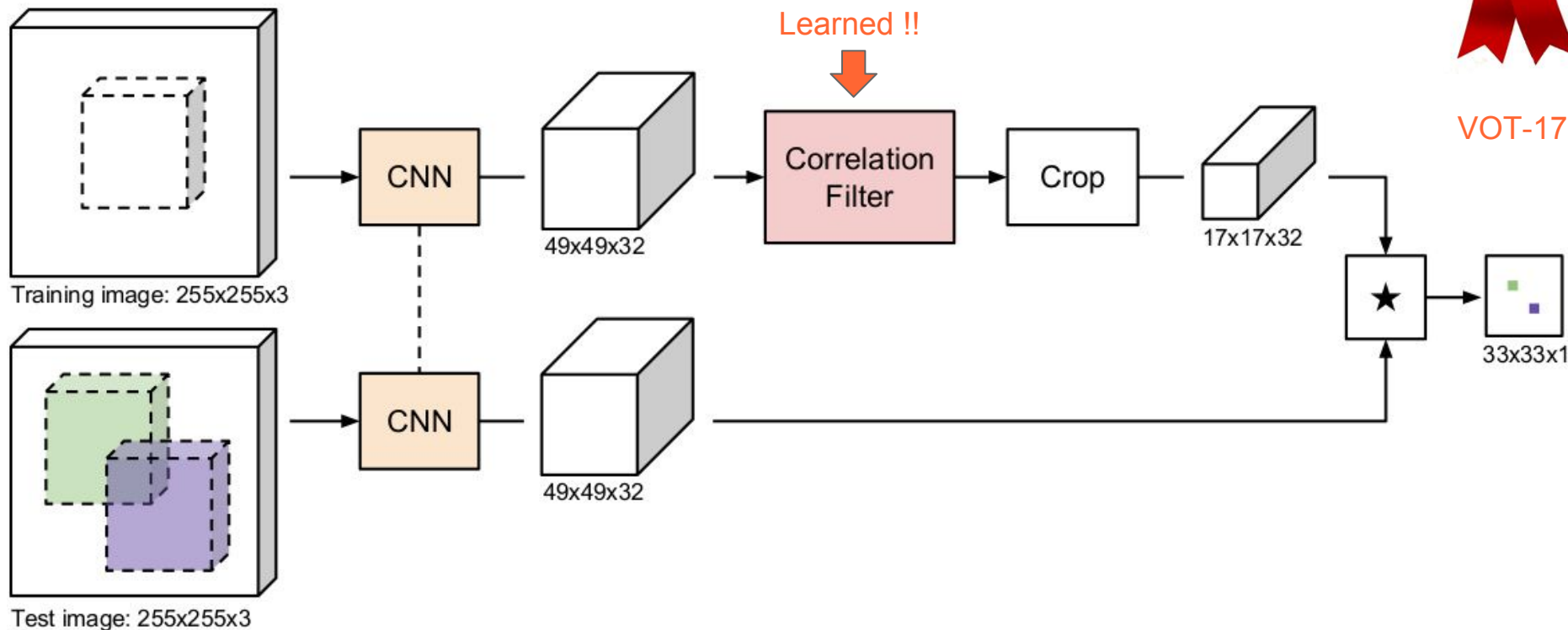


Nam, Hyeonseob, and Bohyung Han. ["Learning multi-domain convolutional neural networks for visual tracking."](#) CVPR 2016.

# Object Tracking: CFNET



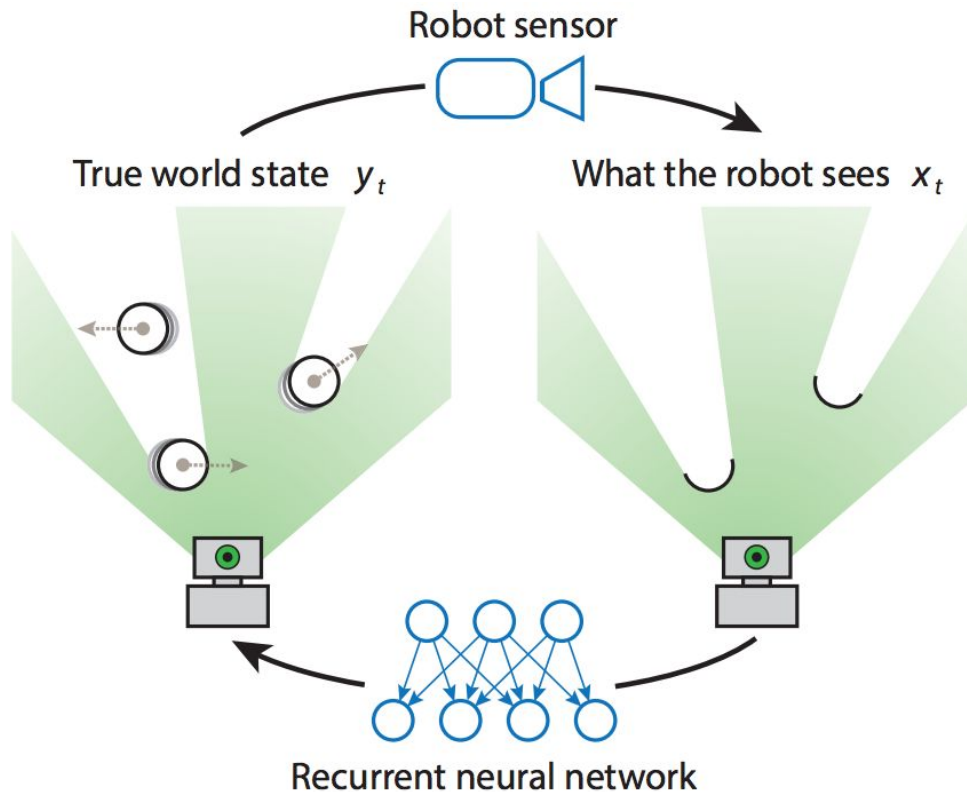
VOT-17



Valmadre, Jack, Luca Bertinetto, João F. Henriques, Andrea Vedaldi, and Philip HS Torr. ["End-to-end representation learning for Correlation Filter based tracking."](#) CVPR 2017

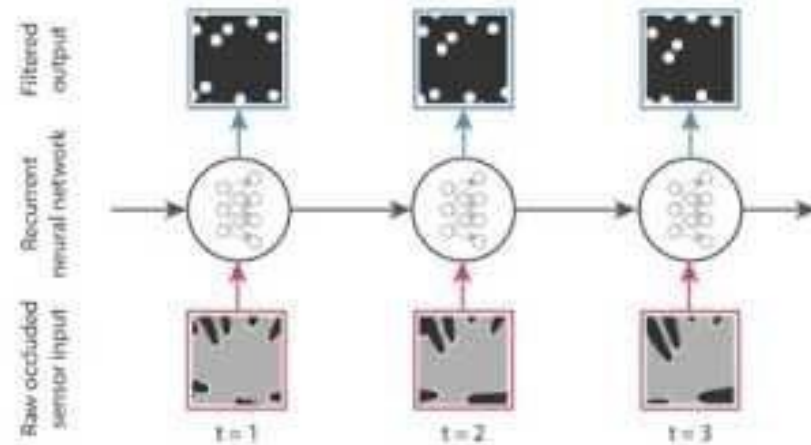


# Object Tracking: RNN

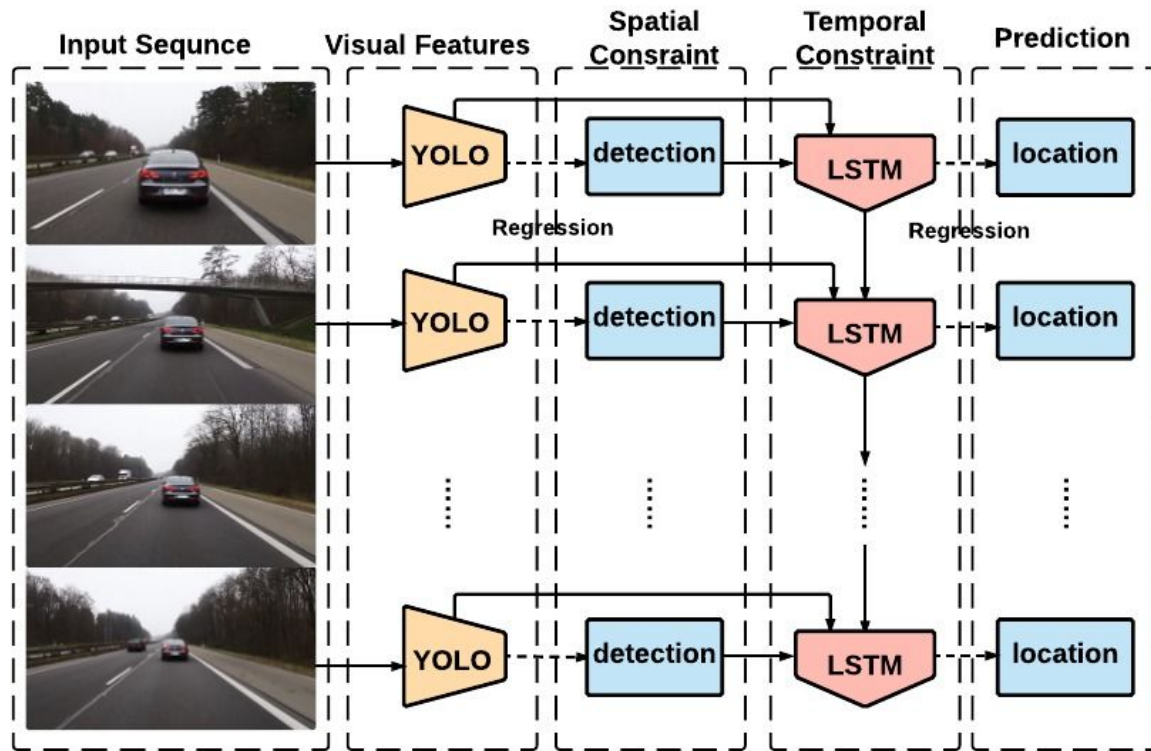


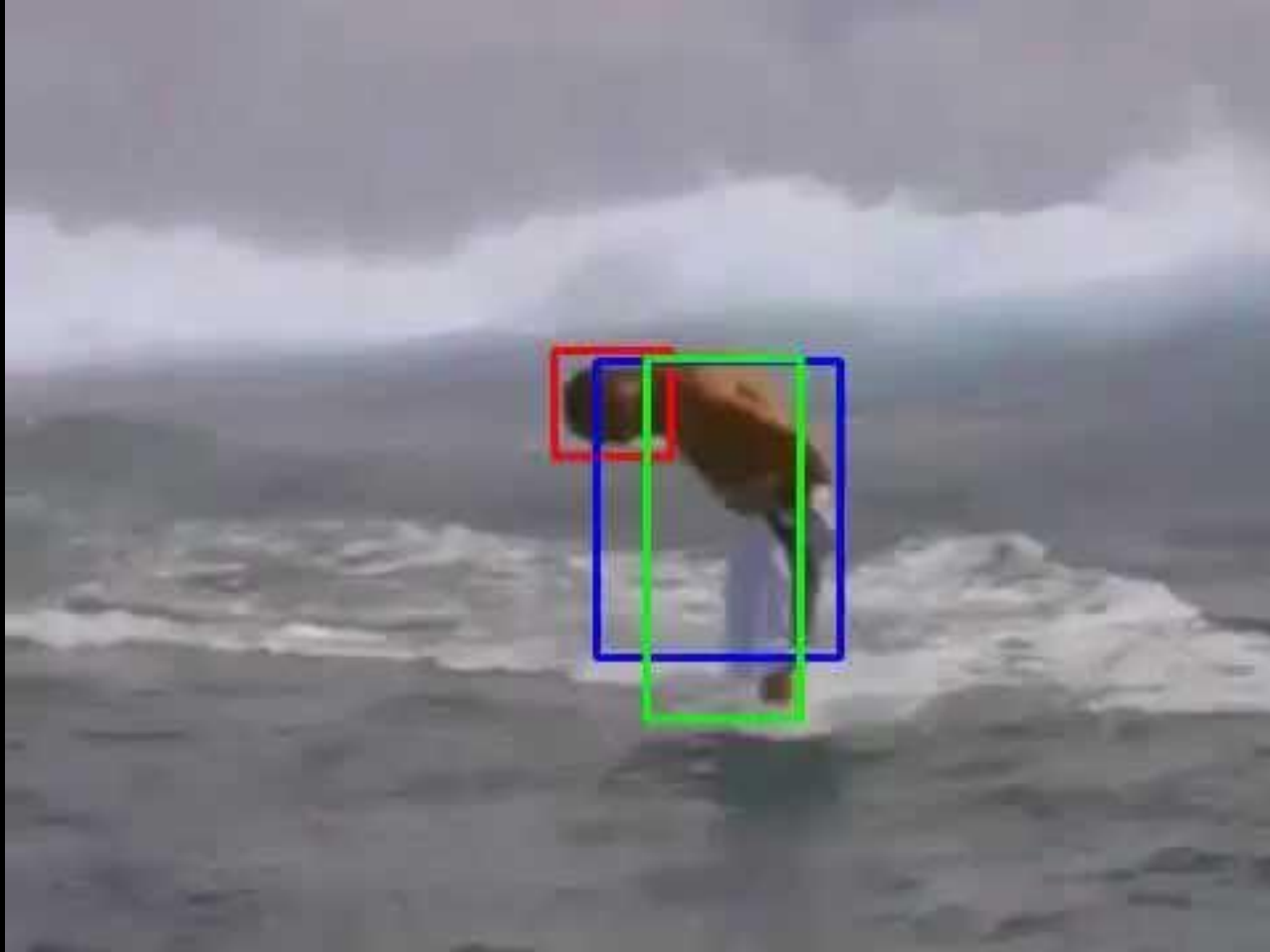
Wang, Naiyan, and Dit-Yan Yeung. ["Learning a deep compact image representation for visual tracking."](#) NIPS 2013  
[\[Project page with code\]](#)

## Overview



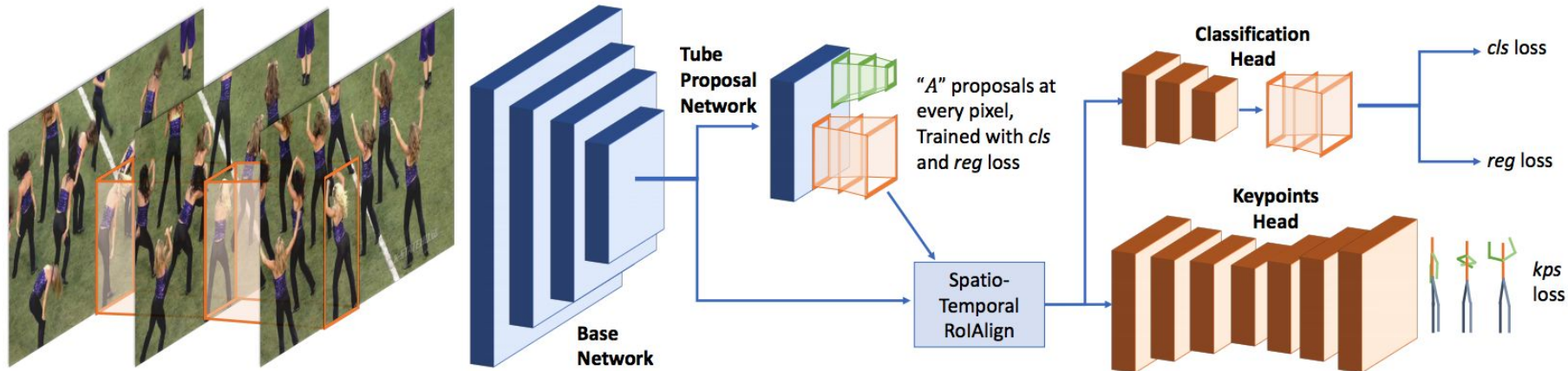
# Object Tracking: ROLO





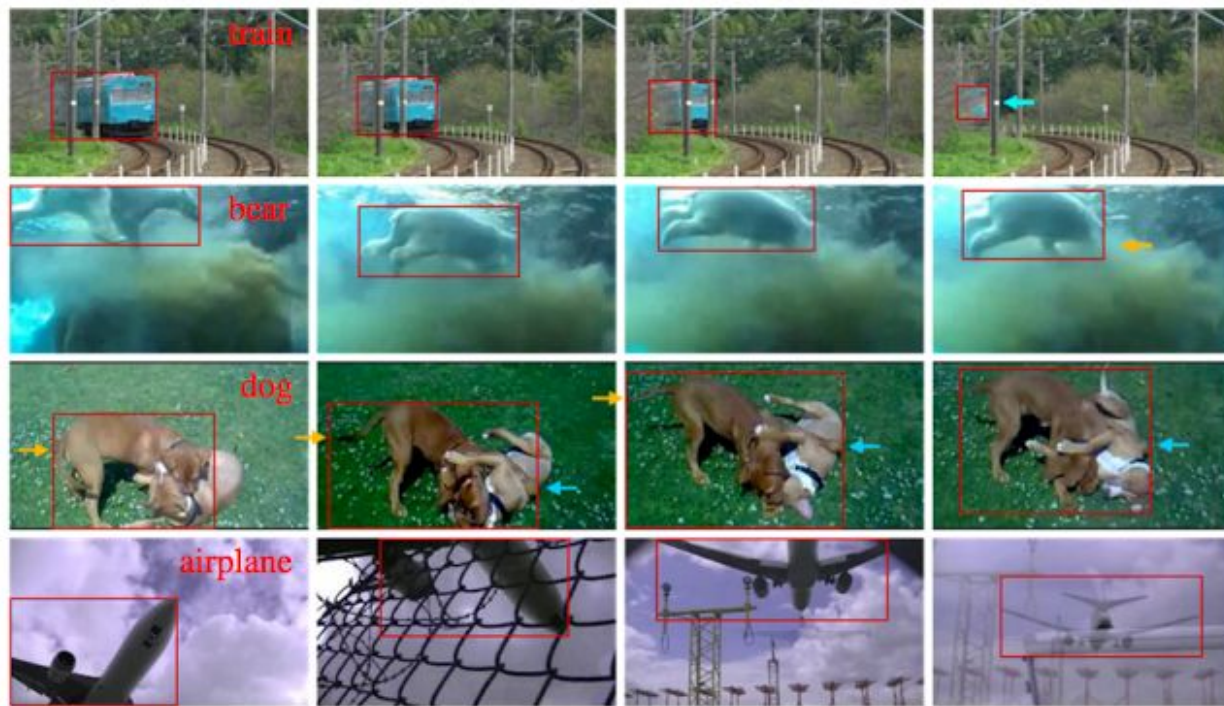
Ning, Guanghan, Zhi Zhang, Chen Huang, Zhihai He, Xiaobo Ren, and Haohong Wang. "Spatially Supervised Recurrent Convolutional Neural Networks for Visual Object Tracking." ISCAS 2017.

# Keypoint tracking



Girdhar, Rohit, Georgia Gkioxari, Lorenzo Torresani, Manohar Paluri, and Du Tran. ["Detect-and-Track: Efficient Pose Estimation in Videos."](#) CVPR 2018.

# Object tracking: Datasets: YouTube-BB



Real, Esteban, Jonathon Shlens, Stefano Mazzocchi, Xin Pan, and Vincent Vanhoucke.

["Youtube-boundingboxes: A large high-precision human-annotated data set for object detection in video."](#) CVPR 2017.

# Object Tracking: Challenges

videonet

VOT  
visual object tracking

Multiple Object Tracking Benchmark

Leal-Taixé, Laura, Anton Milan, Konrad Schindler, Daniel Cremers, Ian Reid, and Stefan Roth. ["Tracking the trackers: an analysis of the state of the art in multiple object tracking."](#)



# Deep Learning online courses by UPC:

## DEEP LEARNING FOR ARTIFICIAL INTELLIGENCE

videos will be online

Master Course UPC ETSETB TelecomBCN Barcelona. Autumn 2017.



### Instructors



### Organizers

### Supporters

aws educate



GitHub Education

+ info: <http://dlai.deeplearning.barcelona>

## DEEP LEARNING FOR COMPUTER VISION

Summer School at UPC TelecomBCN Barcelona. ?? June 2018.



### Instructors



### Organized by

### Supported by

GitHub Education



aws educate

Google Cloud Platform

+ info: <http://bit.ly/dlcv2018>

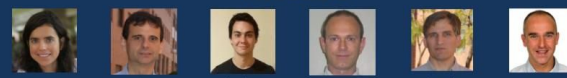
- [1st edition](#) (2016)
- [2nd edition](#) (2017)
- [3rd edition](#) (2018)

## DEEP LEARNING FOR SPEECH AND LANGUAGE

Winter School at UPC TelecomBCN Barcelona. 24-30 January 2018.



### Instructors



### Organized by

### Supported by

GitHub Education



aws educate

Google Cloud Platform

+ info: <https://telecombcn-dl.github.io/2018-dlsl/>

- [1st edition](#) (2017)
- [2nd edition](#) (2018)

Next edition Autumn 2018

Summer School (late June 2018)

Next edition Winter/Spring 2019