





# Master in Computer Vision Barcelona

http://pagines.uab.cat/mcv/



Xavier Giró-i-Nieto



Module 6
Deep Learning for Video:
Object Detection &
Segmentation

22nd March 2018

# Deep Learning online courses by UPC:

#### DEEP LEARNING FOR ARTIFICIAL INTELLIGENCE

videos will be online



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

Next edition Autumn 2018

**GitHub** Education

- MSc course (2017)
- <u>BSc course</u> (2018)



- <u>1st edition</u> (2016)
- 2nd edition (2017)
- 3rd edition (2018)

Summer School (late June 2018)



- <u>1st edition (2017)</u>
- 2nd edition (2018)

Next edition Winter/Spring 2019

#### Video Object Detection

Recognition Challenge (ILSVRC) 2015

Object Detection from Video (VID)



Wei Liu UNC Chapel Hill



Olga Russakovsky CMU



Jia Deng Univ. of Michigan



Fei-Fei Li Stanford



Alex Berg UNC Chapel Hill





[Challenge in Kaggle]

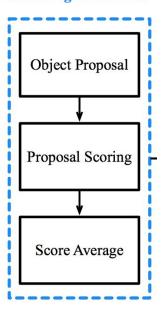
#### **Objects: Object Detection**

Video Object Detection = Intra-frame Localization + Inter-frame tracking





#### **Still-image Detection**





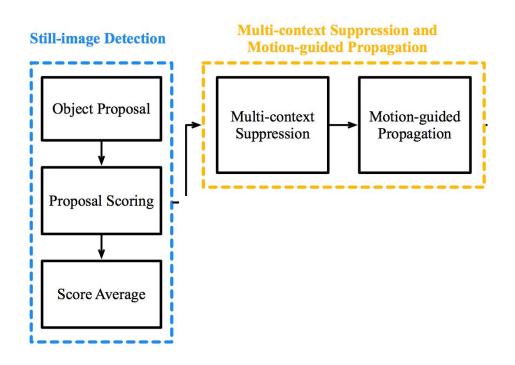
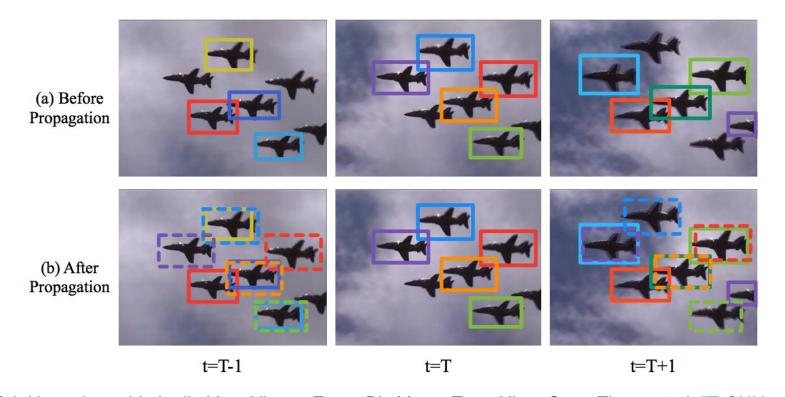
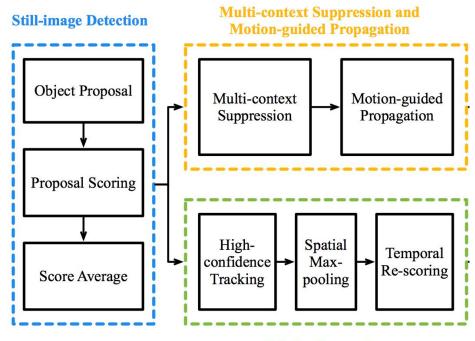




Fig 3. Multi-context Suppression (MCS)

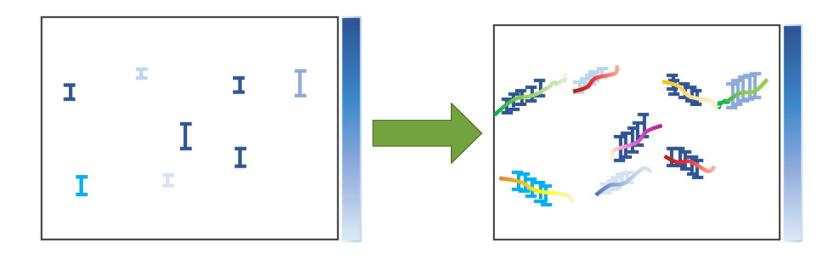




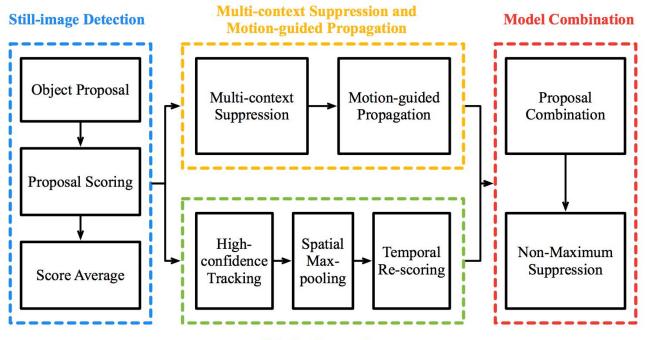


**Tubelet Re-scoring** 

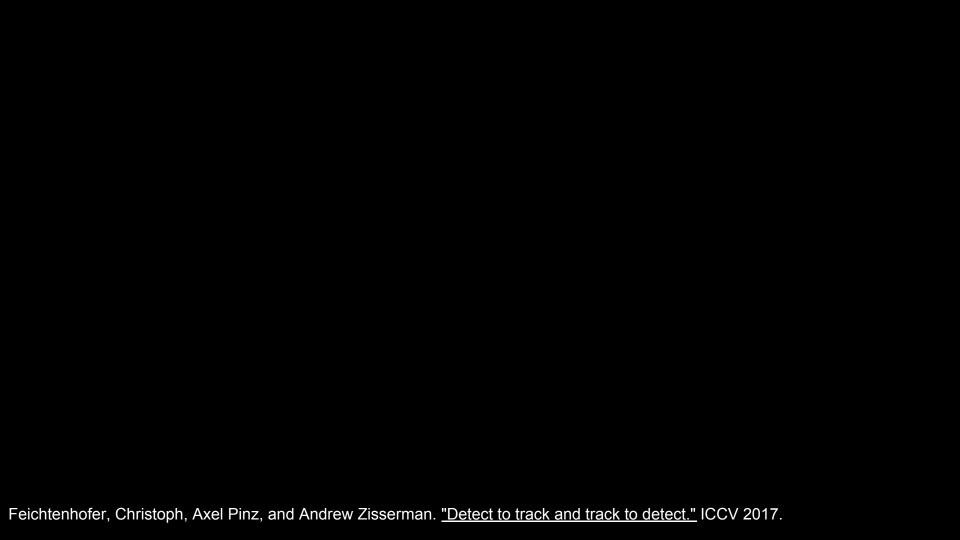
Long-term temporal consistency is obtained by running a tracking algorithm between short-term tubelets.





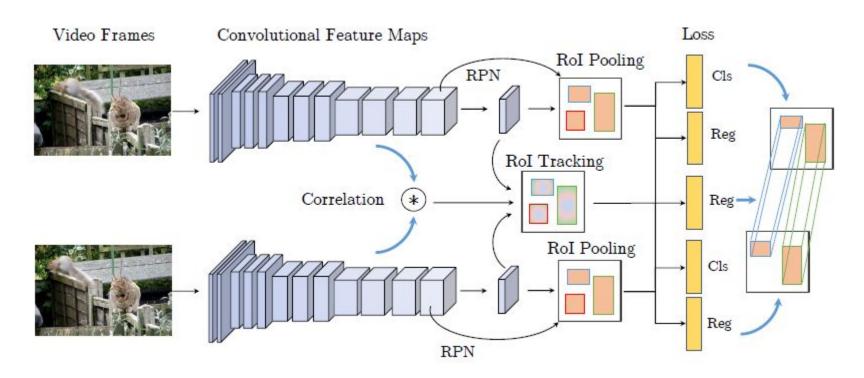


**Tubelet Re-scoring** 



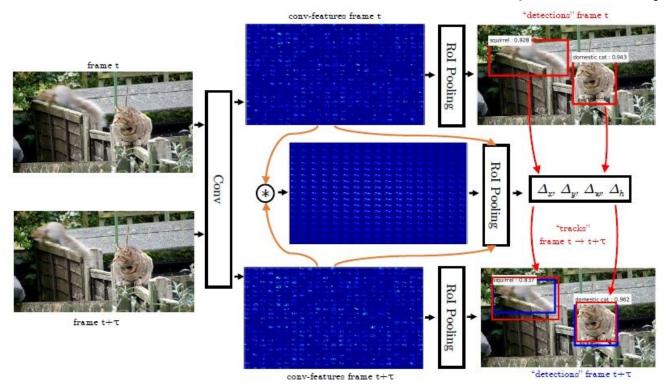
# **Object Detection: Detect & Track**

**Convolutional Cross-Correlations** between feature responses of adjacent frames.



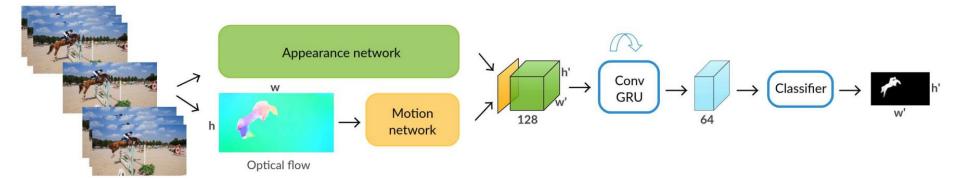
# **Object Detection: Detect & Track**

**Convolutional Cross-Correlations** between feature responses of adjacent frames.



#### Segmentation: Two-stream & Conv-GRU

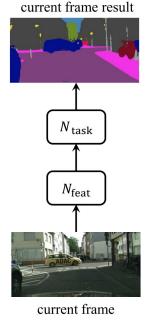
Temporal memory implemented with Conv-GRU.



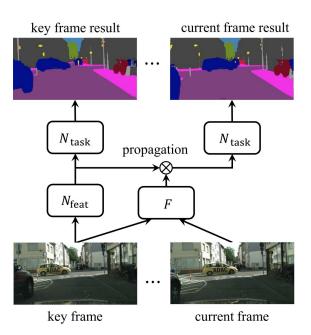
Tokmakov, Pavel, Karteek Alahari, and Cordelia Schmid. <u>"Learning video object segmentation with visual memory."</u> ICCV 2017.

### Segmentation: Deep Feature Flow

Deep features from sparse frames are propagated to neighbouring frames by the optical flow estimated by lightweight network.

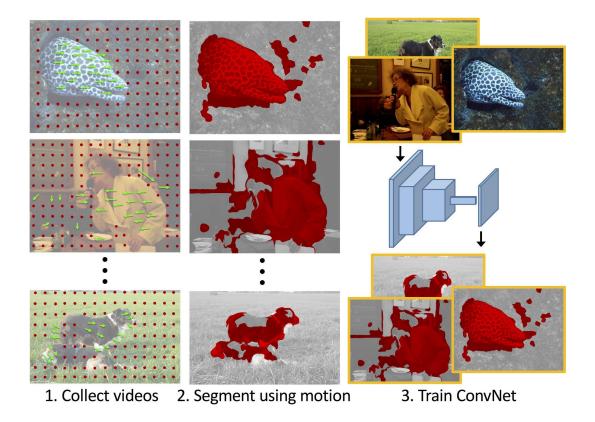


(a) per-frame network



(b) deep feature flow (DFF) network

### Segmentation: Unsupervised



Pathak, Deepak, Ross Girshick, Piotr Dollár, Trevor Darrell, and Bharath Hariharan. "Learning features by watching objects move." CVPR 2017

#### **Questions?**

#### Undergradese

What undergrads ask vs. what they're REALLY asking

"Is it going to be an open book exam?"

Translation: "I don't have to actually memorize anything, do I?"

"Hmm, what do you mean by that?"

> Translation: "What's the answer so we can all go home."

"Are you going to have office hours today?"

> Translation: "Can I do my homework in your office?"

"Can i get an extension?"

> Translation: "Can you re-arrange your life around mine?"

> > "Is grading going to be curved?"

WW. PHDCOMICS. COM

Translation: "Can I do a mediocre job and still get an A?"

