

## Evolution of Multi-scale Detection



Year: 2001 2006 2008 2013 2014 2015 2016 2017 2018 2019

### Feature Pyramids and Sliding Windows

#### Detection with Object Proposals

##### Deep Regression

##### Deep Regression

#### Multi-reference Detection

#### Multi-resolution Detection

@VJ Det. (P. Viola et al-CVPR2001), @HOG Det. (N. Dalal et al-CVPR2005), @DPM (P. Felzenszwalb et al-CVPR2008, TPAMI2010), @Exemplar SVM (T. Malisiewicz et al-ICCV2011), @Overfeat (P. Sermanet et al-ICLR2014) ...

@RCNN (R. Girshick et al-CVPR2014), @SPPNet (K. He et al-ECCV2014) @Fast RCNN (R. Girshick-ICCV2015), @Faster RCNN (S. Ren et al-NIPS2015) ...

@DNN Det. (C. Szegedy et al-NIPS2013), @YOLO (J. Redmon et al-CVPR2016) ...

Faster-RCNN (S. Ren et al-NIPS2015), @SSD (W. Liu et al-ECCV2016), @YOLOv2 (J. Redmon et al-CVPR2017), @TridentNet (Y. Li et al-arXiv19) ...

@SSD (W. Liu et al-ECCV2016), @Unified Det. (Z. Cai et al-ECCV2016) @FPN (T. Y. Lin et al-CVPR2017), @RetinaNet (T. Y. Lin et al-ICCV2017), @RefineDet (Zhang et al-CVPR18) ...

## Evolution of Bounding Box Regression

Invariance of translation and scale weak ← → strong

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Method	Without Bounding Box Regression	From Bounding Box to Bounding Box	From Feature to Bounding Box
Remarks		Icing on the cake, optional	Essential, integrated with the model

@VJ Det. (P. Viola et al-CVPR2001), @HOG Det. (N. Dalal et al-CVPR2005), @Exemplar SVM (T. Malisiewicz et al-ICCV2011) ...

@DPM (P. Felzenszwalb et al-CVPR2008, TPAMI2010)

@Overfeat (P. Sermanet et al-ICLR2014), @RCNN (R. Girshick et al-CVPR2014), @SPPNet (K. He et al-ECCV2014) @Fast RCNN (R. Girshick-ICCV2015), @Faster RCNN (S. Ren et al-NIPS2015), @YOLO (J. Redmon et al-CVPR2016), @SSD (W. Liu et al-ECCV2016), @YOLOv2 (J. Redmon et al-CVPR2017), @Unified Det. (Z. Cai et al-ECCV2016) @FPN (T. Y. Lin et al-CVPR2017), @RetinaNet (T. Y. Lin et al-ICCV2017), @RefineDet (Zhang et al-CVPR18), @TridentNet (Y. Li et al-arXiv19) ...



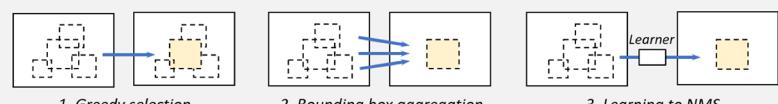
## Evolution of Context Priming in Object Detection



Year: 2001 2005 2008 2011 2013 2015 2016 2017 2018 2019

Detection with Local Context									
@Face Det. (A. Torralba et al-MIT2001), @MultiPath (S. Zagoruyko et al-BMVC2016), @GBDNet (X. Zeng et al-ECCV2016, TPAMI2018), @CC-Net (W. Ouyang et al-arXiv2017), @MultiRegion-CNN (S. Gidaris et al-CVPR2015), @CoupleNet (Y. Zhu et al-ICCV2017) ...									
Detection with Global Context									
@DPM (P. Felzenszwalb et al-CVPR2010), @StrucDet (C. Desai et al-IJCV2011) ...									
Context Interactives									
@YOLO (J. Redmon et al-CVPR2016), @RFCN++ (Z. Li et al-AAAI2018), @ION (S. Bell et al-CVPR2016), @AttenContext (J. Li et al-TMM17) ...									
@CtxSVM (Q. Chen et al-TPAMI2015), @PersonContext (S. Gupta et al-arXiv2015), @SMN (X. Chen-ICCV2017), @RelationNet (H. Hu et al-CVPR2018), @SIN (Y. Liu et al-CVPR2018), ...									

## Evolution of Non-Max Suppression



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Traditional Greedy Selection									
Bounding Box Aggregation									
@VJ Det. (P. Viola et al-CVPR2001)									
@Face Det. (R. Vaillant et al-VISP1994), @HOG Det. (N. Dalal et al-CVPR2005), @DPM (P. Felzenszwalb et al-CVPR2008, TPAMI2010), @RCNN (R. Girshick et al-CVPR2014), @SPPNet (K. He et al-ECCV2014) @Fast RCNN (R. Girshick-ICCV2015), @Faster RCNN (S. Ren et al-NIPS2015), @YOLO (J. Redmon et al-CVPR2016), @SSD (W. Liu et al-ECCV2016), @FPN (T. Y. Lin et al-CVPR2017), @RetinaNet (T. Y. Lin et al-ICCV2017) ...									
Bounding Box Aggregation									
@Overfeat (P. Sermanet et al-ICLR2014), @APC-NMS (R. Rothe et al-ACCV2014), @MAPC (D. Mrowca et al-ICCV2015) ...									
Learning to Non-Maximum Suppression									
@LearnNMS (J. Hosang et al-ICCV2017), @MAP-Det (P. Henderson et al-ACCV2016), @End2End-DPM (L. Wan et al-CVPR2015), @StrucDet (C. Desai et al-IJCV2011) ...									
@SoftNMS (N. Bodla et al-ICCV2017), @FitnessNMS (L. Tychsen-Smith et al-CVPR2018) ...									

## Evolution of Hard Negative Mining

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Method	Bootstrap	Without Hard Negative Mining	Bootstrap + New Loss Functions
Remarks	Bootstrap was widely used to deal with the insufficient computing resources of early time	By simply balancing the weights between object and background classes	Focusing on hard examples. Computing power is no longer a problem.

@Face Det. (H. A. Rowley et al-CMU Tech Rep 1995), @Haar Det. (C. P. Papageorgiou et al-ICCV1998), @VJ Det. (P. Viola et al-CVPR2001), @HOG Det. (N. Dalal et al-CVPR2005), @DPM (P. Felzenszwalb et al-CVPR2008, TPAMI2010) ...

@RCNN (R. Girshick et al-CVPR2014), @SPPNet (K. He et al-ECCV2014) @Fast RCNN (R. Girshick-ICCV2015), @Faster RCNN (S. Ren et al-NIPS2015), @YOLO (J. Redmon et al-CVPR2016) ...

@SSD (W. Liu et al-ECCV2016), @Faster Ped (L. Zhang et al-ECCV2016), @OHEM (A. Shrivastava et al-CVPR2016), @RetinaNet (T. Y. Lin et al-ICCV2017), @RefineDet (Zhang et al-CVPR18) ...