## Case study: RetinaNet

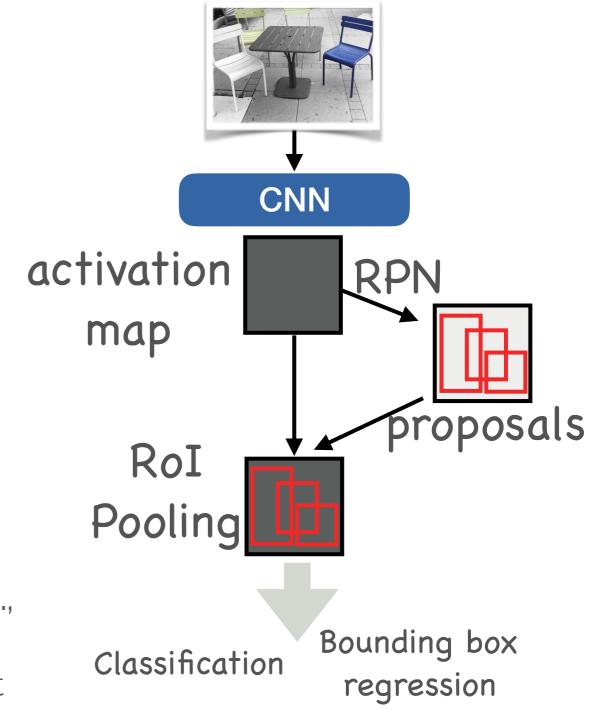
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## Single stage detection

- Object detection without cropping
  - Use region proposal network for classification

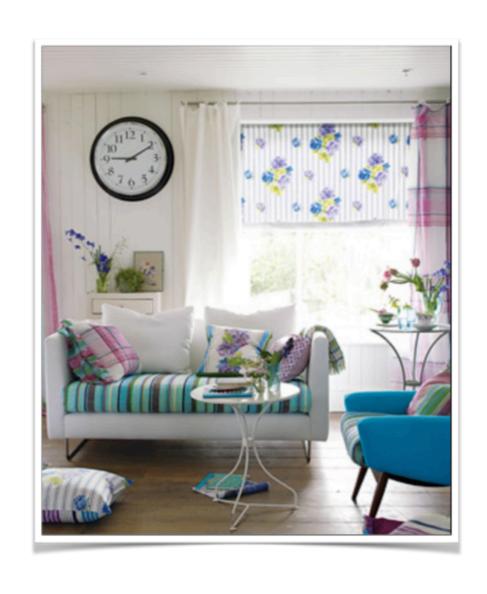
Focal Loss for Dense Object Detection, Lin et al., ICCV 2017

You Only Look Once: Unified, Real-Time Object Detection, Redmon et al., CVPR 2016



# Single stage detection - issues

- End-to-end training
  - More negative examples than positives
  - Solution: Weighted loss



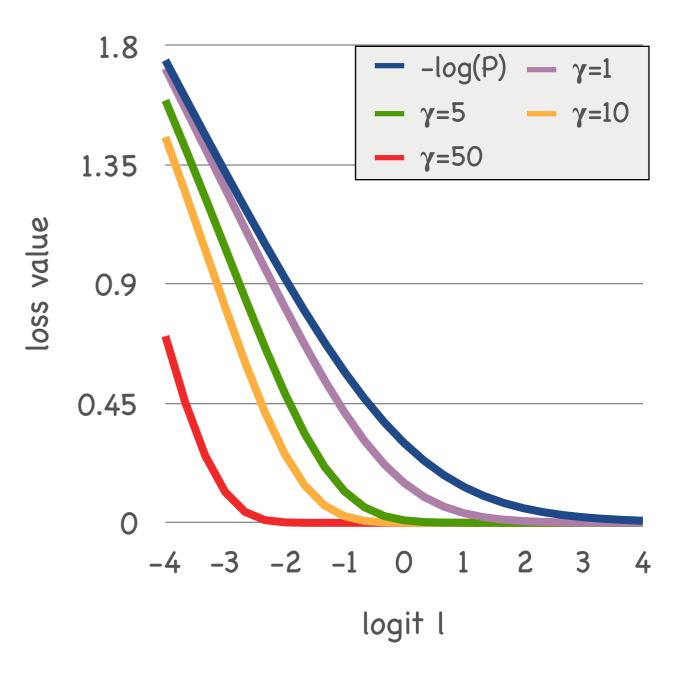
#### RetinaNet

Focal loss:

• 
$$-(1-p(y))^{\gamma}\log p(y)$$

• With 
$$p(y = 1) = \frac{1}{1 + \exp(-l)}$$

 Allows for different weight on positives and negatives



### Summary

- Focal loss
  - Used beyond object detection
  - Imbalanced training labels
- RetinaNet
  - Single stage
  - Faster than FasterRCNN