

# **Paper Discussion**

Joint 3D Proposal Generation and Object  
Detection from View Aggregation (AVOD)

2018-03-29

# Background: 2D Object Detection on CNN



Input Image

**Question:** Where are the **cars** in the image?

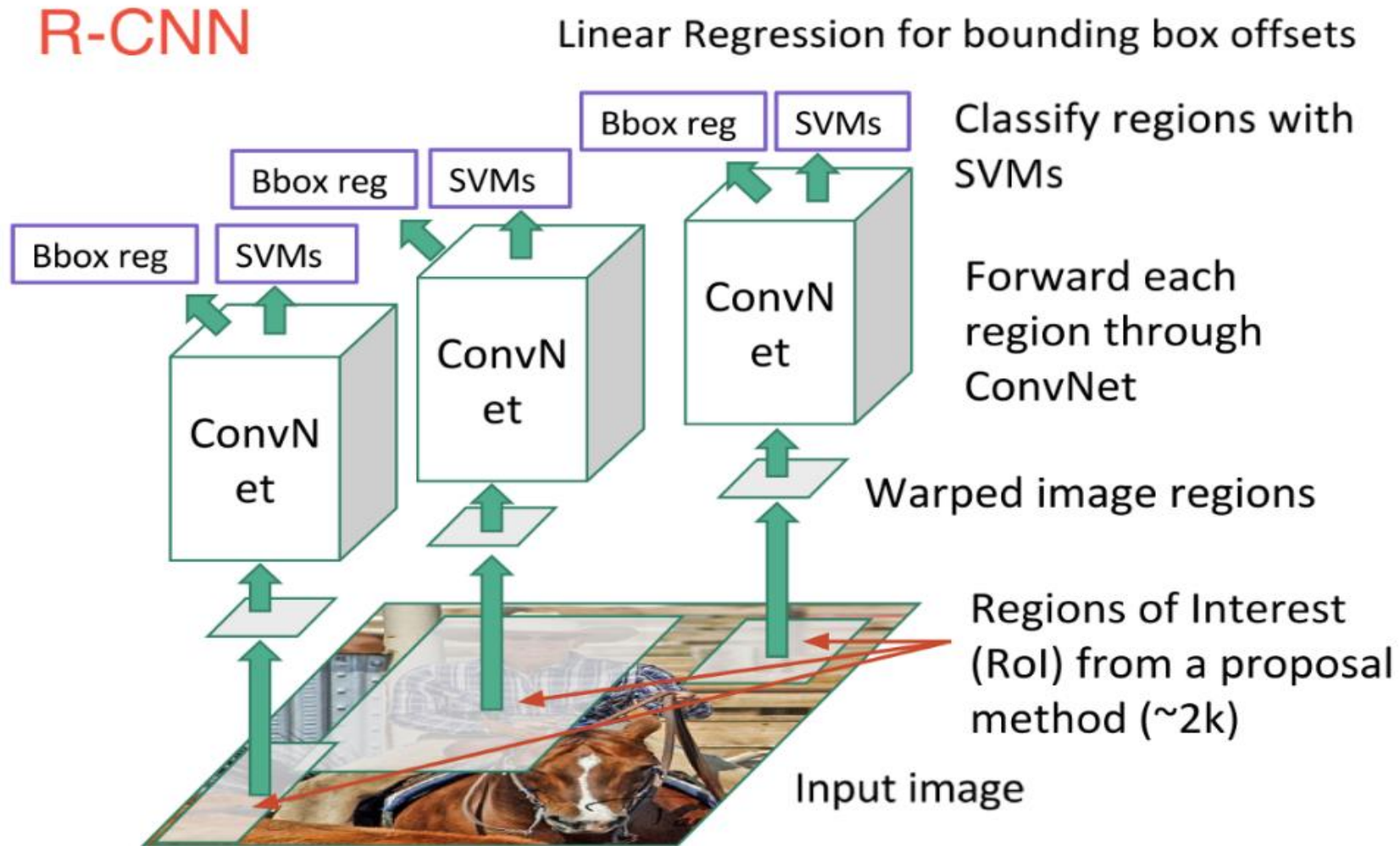
**Answer:**



Object Detection Approach: Recognition + Localization

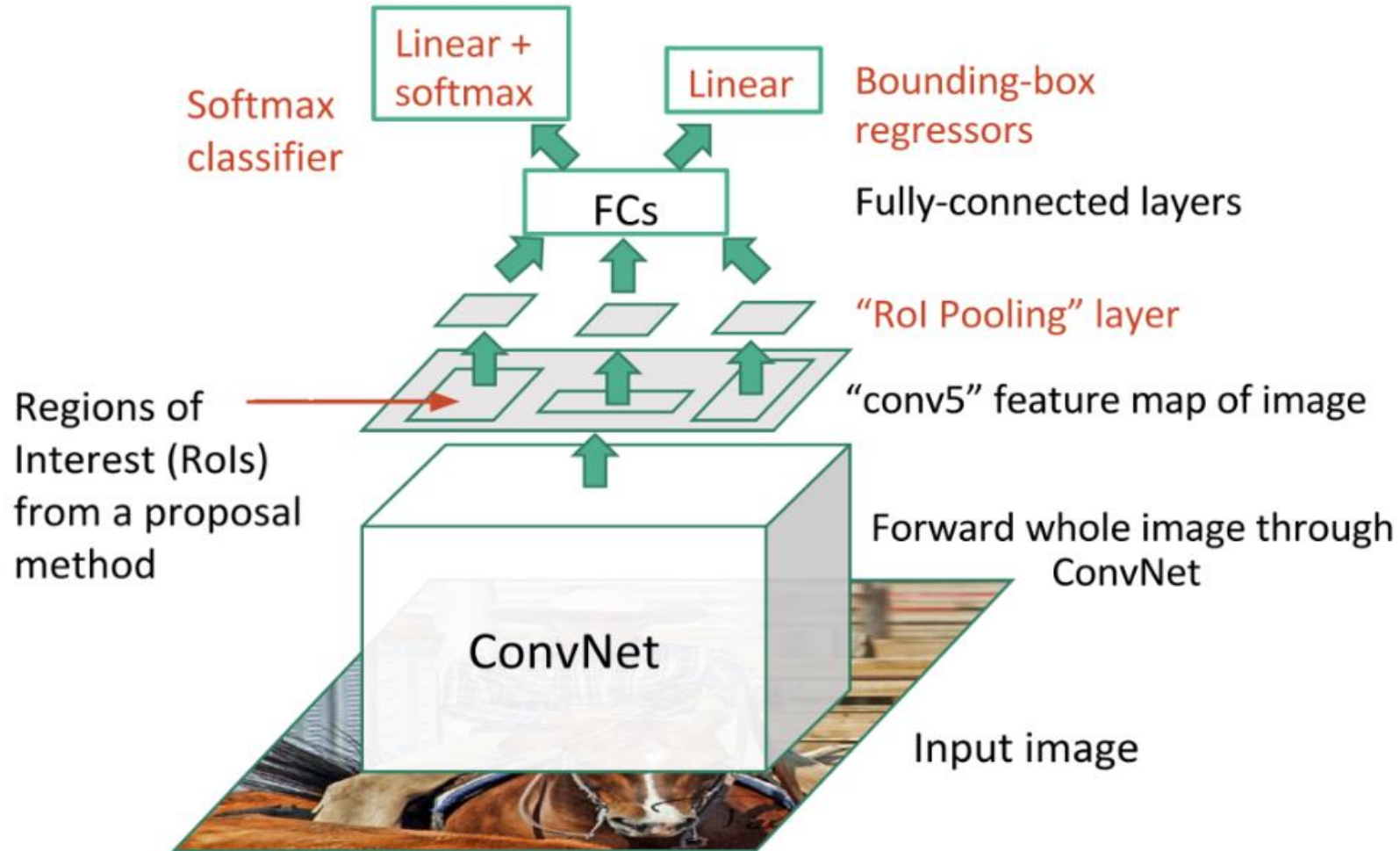
- Candidate Box Selection
- Feature Extraction
- Classification+ Bounding Box Regression

# Background: 2D Object Detection on CNN



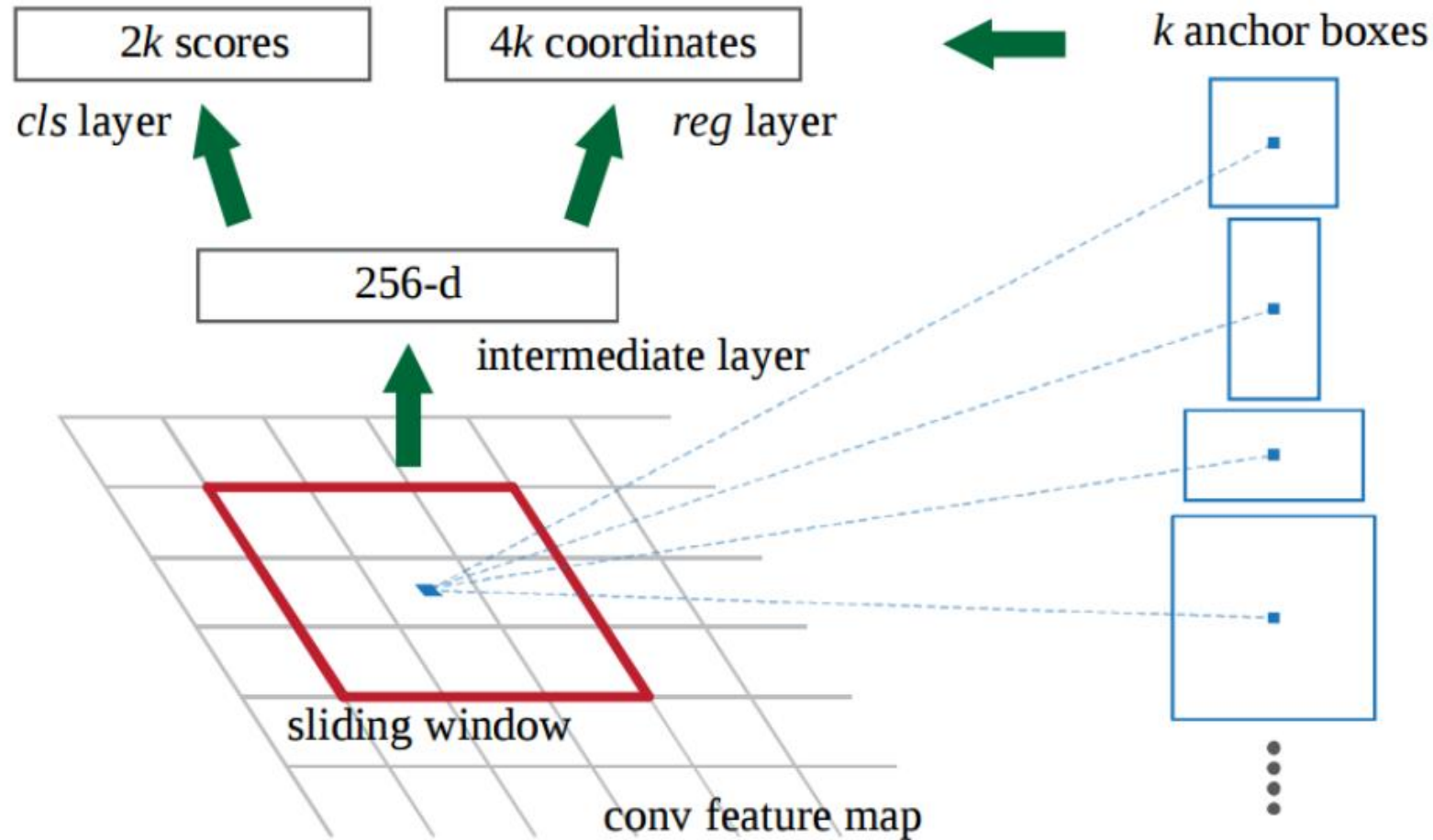
# Background: 2D Object Detection on CNN

## Fast R-CNN



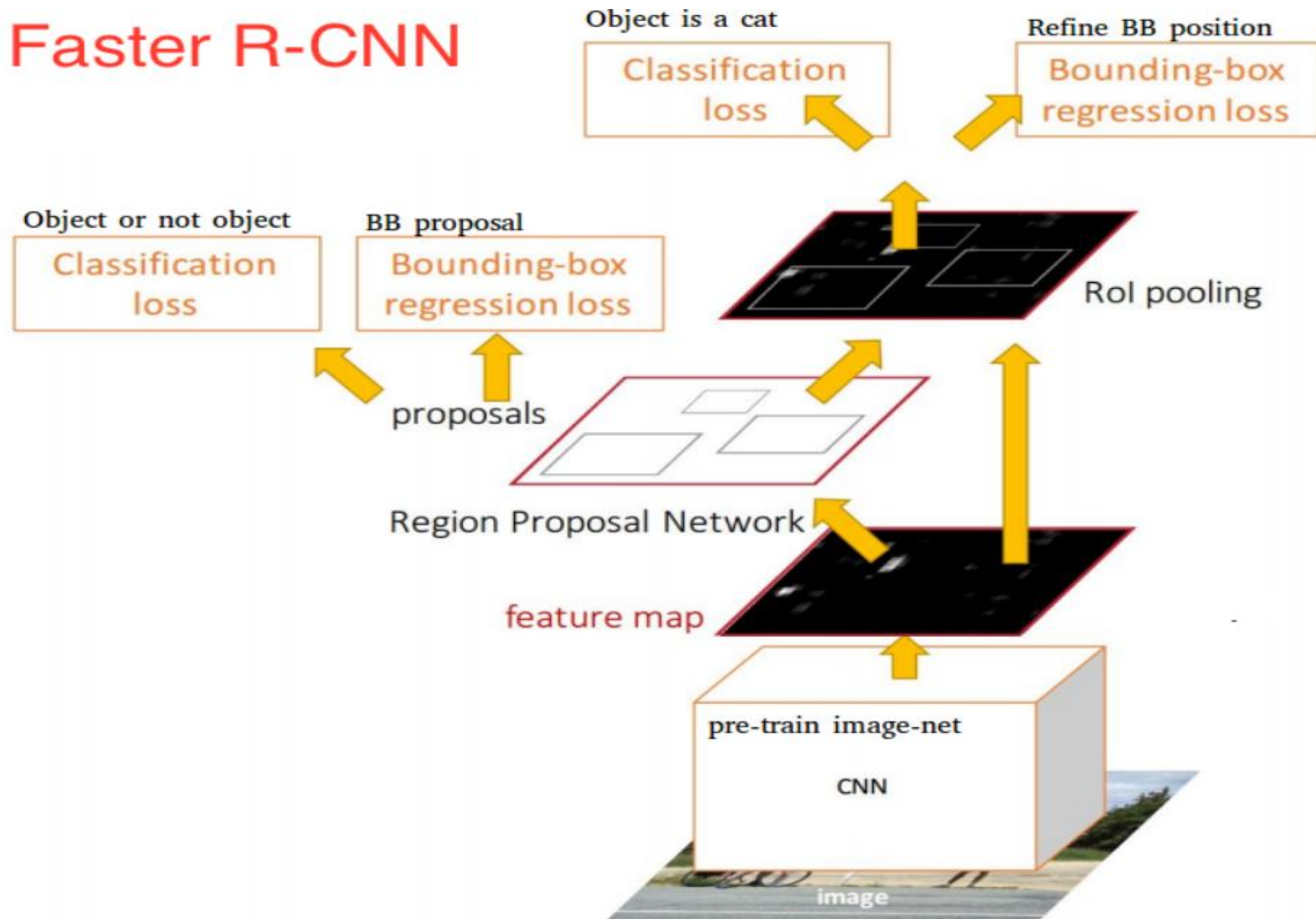
# Background: 2D Object Detection on CNN

RPN: Regional Proposal Network



# Background: 2D Object Detection on CNN

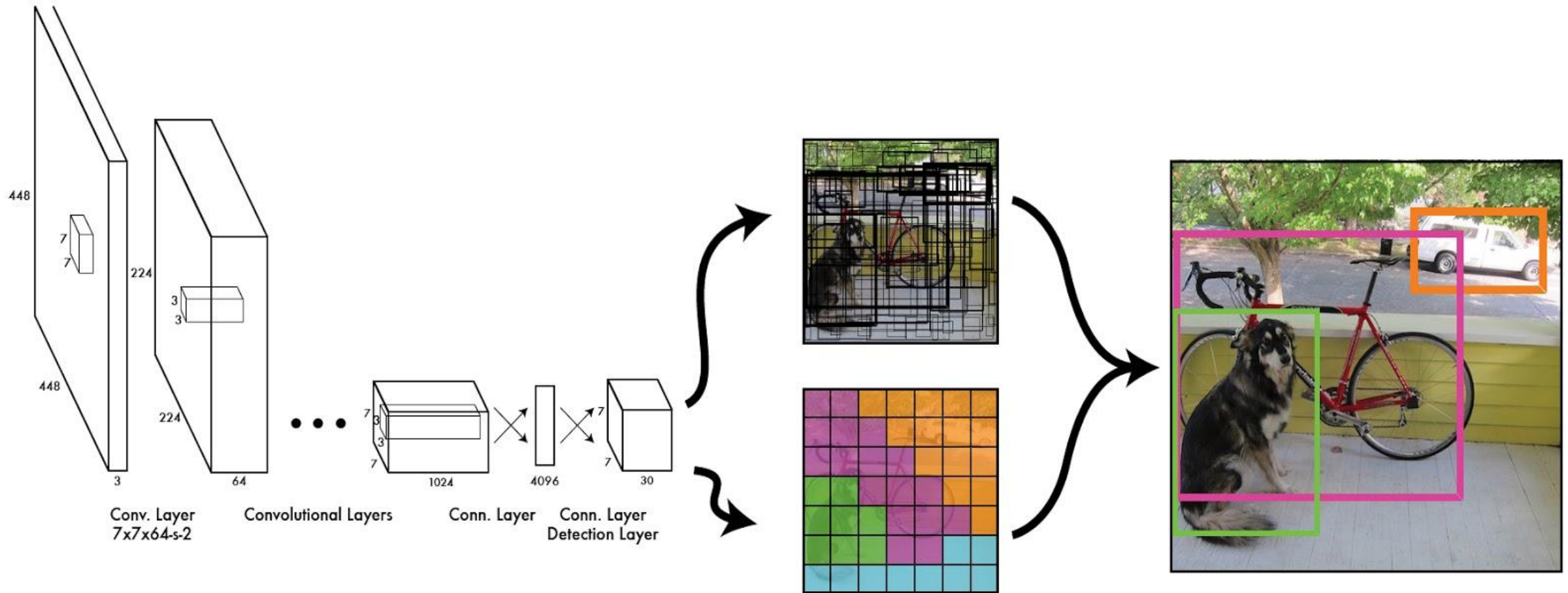
## Faster R-CNN





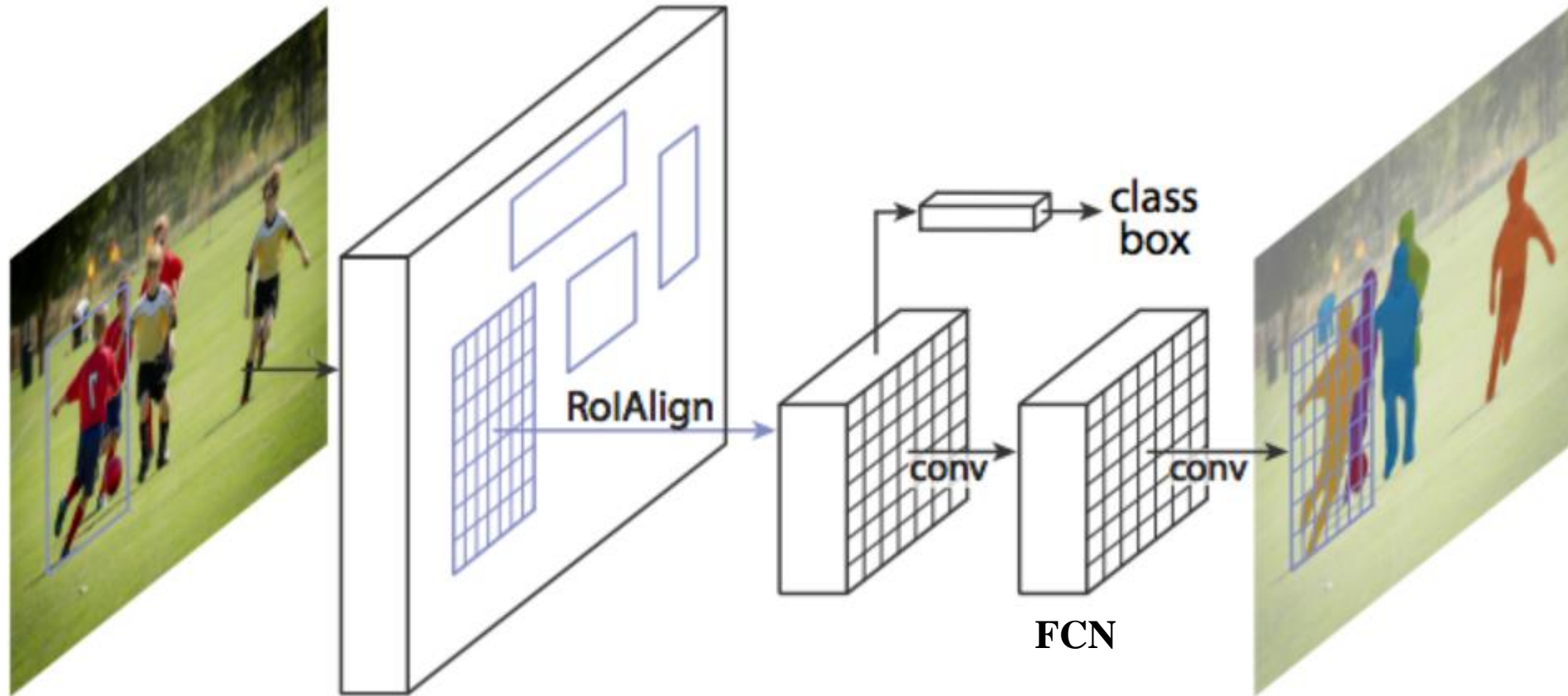
# Background: 2D Object Detection on CNN

## YOLO



# Background: 2D Object Detection on CNN

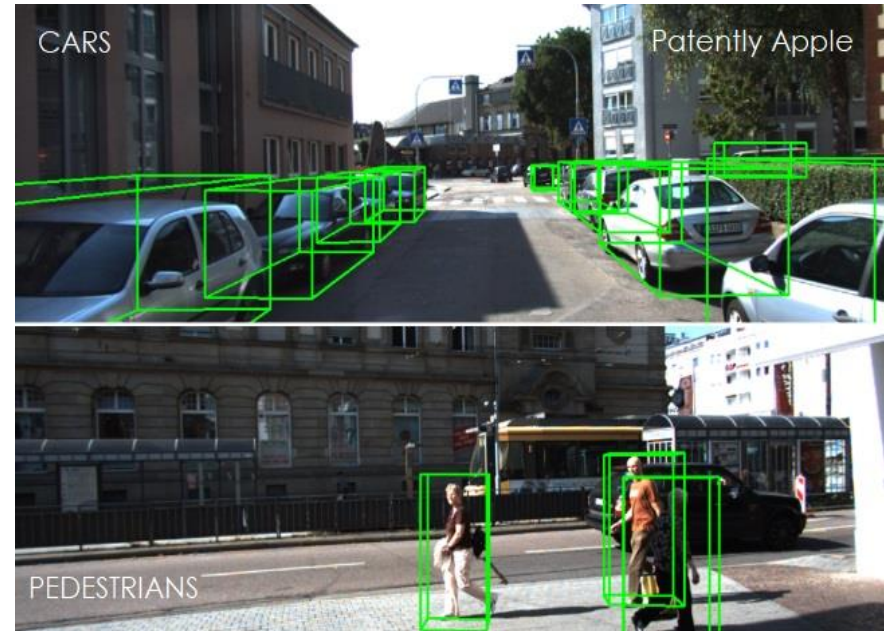
## Mask R-CNN





# Problem Domain

- 3D object detection from images and point cloud for autonomous driving
- Deep neural networks
- KITTI 3D object detection benchmark



# Challenges

2D  $\longrightarrow$  3D:

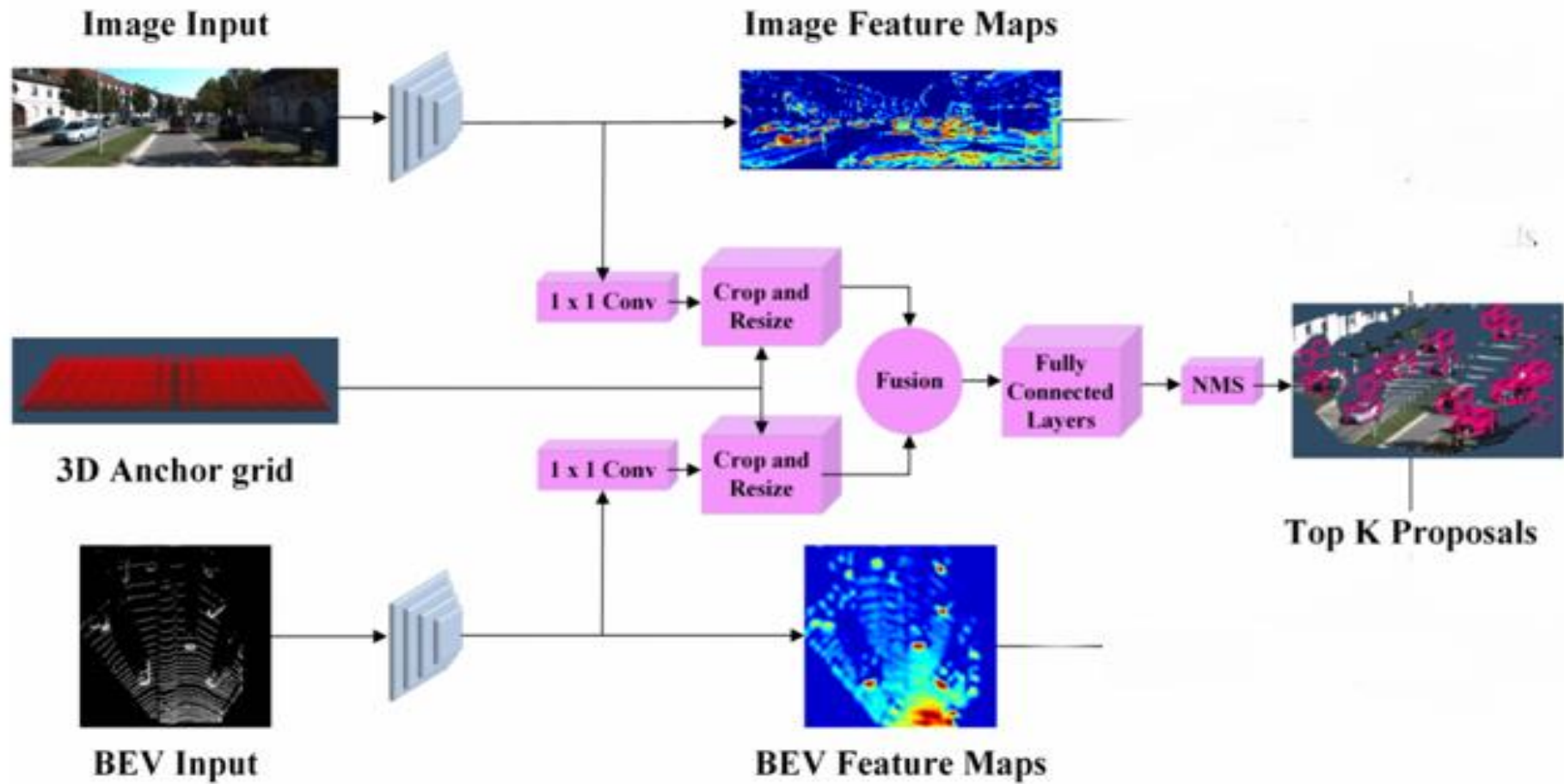
- Low resolution of the input data
- Missed instances during region proposal generation cannot be recovered
- Oriented bounding box estimation

# Related Work

- Hand Crafted Feature For Proposal Generation
- Proposal Free Single Shot Detectors
- Monocular-Based Proposal Generation
- Monocular-Based 3D Object Detections
- 3D Region Proposal Networks (RPN)

# Solutions

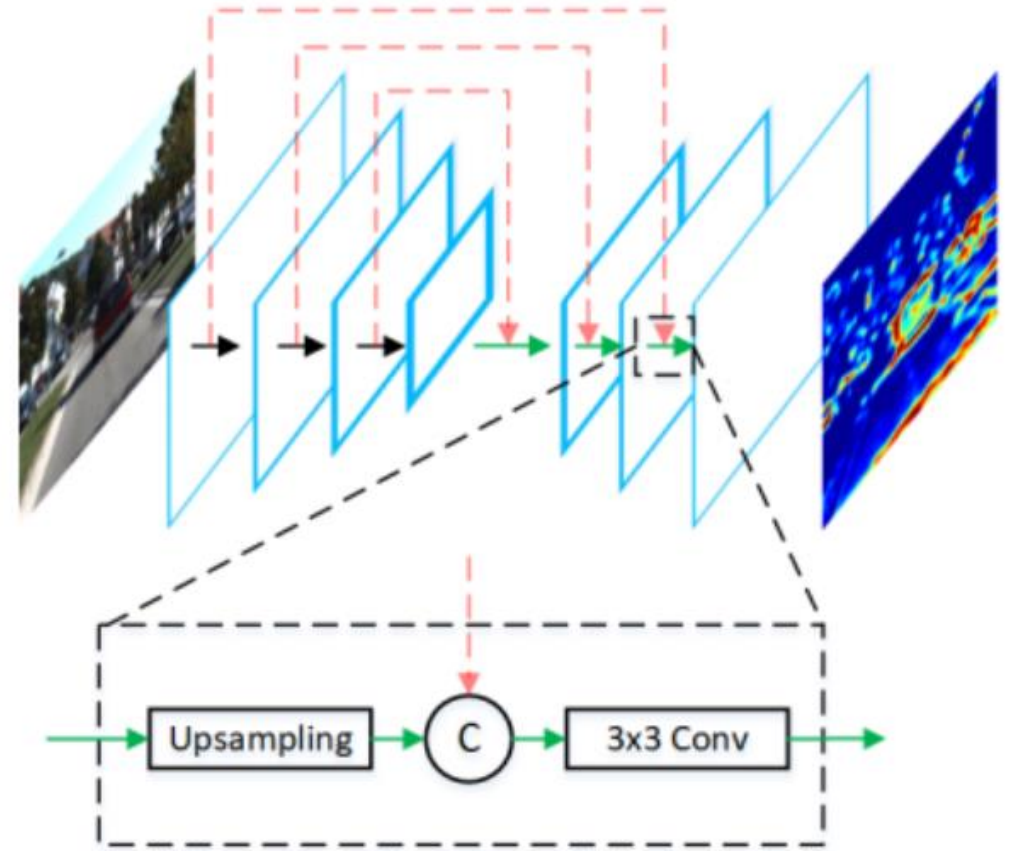
## First Stage Detection



# Solutions

# Feature Map Generating

- BEV images and RGB images
- Feature Pyramid Network (FPN)
- Decoder (Upsampling)





# Solutions

3D Anchor Generation  $(t_x, t_y, t_z)$  ,  $(d_x, d_y, d_z)$

- 3D anchor box grid (80-100K anchors)
- Crop and resize from the feature maps (projection on BEV and RGB feature maps)
- Dimensionality Reduction Via  $1*1$  Convolutional Layers

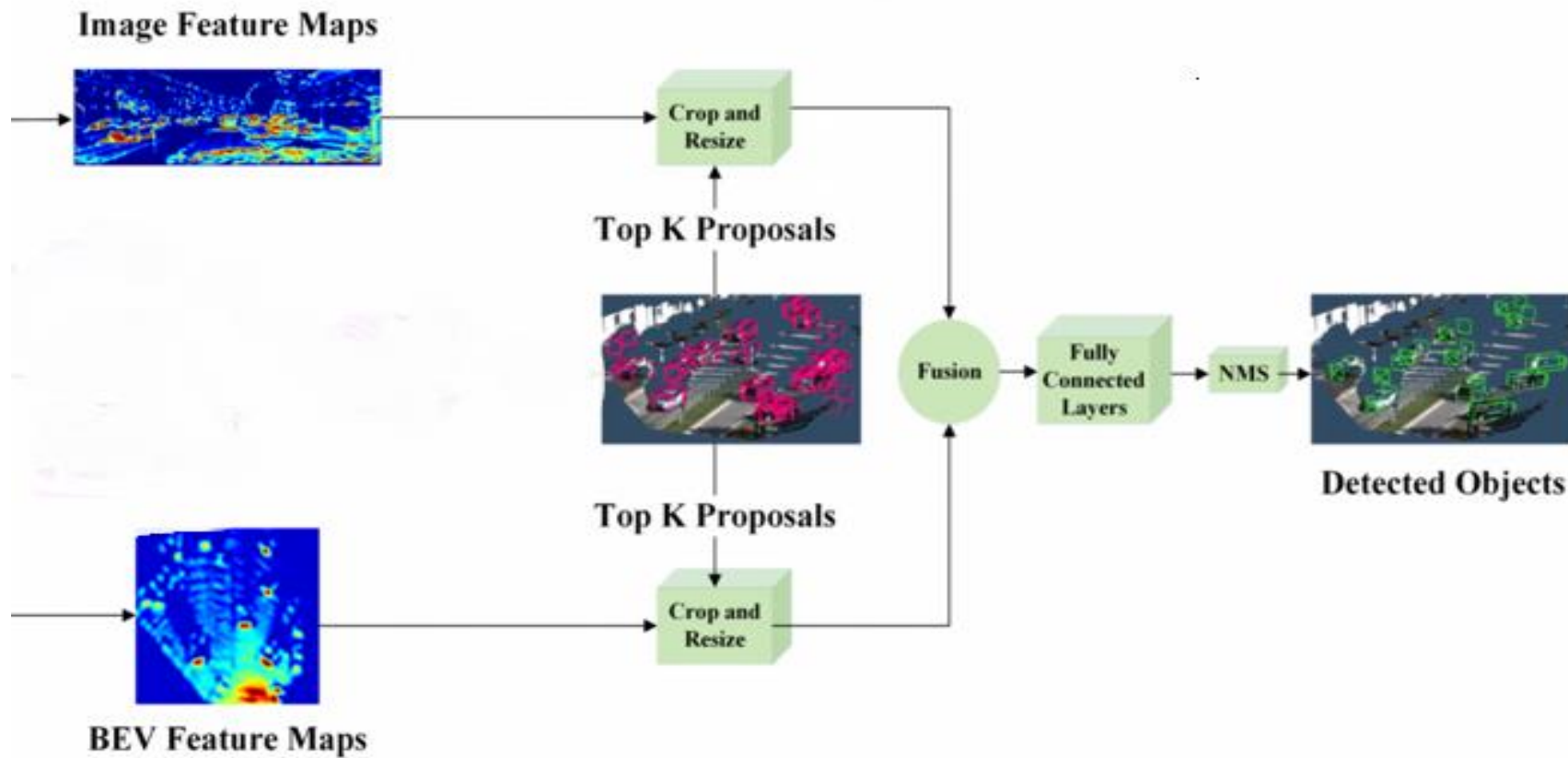
# Solutions

## 3D Proposal Generation

- Two sets of feature crops are fused (element-wise mean)
- Fed into fully connected layers to calculate object score and 3D box regression

# Solutions

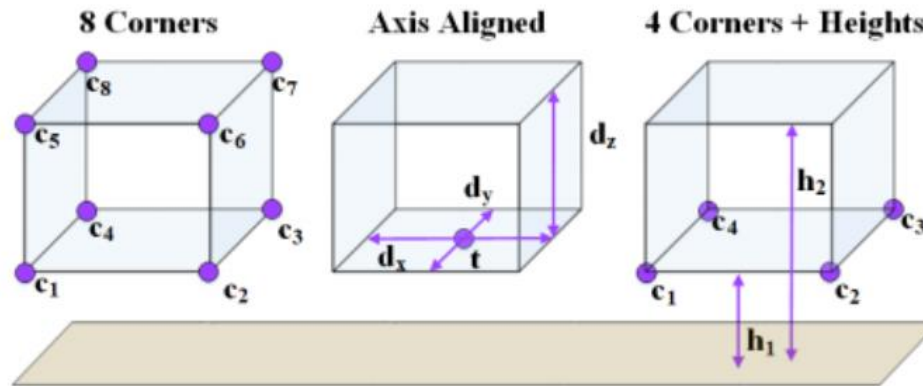
## Second Stage Detection



# Solutions

## Second Stage Detection

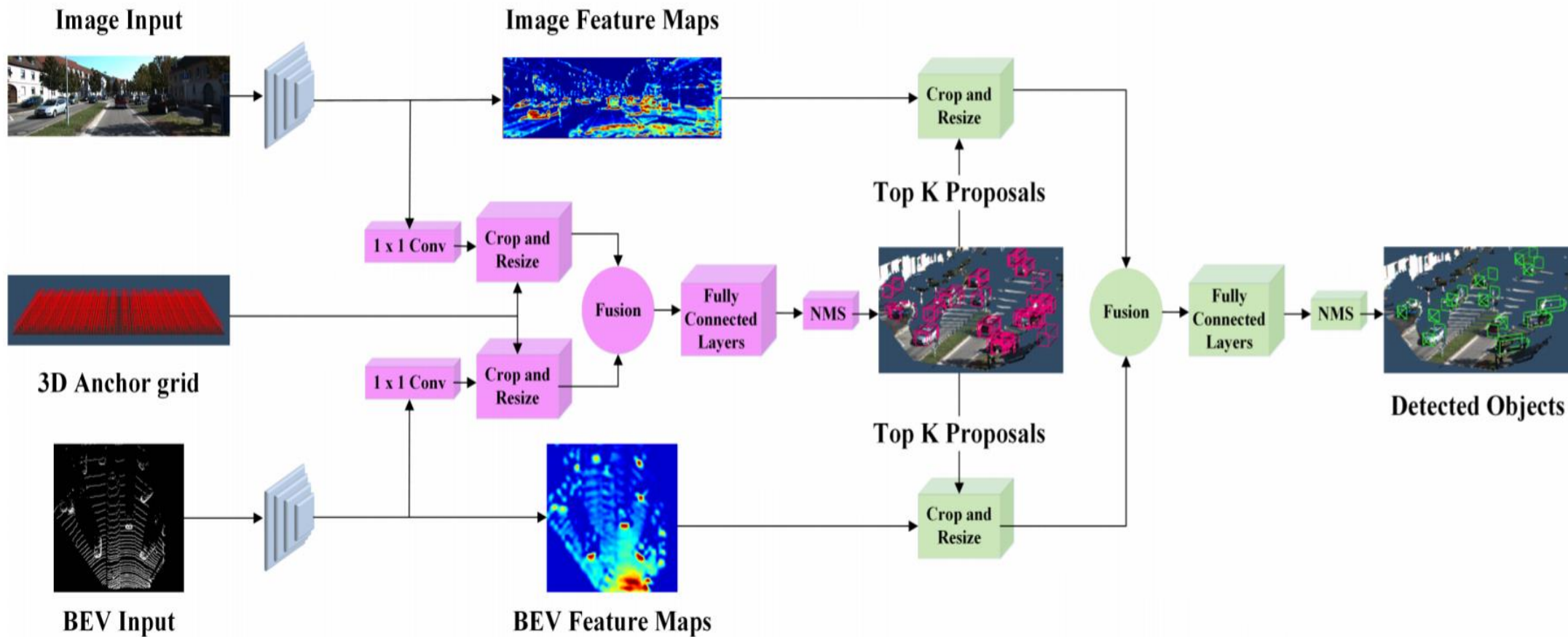
- 3D Bounding Box Encoding (8 corners to 4 corners+ heights)



- Orientation Vector Regression

# Solutions







## Overview










# Result






## Car

	Method	Setting	Code	Moderate	Easy	Hard	Runtime
1	<a href="#">AVOD-FPN</a>		<a href="#">code</a>	71.88 %	81.94 %	66.38 %	0.1 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
2	<a href="#">F-PointNet</a>			70.39 %	81.20 %	62.19 %	0.17 s
3	<a href="#">DF-PC CNN</a>			66.22 %	80.28 %	58.94 %	0.5 s
4	<a href="#">AVOD</a>		<a href="#">code</a>	65.78 %	73.59 %	58.38 %	0.08 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
5	<a href="#">VxNet(LiDAR)</a>			65.11 %	77.47 %	57.73 %	0.03 s
6	<a href="#">MV3D</a>			62.35 %	71.09 %	55.12 %	0.36 s

## Cyclist

	Method	Setting	Code	Moderate	Easy	Hard	Runtime
1	<a href="#">F-PointNet</a>			56.77 %	71.96 %	50.39 %	0.17 s
2	<a href="#">VxNet(LiDAR)</a>			48.36 %	61.22 %	44.37 %	0.03 s
3	<a href="#">AVOD-FPN</a>		<a href="#">code</a>	46.12 %	59.97 %	42.36 %	0.1 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
4	<a href="#">AVOD</a>		<a href="#">code</a>	44.90 %	60.11 %	38.80 %	0.08 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
5	<a href="#">LMNetV2</a>			3.23 %	2.84 %	3.28 %	0.02 s

## Pedestrian

	Method	Setting	Code	Moderate	Easy	Hard	Runtime
1	<a href="#">F-PointNet</a>			44.89 %	51.21 %	40.23 %	0.17 s
2	<a href="#">AVOD-FPN</a>		<a href="#">code</a>	39.00 %	46.35 %	36.58 %	0.1 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
3	<a href="#">VxNet(LiDAR)</a>			33.69 %	39.48 %	31.51 %	0.03 s
4	<a href="#">AVOD</a>		<a href="#">code</a>	31.51 %	38.28 %	26.98 %	0.08 s
J. Ku, M. Mozifian, J. Lee, A. Harakeh and S. Waslander: <a href="#">Joint 3D Proposal Generation and Object Detection from View A</a>							
5	<a href="#">3dSSD</a>			17.35 %	20.22 %	17.20 %	0.03 s
6	<a href="#">LMNetV2</a>			11.46 %	13.64 %	11.57 %	0.02 s