TABLE 3: Comparative 3D object detection results on the KITTI test BEV detection benchmark. 3D bounding box IoU threshold is 0.7 for cars and 0.5 for pedestrians and cyclists. The modalities are LiDAR (L) and image (I). 'E', 'M' and 'H' represent easy, moderate and hard classes of objects, respectively. For simplicity, we omit the '%' after the value. The symbol '-' means the results are unavailable. Pedestrians Speed Cars Cyclists Method Modality M Н M Н (fps) E H $\overline{\mathbf{E}}$ M E 2.8 86.62 78.93 69.80 MV3D [4] L & I 33.57 12.5 89.75 84.95 78.32 42.58 30.14 64.11 48.15 42.37 AVOD [97] L & I 16.7 75.88 Multi-view ContFuse [98] L & I 94.07 85.35 Methods L & I 12.5 88.21 81.99 MMF [99] 93.67 90.33 82.85 SCANet [102] L & I 11.1 76.06 RT3D [103] L & I 11.1 56.44 44.00 42.34 49.79 45.43 78.19 Segmentation IPOD [104] L & I 5.0 89.64 84.62 79.96 60.88 59.40 51.38 -based 10.0 92.13 87.39 82.72 54.77 46.13 42.84 82.56 67.24 60.28 PointRCNN [105] L Region Methods PointRGCN [106] L 3.8 91.63 87.49 80.73 Proposal PointPainting [107] 2.5 92.45 83.36 58.70 49.93 46.29 83.91 71.54 62.97 L & I 88.11 -based STD [110] L 12.5 94.74 89.19 86.42 60.02 48.72 44.55 81.36 67.23 59.35 Methods F-PointNets [112] L & I 5.9 91.17 84.67 74.77 57.13 49.57 45.48 77.26 61.37 53.78 L & I SIFRNet [113]

10.0

2.1

6.7

12.5

16.7

12.5

28.6

20.0

9.1

1.0

< 0.2

7.7

2.0

26.3

16.7

62.0

83.3

26.3

88.20

91.51

92.72

91.36

90.76

91.70

83.97

89.14

76.88

0.02

70.62

89.66

89.35

89.39

92.13

90.07

79.19

79.41

85.84

88.39

86.22

85.61

87.79

80.01

86.57

51.51

0.14

61.67

83.94

79.26

83.77

86.05

86.56

74.52

70.02

76.11

83.19

81.20

79.99

84.61

74.31

78.32

50.27

0.21

55.61

76.50

77.39

78.59

78.68

82.81

68.45

57.04

20.73

46.13

55.99

57.60

48.96

15.80

40.74

45.02

48.64

44.33

14.59

38.11

40.93

45.78

84.16

81.91

36.01

66.70

76.50

79.90

68.88

68.12

23.78

54.76

56.05

62.73

60.05

61.92

21.09

50.55

49.45

55.58

-base Metho

Single

Shot

Methods

Frustum

-based

Methods

Other Methods

BEV-based

Methods

Point

Cloud

-based

Methods

Other

Methods

PointFusion [116]

F-ConvNet [111]

Patch

Refinement [118]

3D IoU loss [119]

Fast Point

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Feng et al. [123]

Part-A² [124]

HDNET [128]

BirdNet [129]

VeloFCN [125]

3D FCN [126]

3DBN [130]

Vote3Deep [127]

VoxelNet [108]

SECOND [120]

MVX-Net [131]

LaserNet [132]

PointPillars [109]

LaserNet++ [133]

PIXOR [100]

RoarNet [117]

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