SeaBird: Segmentation in Bird's View Improves Mono3D of Large Objects (CVPR2024)





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Large Object Detection is Harder

A Tesla driver was killed after smashing into a firetruck on a California highway

February 20, 2023 · 4:42 PM ET By Roshan Fernandez



Courtesy: https://www.npr.org/2023/02/20/1158367204/tesla-driver -killed-california-firetruck-nhtsa

Most accidents involve large objects.

2 die when Tesla crashes into parked tractor-trailer in Florida

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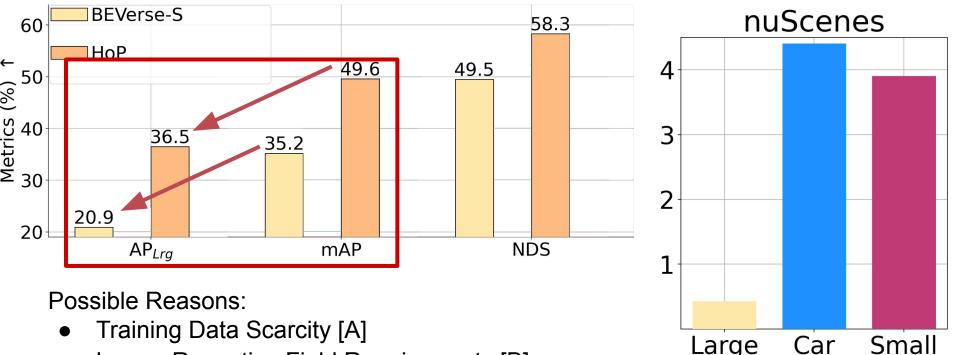
By Brittany Caldwell, WFTV.com July 08, 2022 at 5:29 pm EDT



Courtesy:

https://www.wftv.com/news/local/2-die-when-tesla-crashe s-into-parked-tractor-trailer-florida/KJGMHHYTQZA2HNA HWL2OFSVIPM/

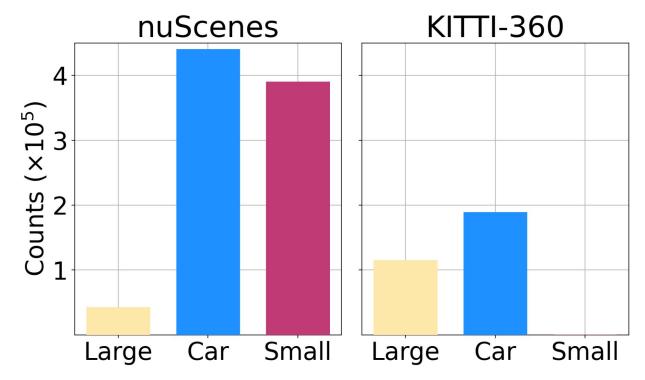
Large Object Detection is Harder



Larger Receptive Field Requirements [B]

[A] Zhu et al., CBGS for point cloud 3D detection, CVPR Workshop 2019[B] Chen Wu, Waymo Keynote Talk, CVPR Workshop on Autonomous Driving 2023

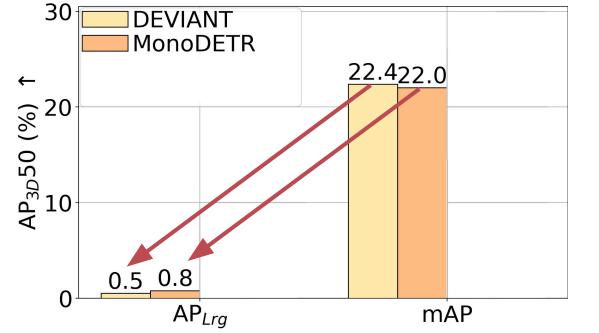
Is Data Scarcity the Real Reason?



• KITTI-360 nearly balanced ratio of Large : Cars = 1:2

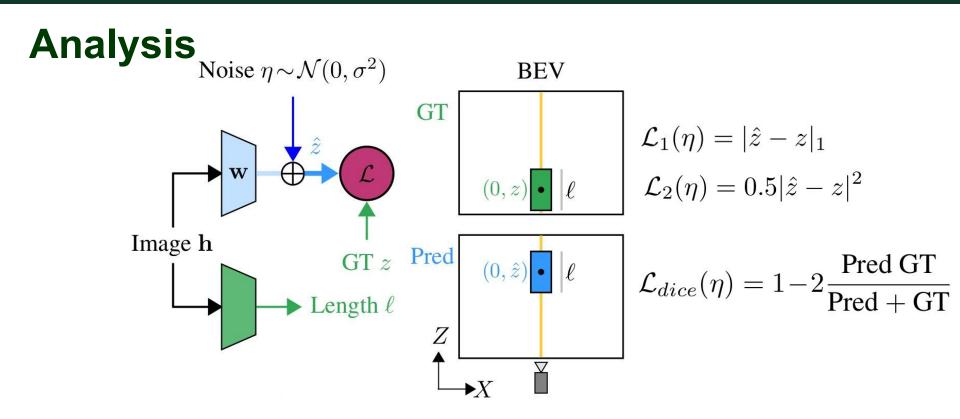
Liao et al, KITTI-360, TPAMI 2022

Is Data Scarcity the Real Reason?



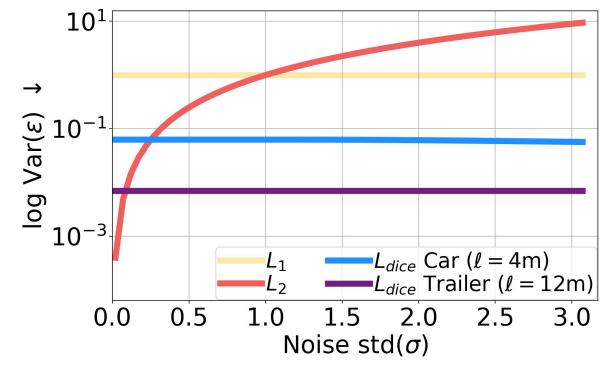
- SoTA Frontal KITTI detectors bad even on balanced KITTI-360 dataset.
- Data scarcity is NOT the only reason.

Zhang et al., MonoDETR: Depth guided transformer for Mono3D, ICCV 2023 Kumar et al., DEVIANT: Depth Equivariant Network for Mono3D, ECCV 2022



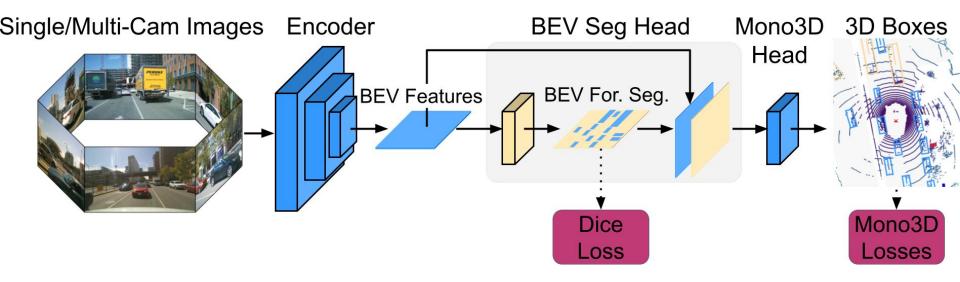
- Performance = function(Representation, Loss, Noise)
- Mono3D networks sensitive to large noise from larger objects.

Analysis



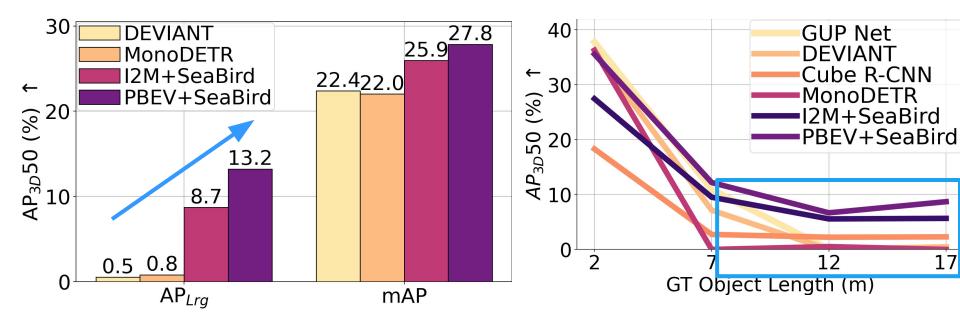
Dice loss > Regression losses under large noise (large objects).

SeaBird Pipeline



- Train BEV Segmentation first with Dice Loss
- Finetune BEV Segmentation + Mono3D

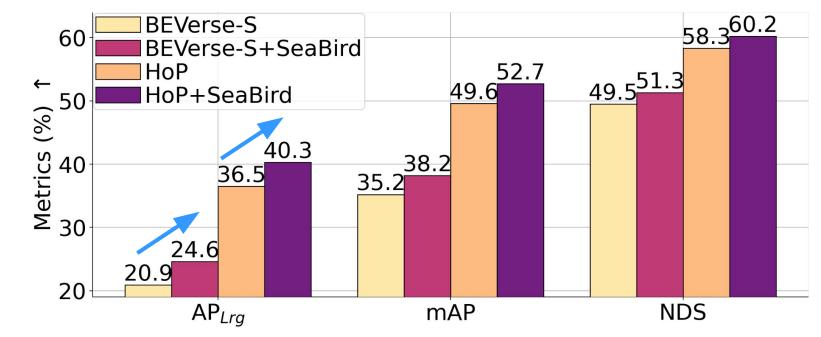
KITTI-360 (Single-Camera) Results



- SoTA on KITTI-360
- Outperforms frontal detectors and also old LiDAR detectors

Zhang et al., MonoDETR: Depth guided transformer for Mono3D, ICCV 2023 Kumar et al., DEVIANT: Depth Equivariant Network for Mono3D, ECCV 2022

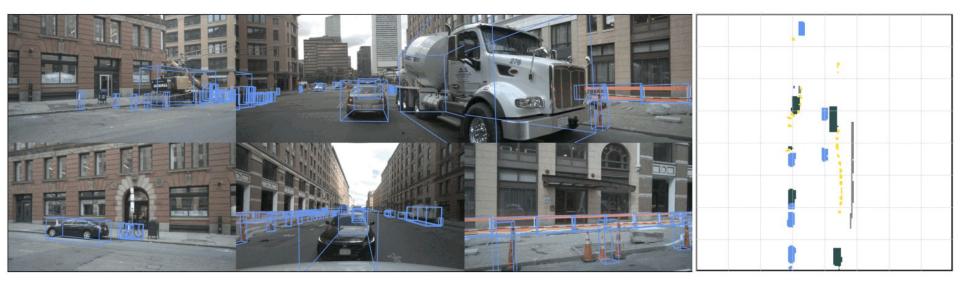
nuScenes (Multi-Camera) Results



- SoTA on nuScenes
- Outperforms BEV-based detectors

Zong et al., Temporal enhanced training of multi-view 3D object detector via historical object prediction, ICCV 2023 Zhang et al., BEVerse: Unified perception and prediction in birds-eye-view for vision-centric autonomous driving, arXiv 2022

SeaBird Demo



Conclusions

- Large Object Detection = Representation (Front / BEV) + Loss
- Frontal detectors even with transformers do not work
- BEV detectors sub-optimal, improved by noise-robust Dice loss
- Dice loss > Regression losses under large noise (large objects)









Support



Project Website



Demo



Code

