



VisDA-17

Visual Domain Adaptation Challenge

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10/29/017





Domain Adaptation

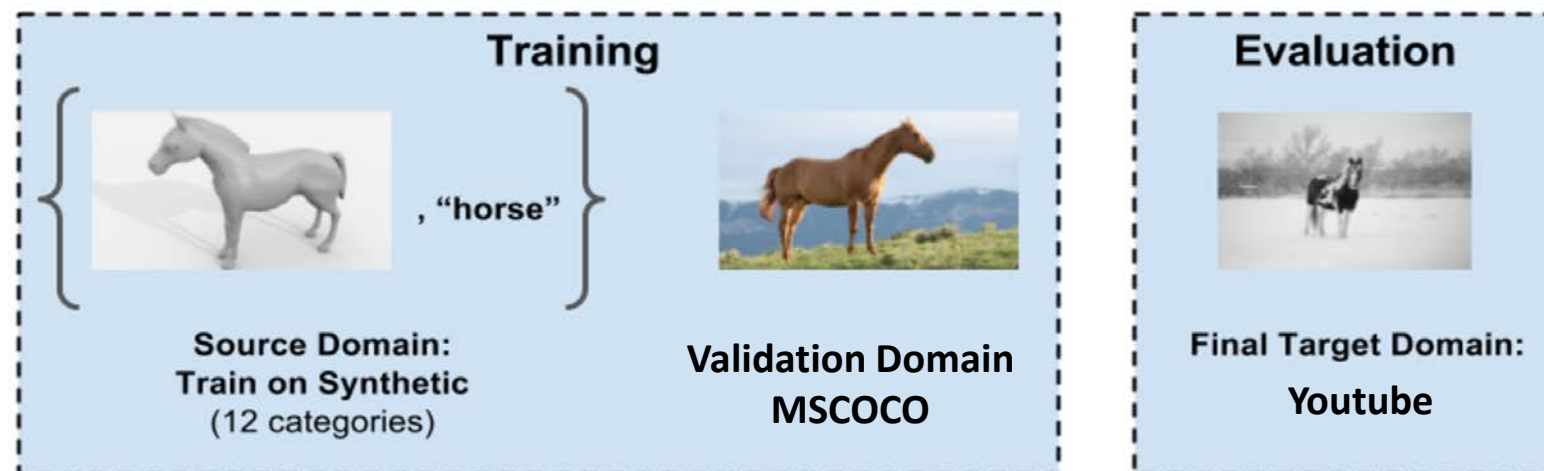
ICCV2017 Workshop
Challenge

Evaluation servers go live
June 23rd

Final submission
September 29th

Winners notified
October 13th

Classification Track

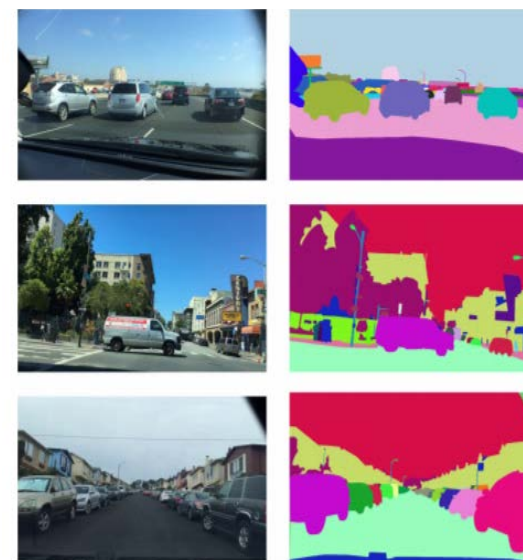


Semantic Segmentation Track

Source: Grand Theft Auto



Test: NEXAR real dashcam



Validation: CityScapes Real Dashcam



CAD Model Libraries



ShapeNet



SHREC 3D



SketchUp



NTU 3D

CAD Models



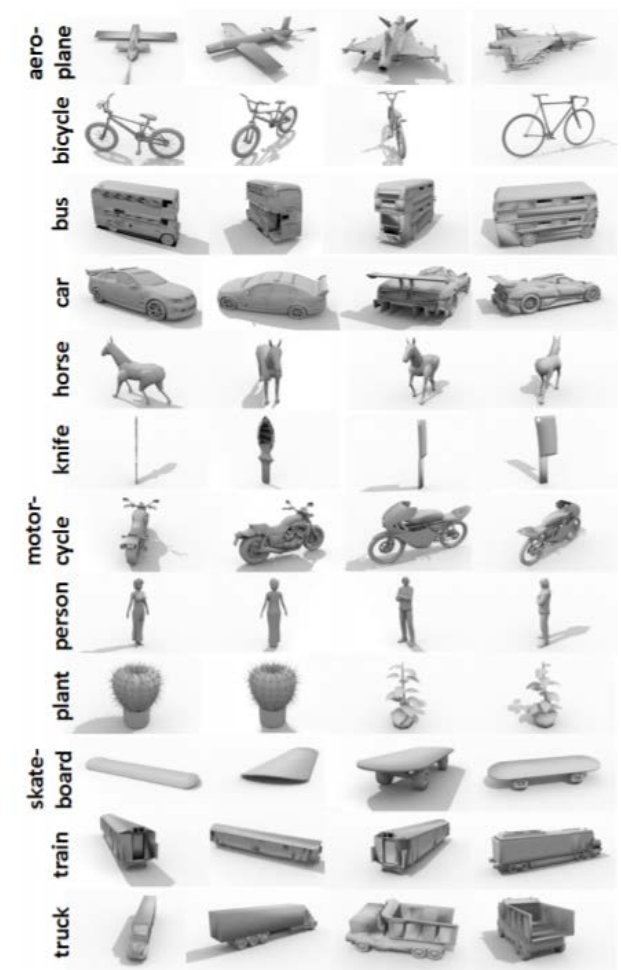
3,466 CAD models
12 Categories

Blender Rendering



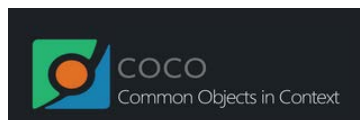
Per model, we have
20 different viewpoints
4 lighting conditions

Synthetic Images



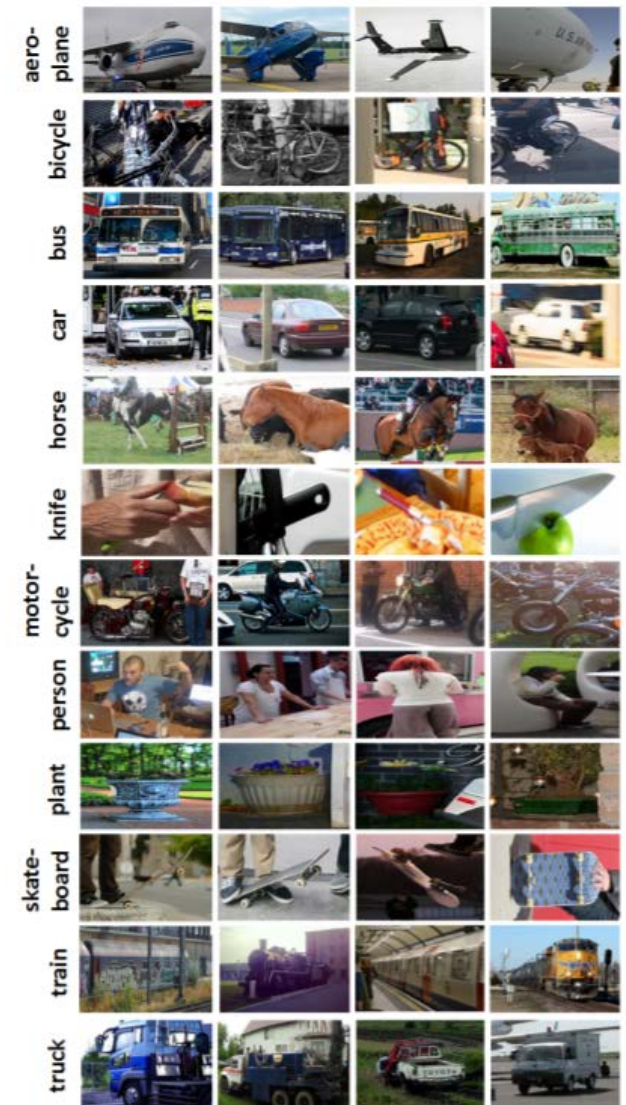
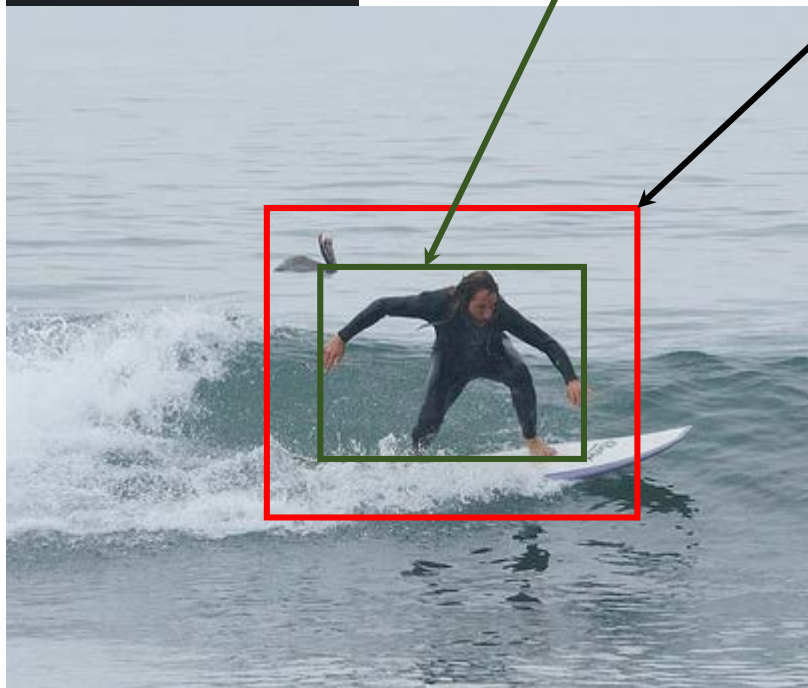
152,397 Images

- Cropped from COCO dataset
- Padded by retaining an additional 50% of its cropped height and weight
- Padded images under 70x70 pixels were excluded
- 55,388 Images in total



Bounding box annotation

Our Cropping



55,388 Images

Data Generation – Classification Testing

2017 VisDA Challenge
sponsored by



- Cropped from YouTube BBox dataset
- Padded by retaining an additional 50% of its cropped height and weight
- Padded images under 70x70 pixels were excluded
- 72,372 frame Images in total

YouTube BoundingBoxes



Bounding box annotation

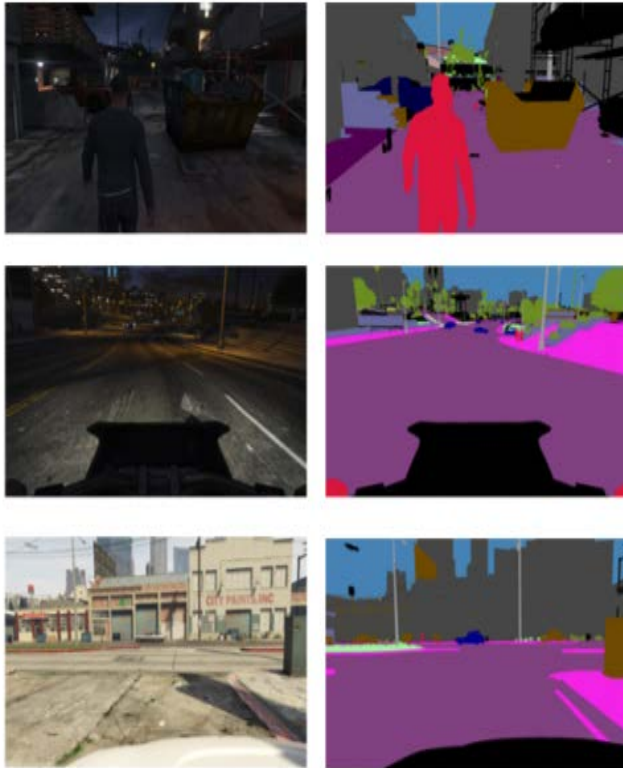
Our Cropping



72,372 Images

Category	Training		Validation	Testing
	Models	Images	Images	Images
aeroplane	179	14,309	3,646	5,196
bicycle	93	7,365	3,475	4,272
bus	208	16,640	4,690	6,970
car	160	12,800	10,401	7,280
horse	119	9,512	4,691	6,331
knife	178	14,240	2,075	5,491
motorcycle	217	17,360	5,796	8,079
person	152	12,160	4,000	7,673
plant	135	10,371	4,549	4,287
skateboard	146	11,680	2,281	2,762
train	200	16,000	4,236	7,264
truck	120	9,600	5,548	6,767
total	1,907	152,397	55,388	72,372

Training – Synthetic GTA5



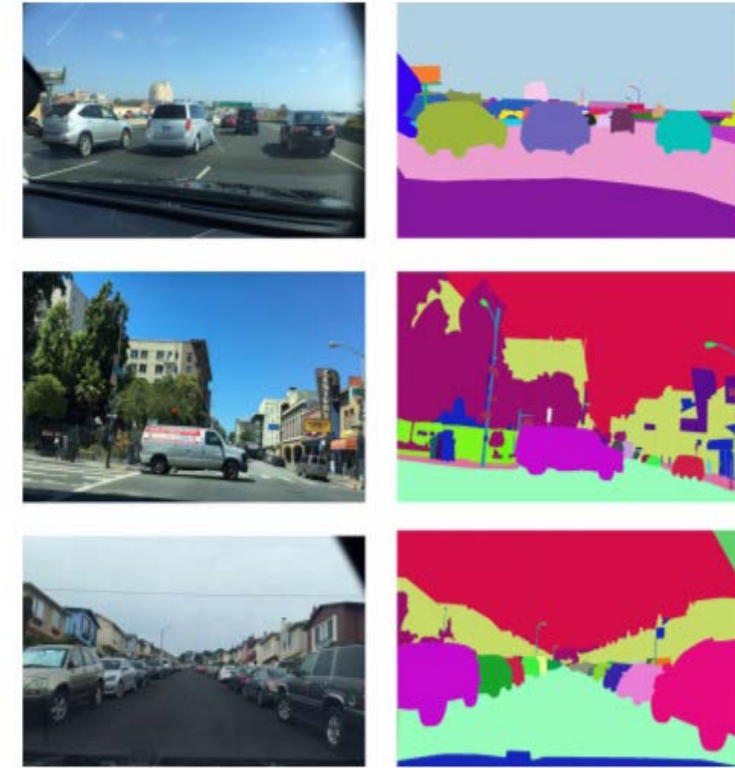
24,966 high quality labeled frames from open-world computer game, GTA 5

Validation - CityScapes



5,000 images

NEXAR DashCam Images



1,500 images

	Classification	Segmentation
#Participated Team	42 teams	45 teams
Submissions	242	167
Train/val data release	June 19, 2017	
Test data release	Sept. 8, 2017	
Challenge ended	September 29th, 11:59pm ET	

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Competition Website: <http://ai.bu.edu/visda-2017/>

Evaluation Server will remain open

VisDA17 Tech Report:

```
@article{peng2017visda,  
  title={VisDA: The Visual Domain Adaptation Challenge},  
  author={Peng, Xingchao and Usman, Ben and Kaushik, Neela and Hoffman, Judy and Wang, Dequan and Saenko, Kate},  
  journal={arXiv preprint arXiv:1710.06924},  
  year={2017}  
}
```

Leaderboard TOP 5 results

Leaderboard: ImageNet Pretraining		CAD->Real Classification Track														
#	User	Team Name	Per Category Accuracy												MeanAcc	
			plane ▲	bcycl ▲	bus ▲	car ▲	horse ▲	horse ▲	mcycl ▲	person ▲	plant ▲	sktbd ▲	train ▲	truck ▲	s ▲	a ▲
1	GF_ColourLab_UEA		96.9	92.4	92.0	97.2	95.2	98.8	86.3	75.3	97.7	93.3	94.5	93.3	45.3	92.8 47.5
2	NLE_DA		94.3	86.5	86.9	95.1	91.1	90.0	82.1	77.9	96.4	77.2	86.6	88.0	64.3	87.7 23.4
3	BUPT_OVERFIT	BUPT_OVERFIT	95.7	67.0	93.4	97.2	90.6	86.9	92.0	74.2	96.3	66.9	95.2	69.2	63.2	85.4 22.2
4	MIL	UTokyo_MIL	90.2	84.1	85.4	96.7	89.2	59.5	79.4	75.9	95.8	61.2	91.4	80.3	41.2	82.4 41.2
5	Yifei	ETH_CVL	89.0	65.7	86.9	92.3	78.3	67.1	97.1	64.8	88.4	70.6	91.4	85.4	81.4	81.4

Leaderboard: ImageNet Pretraining			GTA->Real Segmentation Track																				
#	User	Team Name	Per Category IoU																			MeanIoU	
			road ▲	sdwlk ▲	bldng ▲	wall ▲	fence ▲	pole ▲	light ▲	sign ▲	vgttn ▲	trrn ▲	sky ▲	person ▲	rider ▲	car ▲	truck ▲	bus ▲	train ▲	mcycl ▲	bcycl ▲	s ▲	a ▲
1	RTZH	MSRA	87.0	38.5	74.7	23.7	30.5	41.1	45.2	36.9	72.1	32.6	90.4	55.9	26.8	80.0	23.4	25.1	28.7	44.6	46.0	35.6	47.5
2	_piotr_		85.3	42.4	53.4	17.3	31.5	39.0	45.6	29.1	77.1	27.3	61.7	57.8	46.1	75.5	27.5	36.4	26.3	51.1	18.1	0.1	44.7
3	whung	VLLAB	87.2	33.3	70.2	13.6	27.8	29.3	32.9	27.9	77.2	28.6	90.3	47.0	35.7	78.0	24.8	18.0	9.1	37.4	38.1	30.3	42.4
4	yuhchen		85.7	36.0	75.4	22.6	25.5	23.9	28.8	18.0	75.6	34.6	90.0	50.8	26.0	77.0	27.1	25.3	6.9	47.4	12.1	34.5	41.5
5	yzou2	CMU_Tartan	87.8	37.4	72.0	24.2	32.4	31.9	32.9	28.7	75.6	33.8	91.8	51.1	6.2	74.1	23.5	1.0	6.1	34.8	0.4	29.8	39.3

Third place

Beijing University of Posts and Telecommunications

*Zhiqun He***

Source 63.2 Adapted 85.4

Second place

Naver Labs Europe

Stéphane Clinchant, Gabriela Csurka, Boris Chidlovskii

Source 64.3 Adapted 87.7

First place

Colour Lab at University of East Anglia

Geoffry French

Source 45.3 Adapted 92.8

Third place

Vision and Learning Lab at U.C. Merced

Wei-Chih Hung, Yi-Hsuan Tsai, Ming-Hsuan Yang

Source 30.3 Adapted 42.4

Second place

Active Vision Lab at Oxford University

Piotr Bilinski, Victor Prisacariu

Source – Adapted 44.7

First place

Multimedia Search and Mining group at MSRA

*Yiheng Zhang, Zhaofan Qiu, Ting Yao, Tao Mei ***

Source 35.6 Adapted 47.5