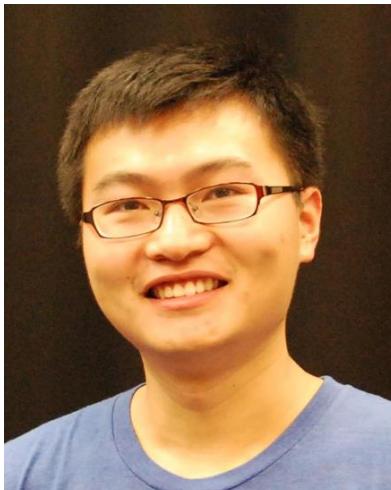


# IMAGENET Large Scale Visual Recognition Challenge (ILSVRC) 2017

## Overview



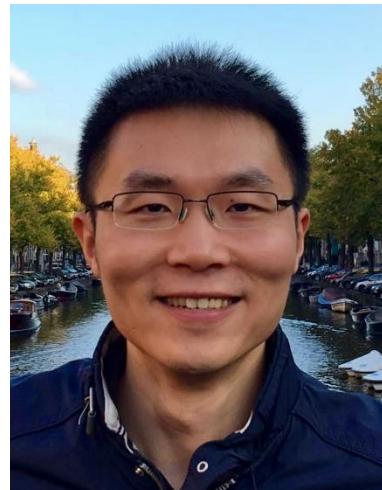
Eunbyung Park  
UNC Chapel Hill



Wei Liu  
UNC Chapel Hill



Olga Russakovsky  
CMU/Princeton



Jia Deng  
Univ. of Michigan



Fei-Fei Li  
Stanford

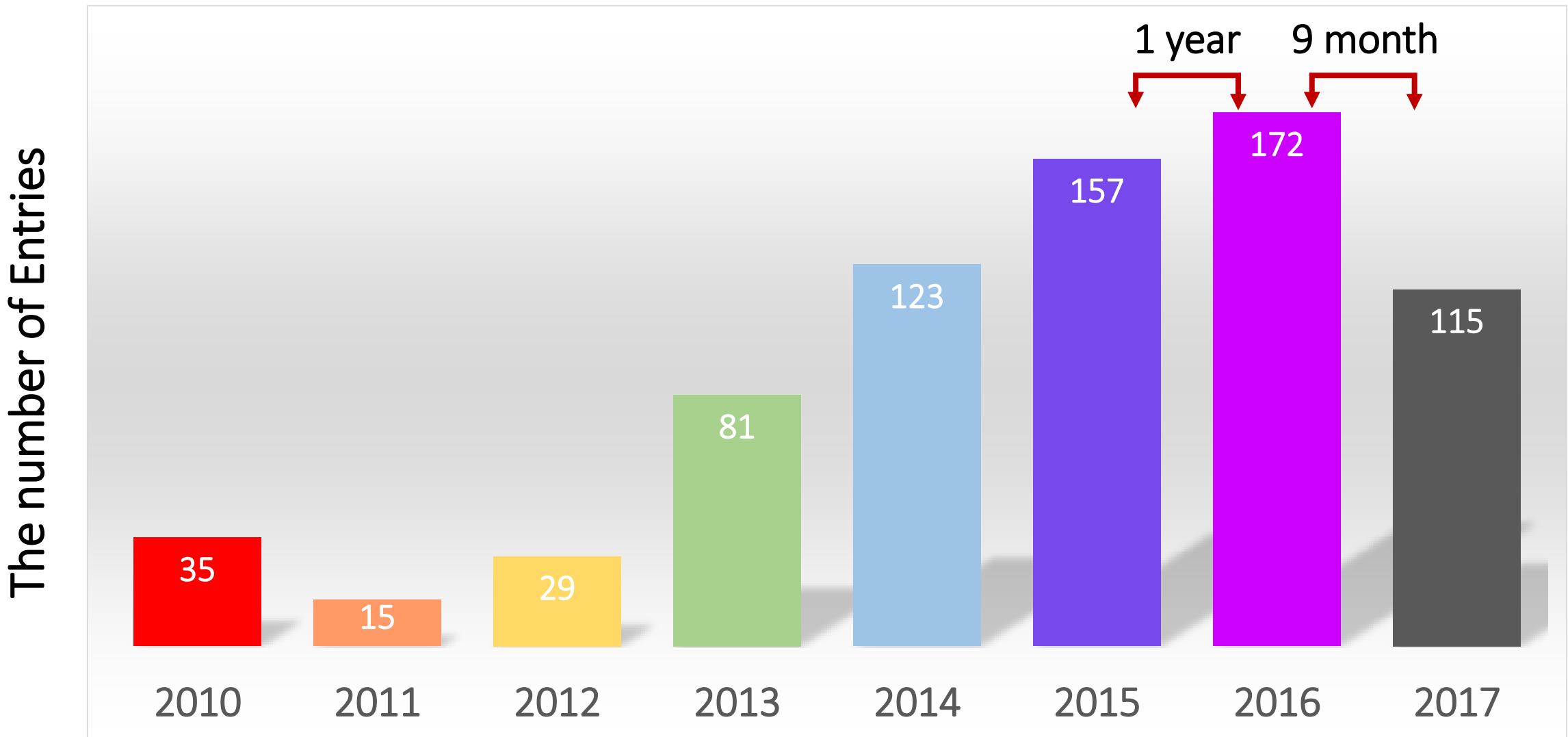


Alex Berg  
UNC Chapel Hill

# Agenda

1. Participation over the years
2. LOC+CLS Task – Results
3. DET Task – Results
4. VID Task – Results

# Participation in ILSVRC over the years



# ILSVRC Image Classification (CLS) Task

Steel drum



1000 object classes

1,431,167 images

CLS-LOC

# ILSVRC Image Classification (CLS) Task

Steel drum



**Output:**

- Scale
- T-shirt
- Steel drum
- Drumstick
- Mud turtle



**Output:**

- Scale
- T-shirt
- Giant panda
- Drumstick
- Mud turtle



$$\text{Error} = \frac{1}{100,000} \sum_{\substack{100,000 \\ \text{images}}} 1[\text{incorrect on image } i]$$

# ILSVRC Image Localization (LOC) Task

Steel drum



# ILSVRC Image Localization (LOC) Task

Steel drum



Correct



Bad localization

✗



Bad classification



# ILSVRC Image Localization (LOC) Task

Steel drum

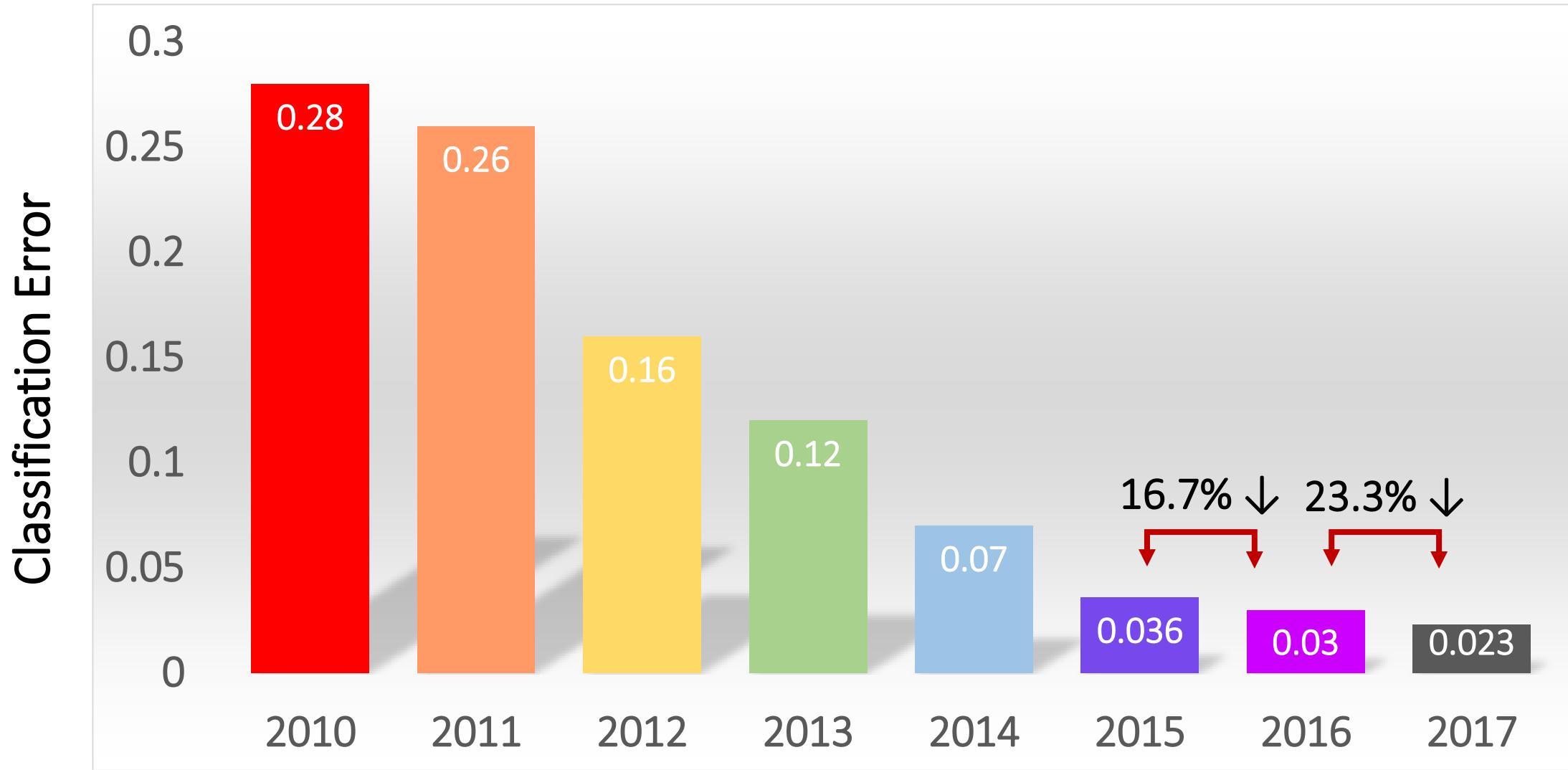


Correct

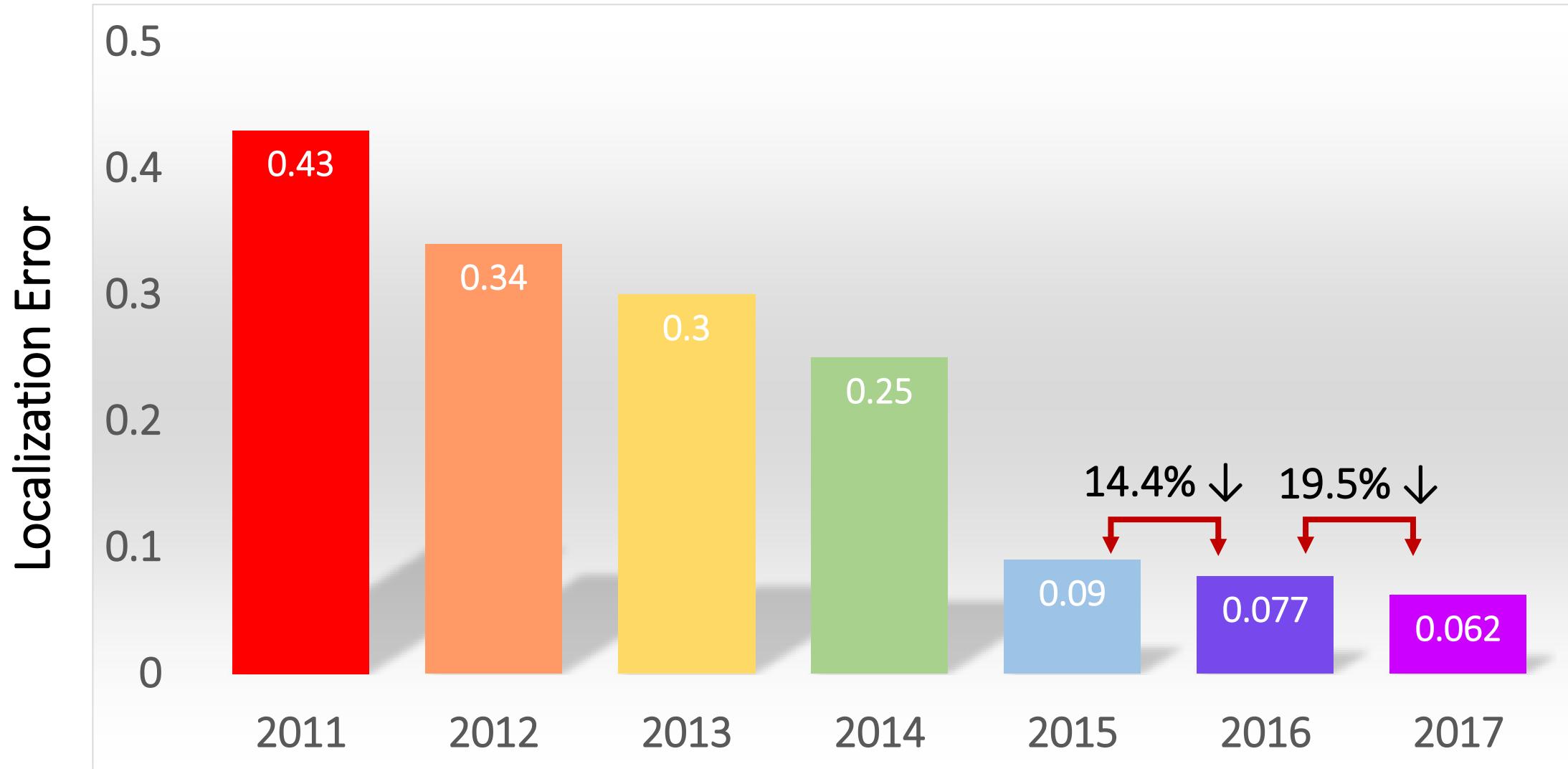


$$\text{Error} = \frac{1}{100,000} \sum_{\substack{100,000 \\ \text{images}}} 1[\text{incorrect on image } i]$$

# Classification Results (CLS)



# Localization Results (LOC)



# ILSVRC2017 CLS Results - ‘Provided’ Data

Team Name	Error(%)
WMW	0.0225
Trimps-Soushen	0.0248
NUS-Qihoo_DPNs	0.0274
BDAT	0.0296

**WMW**  
Jie Hu<sup>1</sup> , Li Shen<sup>2</sup> , Gang Sun<sup>1</sup>  
1. *Momenta*  
2. *Universify of Oxford*

**Trimps-Souchen**  
Xiaoteng Zhang, Zhengyan Ding, Jianying Zhou, Jie Shao, Lin Mei  
*The Third Research Institute of the Ministry of Public Security, P.R. China.*

# ILSVRC2017 CLS Results - ‘External’ Data

Team Name	Error(%)
NUS-Qihoo_DPNs	0.0271
BDAT	0.0300

## NUS-Qihoo\_DPNs

Yunpeng Chen<sup>1</sup>, Huixin Xiao<sup>1</sup>, Jianan Li<sup>1</sup>, Xuecheng Nie<sup>1</sup>, Xiaojie Jin<sup>1</sup>, Jianshu Li<sup>1</sup>, Jiashi Feng<sup>1</sup>, Jian Dong<sup>2</sup>, Shuicheng Yan<sup>2</sup>

1. NUS - National University of Singapore
2. Qihoo 360

## BDAT

Hui Shuai<sup>1</sup>, Zhenbo Yu<sup>1</sup>, Qingshan Liu<sup>1</sup>, Xiaotong Yuan<sup>1</sup>, Kaihua Zhang<sup>1</sup>, Yisheng Zhu<sup>1</sup>, Guangcan Liu<sup>1</sup>, Jing Yang<sup>1</sup>, Yuxiang Zhou<sup>2</sup>, Jiankang Deng<sup>2</sup>

1. Nanjing University of Information Science & Technology
2. Imperial College London

# ILSVRC2017 LOC Results - 'Provided' Data

Team Name	Error(%)
NUS-Qihoo_DPNs	0.0623
Trimps-Soushen	0.0650
BDAT	0.0814
SIIT_KAIST-SKT	0.1290

## NUS-Qihoo\_DPNs

Yunpeng Chen<sup>1</sup>, Huixin Xiao<sup>1</sup>, Jianan Li<sup>1</sup>, Xuecheng Nie<sup>1</sup>, Xiaojie Jin<sup>1</sup>, Jianshu Li<sup>1</sup>, Jiashi Feng<sup>1</sup>, Jian Dong<sup>2</sup>, Shuicheng Yan<sup>2</sup>

1. NUS - National University of Singapore
2. Qihoo 360

## Trimps-Souchen

Xiaoteng Zhang, Zhengyan Ding, Jianying Zhou, Jie Shao, Lin Mei

*The Third Research Institute of the Ministry of Public Security, P.R. China.*

# ILSVRC2017 LOC Results - ‘External’ Data

Team Name	Error(%)
NUS-Qihoo_DPNs	0.0619
BDAT	0.0875

## NUS-Qihoo\_DPNs

Yunpeng Chen<sup>1</sup>, Huixin Xiao<sup>1</sup>, Jianan Li<sup>1</sup>, Xuecheng Nie<sup>1</sup>, Xiaojie Jin<sup>1</sup>, Jianshu Li<sup>1</sup>, Jiashi Feng<sup>1</sup>, Jian Dong<sup>2</sup>, Shuicheng Yan<sup>2</sup>

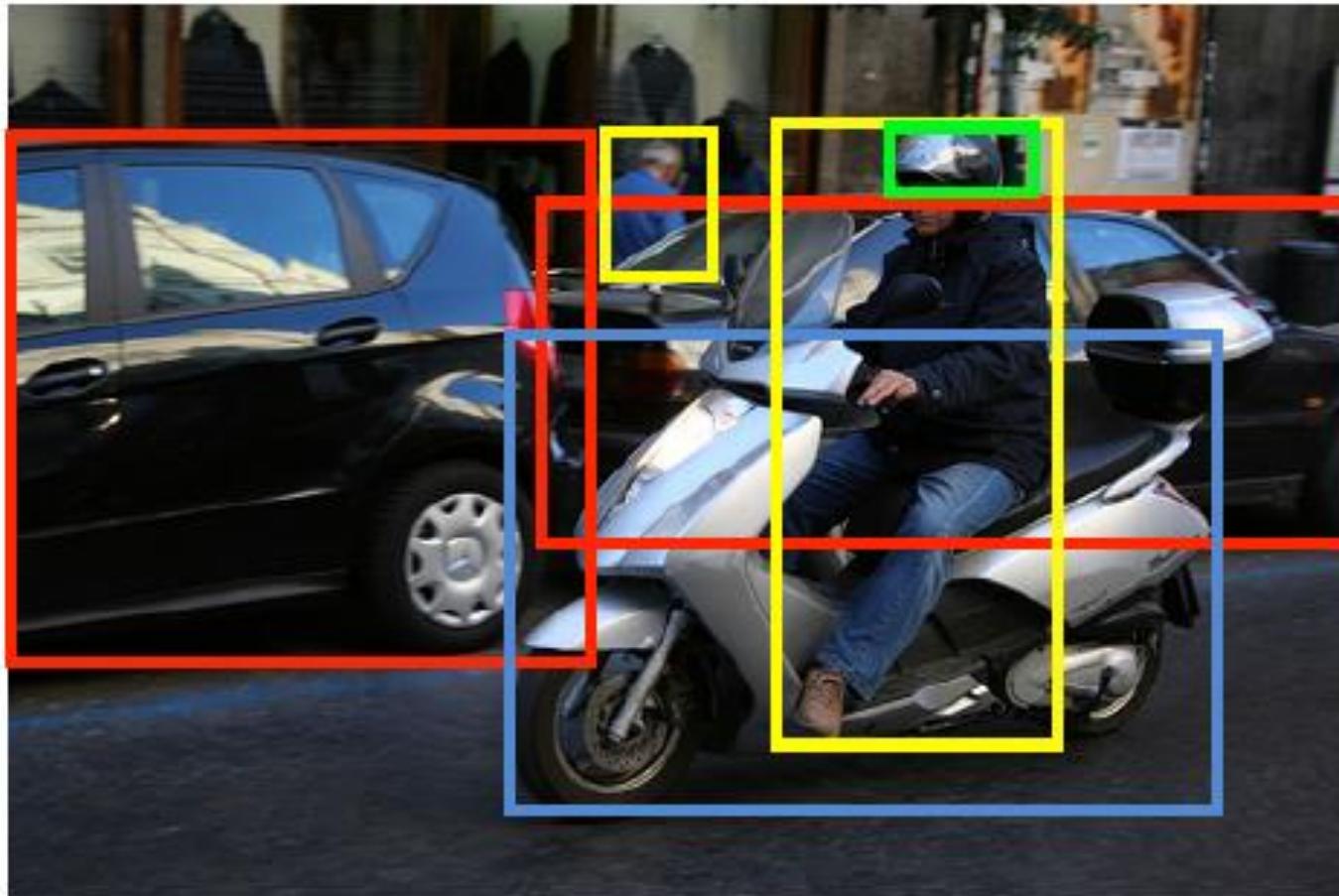
1. NUS - National University of Singapore
2. Qihoo 360

## BDAT

Hui Shuai<sup>1</sup>, Zhenbo Yu<sup>1</sup>, Qingshan Liu<sup>1</sup>, Xiaotong Yuan<sup>1</sup>, Kaihua Zhang<sup>1</sup>, Yisheng Zhu<sup>1</sup>, Guangcan Liu<sup>1</sup>, Jing Yang<sup>1</sup>, Yuxiang Zhou<sup>2</sup>, Jiankang Deng<sup>2</sup>

1. Nanjing University of Information Science & Technology
2. Imperial College London

# ILSVRC Object Detection (DET) Task



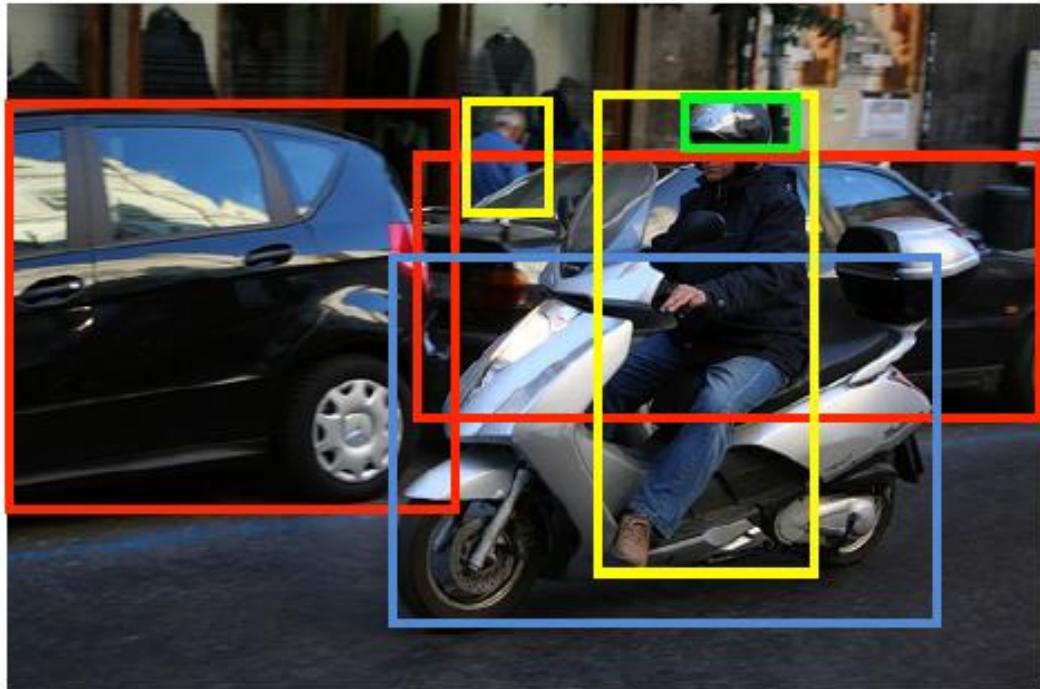
Person  
Car  
Motorcycle  
Helmet

200 object classes

578,482 images

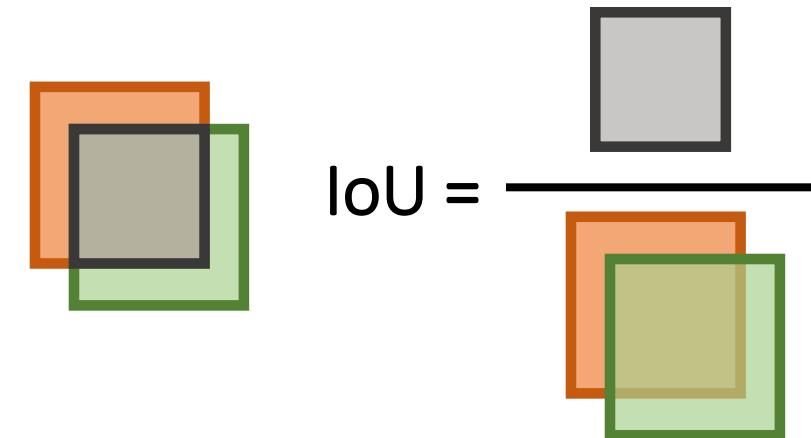
DET

# ILSVRC Object Detection (DET) Task

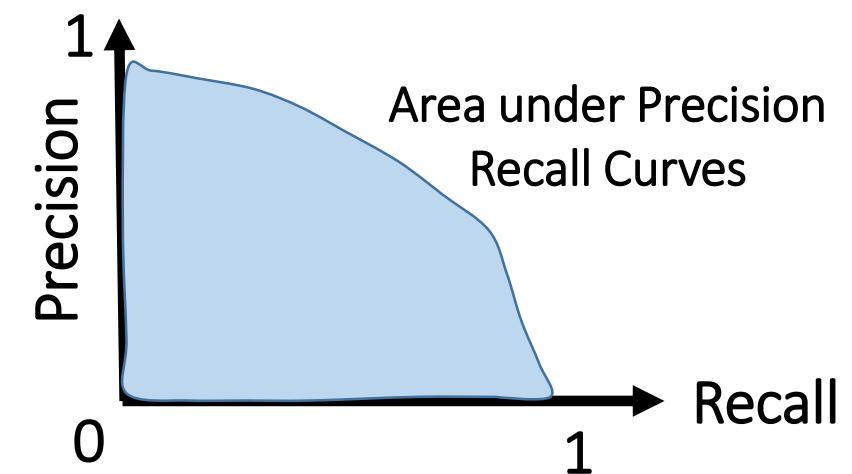


This year: 5,500 new test images with  
bounding boxes fully annotated

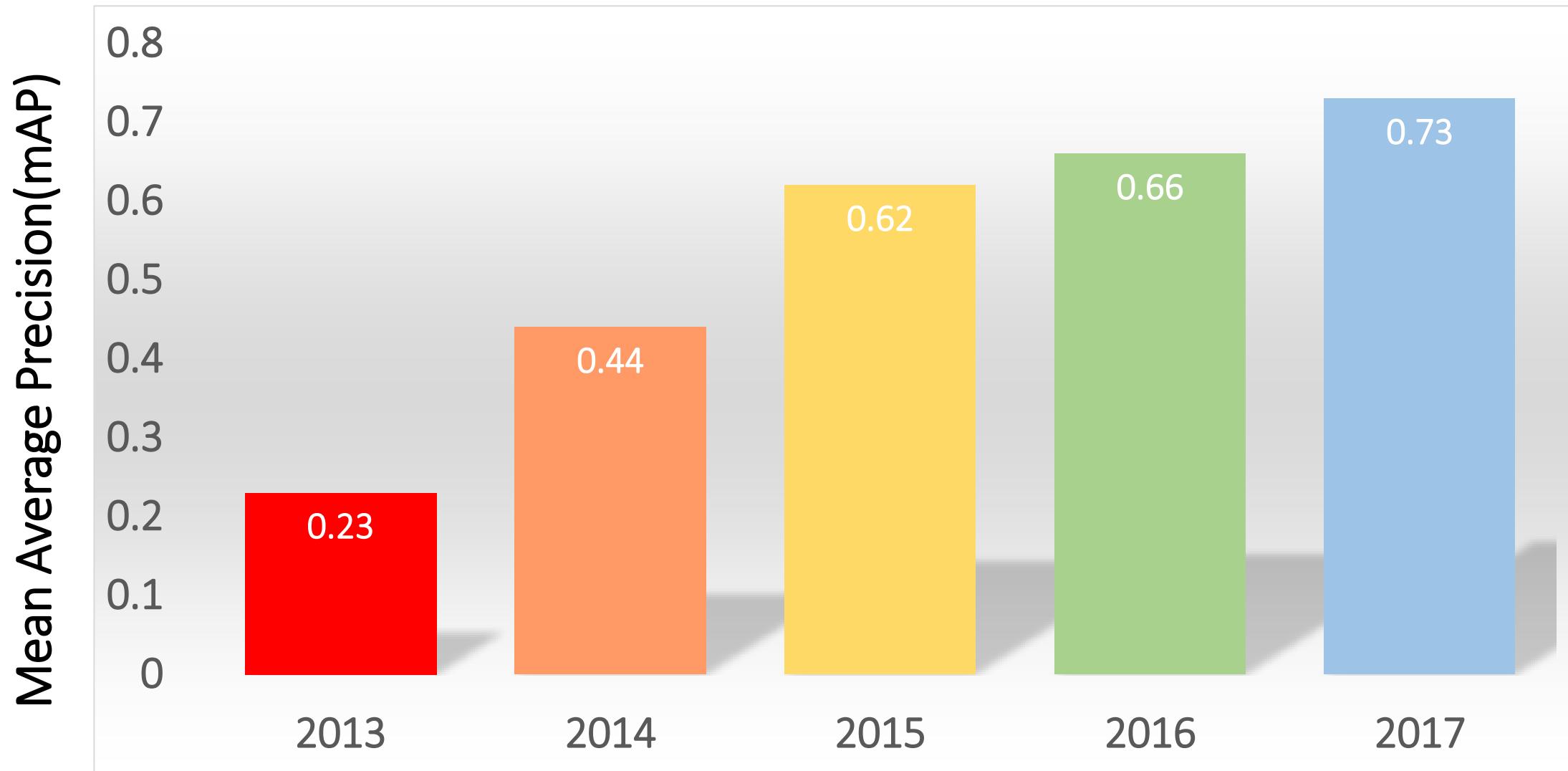
Boxes are correct if  $\text{IoU} > 0.5$



Average Precision



# Detection Results (DET)



# ILSVRC2017 DET Results - ‘Provided’ Data

Team Name	#category won	mAP(%)
BDAT	85	0.732
NUS-Qihoo_DPNs	9	0.657
VIST	10	0.593
KAISTNIA_ETRI	1	0.610

**BDAT**  
Hui Shuai<sup>1</sup>, Zhenbo Yu<sup>1</sup>, Qingshan Liu<sup>1</sup>,  
Xiaotong Yuan<sup>1</sup>, Kaihua Zhang<sup>1</sup>, Yisheng  
Zhu<sup>1</sup>, Guangcan Liu<sup>1</sup>, Jing Yang<sup>1</sup>, Yuxiang  
Zhou<sup>2</sup>, Jiankang Deng<sup>2</sup>  
1. *Nanjing University of Information  
Science & Technology*  
2. *Imperial College London*

**NUS-Qihoo\_DPNs**  
Yunpeng Chen<sup>1</sup>, Huixin Xiao<sup>1</sup>, Jianan Li<sup>1</sup>,  
Xuecheng Nie<sup>1</sup>, Xiaojie Jin<sup>1</sup>, Jianshu Li<sup>1</sup>,  
Jiashi Feng<sup>1</sup>, Jian Dong<sup>2</sup>, Shuicheng Yan<sup>2</sup>  
1. *NUS - National University of Singapore*  
2. *Qihoo 360*

# ILSVRC2017 DET Results - ‘External’ Data

Team Name	#category won	mAP(%)
BDAT	128	0.732
NUS-Qihoo_DPNs	14	0.658

## BDAT

Hui Shuai<sup>1</sup>, Zhenbo Yu<sup>1</sup>, Qingshan Liu<sup>1</sup>, Xiaotong Yuan<sup>1</sup>, Kaihua Zhang<sup>1</sup>, Yisheng Zhu<sup>1</sup>, Guangcan Liu<sup>1</sup>, Jing Yang<sup>1</sup>, Yuxiang Zhou<sup>2</sup>, Jiankang Deng<sup>2</sup>

1. *Nanjing University of Information Science & Technology*
2. *Imperial College London*

## NUS-Qihoo\_DPNs

Yunpeng Chen<sup>1</sup>, Huixin Xiao<sup>1</sup>, Jianan Li<sup>1</sup>, Xuecheng Nie<sup>1</sup>, Xiaojie Jin<sup>1</sup>, Jianshu Li<sup>1</sup>, Jiashi Feng<sup>1</sup>, Jian Dong<sup>2</sup>, Shuicheng Yan<sup>2</sup>

1. *NUS - National University of Singapore*
2. *Qihoo 360*

# Object Detection from Video(VID) Task

Fully annotated 30 object classes across 7,314 snippets



Allows evaluation of generic object detection  
in cluttered videos at scale

# Object Detection from Video(VID) Task

Evaluation modeled after  
PASCAL VOC:



This year: 1,036 new snippets  
distributed into train, val, test set.

- Algorithms outputs a list of bounding box detections with confidences
- A detection is considered correct if intersection over union(IoU) overlap with ground truth  $> 0.5$
- Evaluated by average precision per object class
- Winner of challenge is the team that wins the most object categories

# Object Detection from Video(VID) Task

Evaluation taking tracking into account:

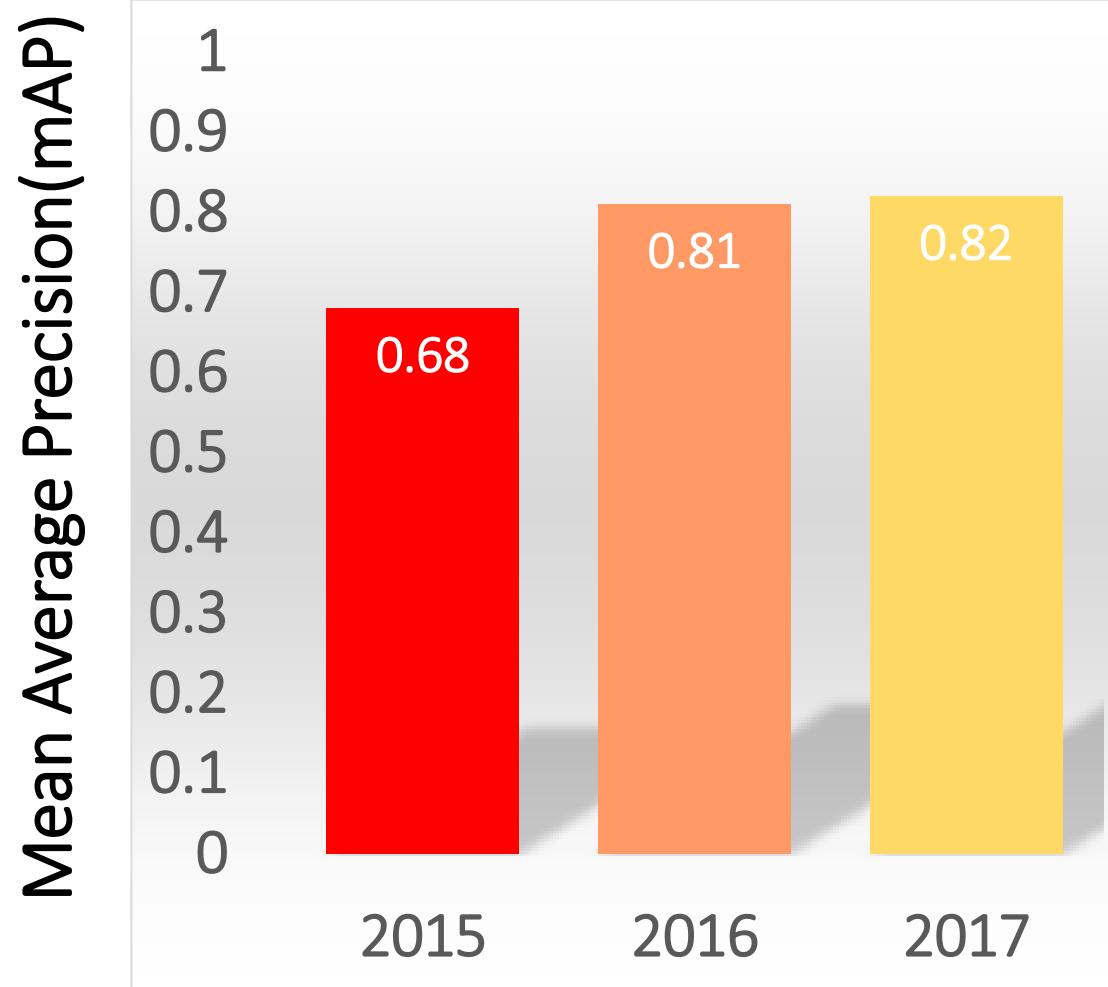


This year: 1,036 new snippets distributed into train, val, test set.

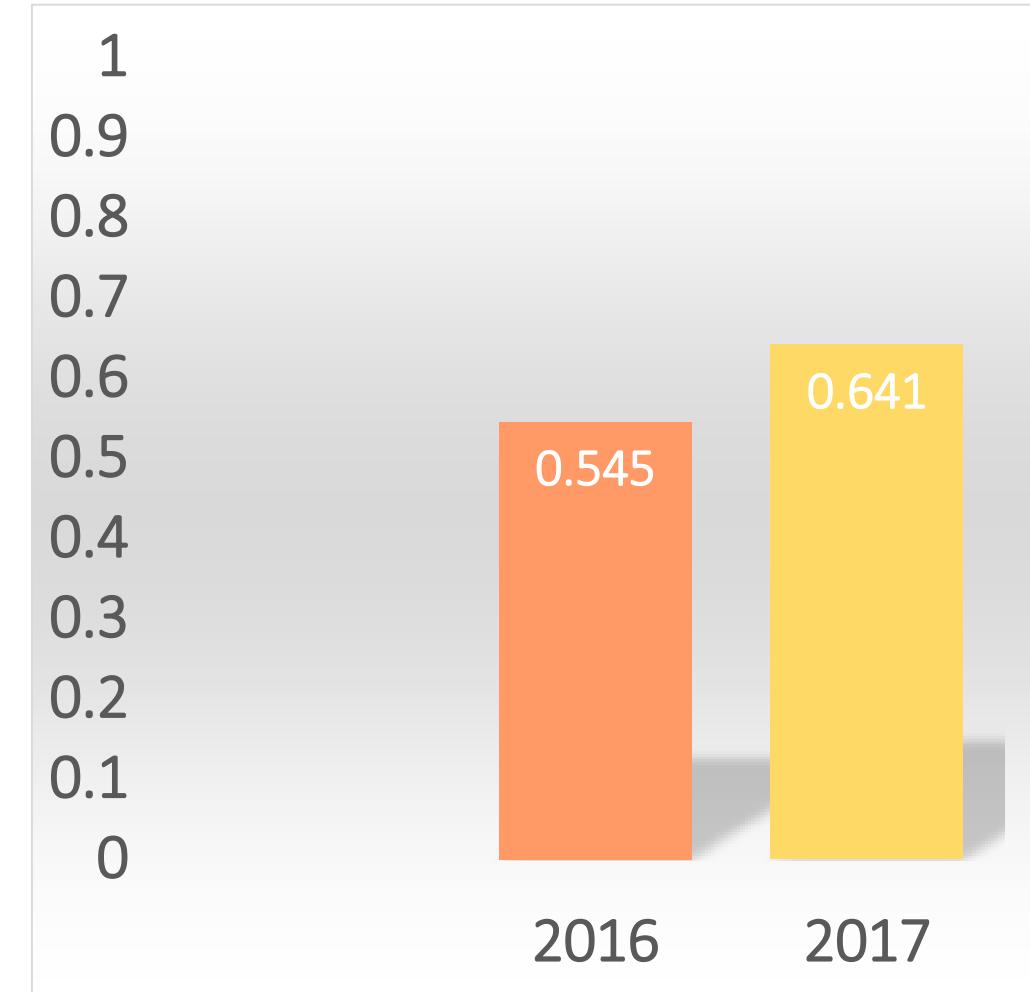
- Algorithms outputs a list of bounding box detections with confidences and tracklet ID.
- Tracklets are sorted by the mean confidence.
- A tracklet is considered correct if intersection over union(IoU) overlap with ground truth tracklet  $> 0.5$ .
- Evaluation by average precision per class. Final score is an average over different thresholds.
- Winner of challenge is the team that has highest score.

# Video Detection Results (VID)

W/O Tracking



W/ Tracking



# ILSVRC2017 VID Results - ‘Provided’ Data

Team Name	#category won	mAP(%)	mAP(%) tracking	IC&USYD Jiankang Deng <sup>1</sup> , Yuxiang Zhou <sup>1</sup> , Baosheng Yu <sup>2</sup> , Zhe Chen <sup>2</sup> , Stefanos Zafeiriou <sup>1</sup> , Dacheng Tao <sup>2</sup> , 1. <i>Imperial College London</i> 2. <i>University of Sydney</i>
IC&USYD	15	0.817	0.641	
NUS-Qihoo-UIUC_DPNs (VID)	3	0.758	0.545	<b>NUS-Qihoo-UIUC_DPNs(VID)</b> Yunchao Wei <sup>1</sup> , Mengdan Zhang <sup>1</sup> , Jianan Li <sup>1</sup> , Yunpeng Chen <sup>1</sup> , Jiashi Feng <sup>1</sup> , Jian Dong <sup>2</sup> , Shuicheng Yan <sup>2</sup> , Honghui Shi <sup>3</sup> 1. <i>National University of Singapore</i> 2. <i>Qihoo 360</i> 3. <i>University of Illinois Urbana-Champaign</i>
THU-CAS	0	0.730	0.512	

# ILSVRC2017 VID Results - ‘External’ Data

Team Name	#category won	mAP(%)	mAP(%) tracking	
IC&USYD	24	0.820	0.643	<b>IC&amp;USYD</b> Jiankang Deng <sup>1</sup> , Yuxiang Zhou <sup>1</sup> , Baosheng Yu <sup>2</sup> , Zhe Chen <sup>2</sup> , Stefanos Zafeiriou <sup>1</sup> , Dacheng Tao <sup>2</sup> 1. <i>Imperial College London</i> 2. <i>University of Sydney</i>
NUS-Qihoo-UIUC_DPNs (VID)	3	0.761	0.550	<b>NUS-Qihoo-UIUC_DPNs(VID)</b> Yunchao Wei <sup>1</sup> , Mengdan Zhang <sup>1</sup> , Jianan Li <sup>1</sup> , Yunpeng Chen <sup>1</sup> , Jiashi Feng <sup>1</sup> , Jian Dong <sup>2</sup> , Shuicheng Yan <sup>2</sup> , Honghui Shi <sup>3</sup> 1. <i>National University of Singapore</i> 2. <i>Qihoo 360</i> 3. <i>University of Illinois Urbana-Champaign</i>

# Coming Presentations!

1. Jie Hu(Team: WMW, Momenta): *Squeeze-and-Excitation Networks*
2. Yunpeng Chen(Team: NUS-Qihoo\_DPNs, NUS):  
*Dual Path Networks and its Applications*
3. Short presentations of winning entries: NUS-Qihoo-UIUC\_DPNs (VID), DeepView(ETRI), MIL\_UT, SIIT\_KAIST-SKT, KAISTNIA\_ETRI