

ActEV19: Activities in Extended Video (Summary Results)

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NIST
National Institute of
Standards and Technology
U.S. Department of Commerce

DIVA



Disclaimer

Certain commercial equipment, instruments, software, or materials are identified in this paper to specify the experimental procedure adequately. Such identification is not intended to imply recommendation or endorsement by NIST, nor necessarily the best available for the purpose.

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Outline

- ActEV Overview
- TRECVID ActEV19 Evaluation
- ActEV19 Tasks and Measures
- ActEV19 Dataset
- ActEV19 Results and Analyses
- Next Steps

ActEV Overview

What is ActEV?



vehicle_turning_left-00



vehicle_turning_left-04



Closing-01



Closing-02



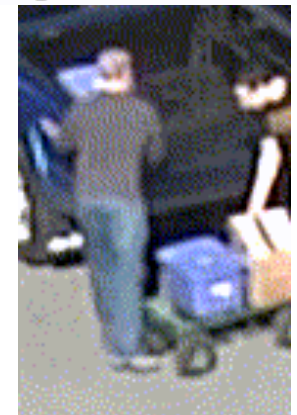
Closing-00



Loading-00



Loading-01



Loading-02

What is ActEV's Goal?

- To advance video analytics technology that can automatically detect a target activity and identify and track objects associated with the activity.
- A series of challenges are also designed for:
 - Activity detection in a multi-camera environment
 - Temporal (and spatio-temporal) localization of the activity for reasoning

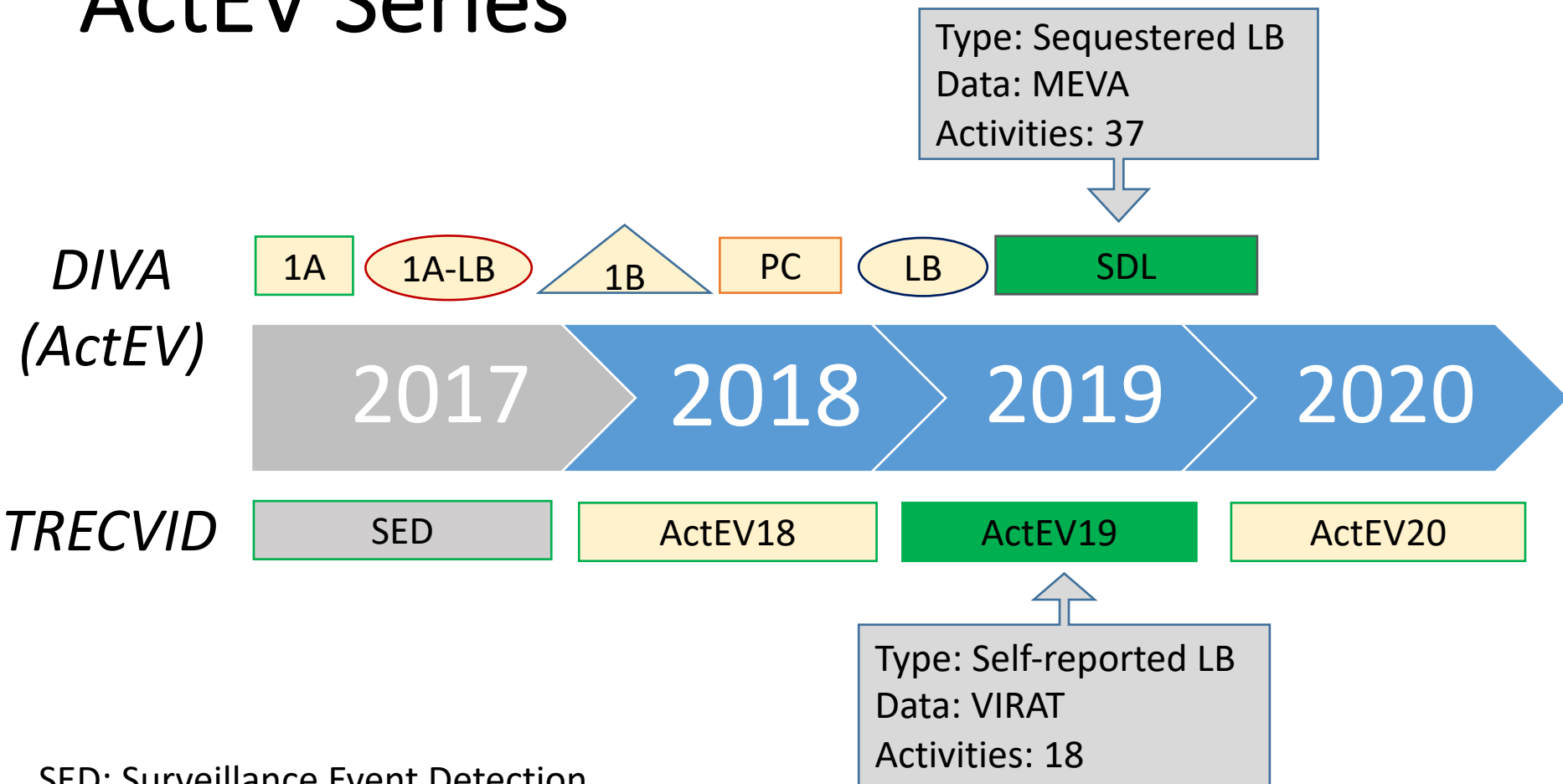
NIST, IARPA, and Kitware

- NIST developed the ActEV evaluation series to support the metrology needs of the Intelligence Advanced Research Projects Activity (IARPA) Deep Intermodal Video Analytics (DIVA) Program
- The ActEV's datasets were collected and annotated by Kitware, Inc.

DIV A



ActEV Series



SED: Surveillance Event Detection

LB: Leaderboard

PC: Prize Challenge

SDL: Sequestered Data Leaderboard

TRECVID

ActEV19 Evaluation

Evaluation Framework

- Target applications
 - Retrospective analysis of archives (e.g., forensic analytics)
 - Real-time analysis of live video streams (e.g., alerting and monitoring)
- Evaluation Type
 - Self-reported (& take-home) evaluation
 - TRECVID ActEV19
 - Independent (& sequestered) evaluation
 - DIVA ActEV SDL

ActEV19 Tasks and Measures

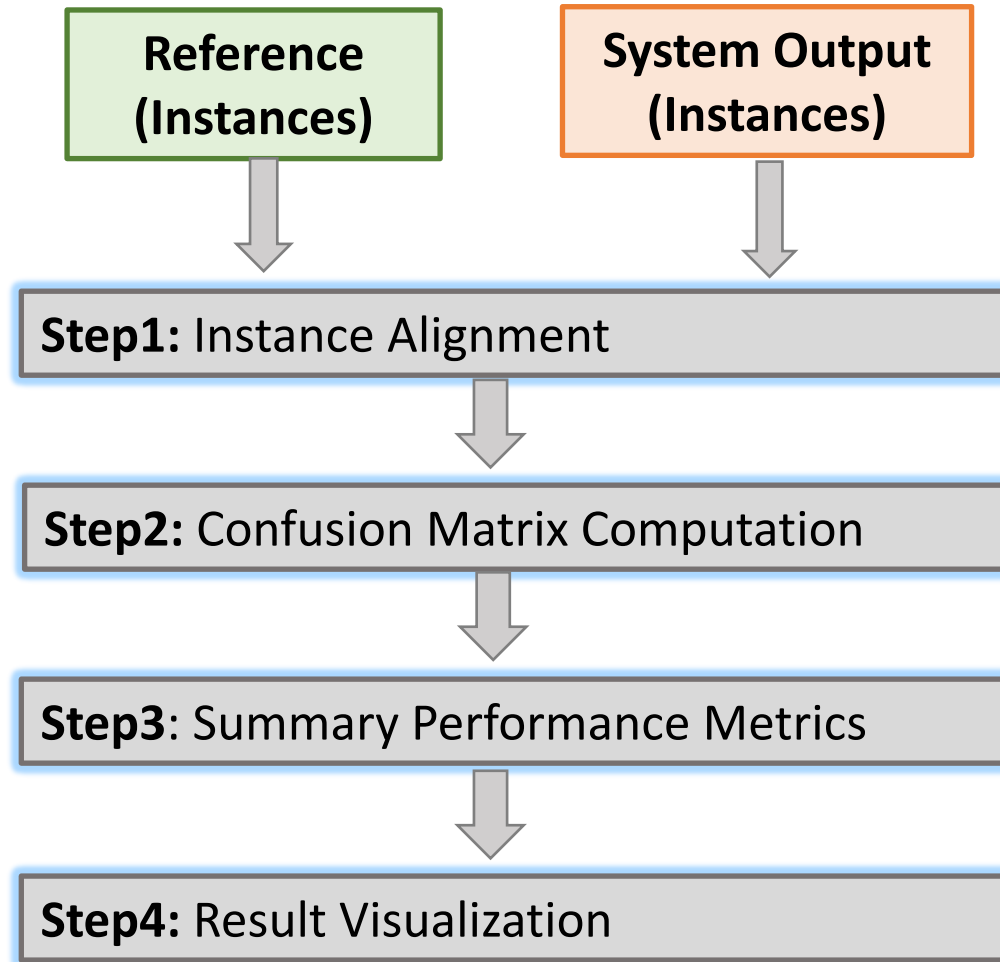
Evaluation Tasks (AD)

- “Activity” definition for this evaluation
 - One or more people performing a specified movement, or interacting with an object or group of objects (including driving)
- Activity Detection (AD) task
 - Given a target activity, a system automatically 1) detects its presence and then temporally localizes all instances of the activity in video sequences
 - The temporal overlap must fall within a minimal requirement
 - The system output includes:
 - Start and end frames indicating the temporal location of the target activity
 - A presence confidence score that indicates how likely the activity occurred

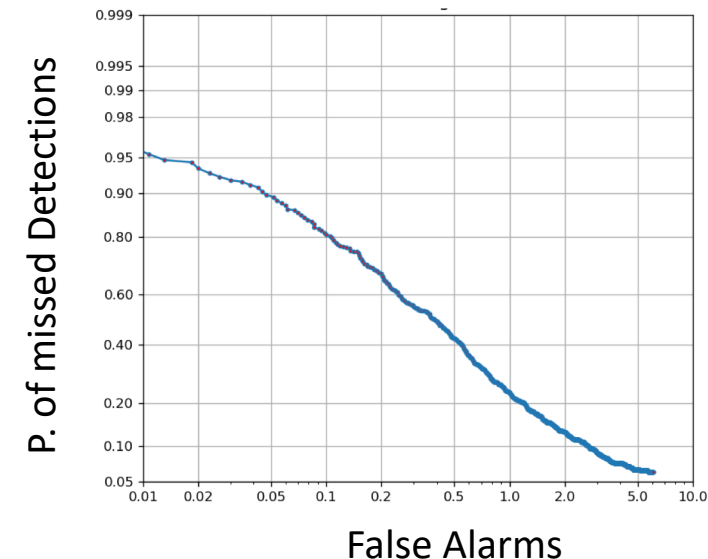
Past Evaluation Tasks (AOD and AODT)

- Activity and Object Detection (AOD)
 - A system not only 1) detects/localizes the target activity, but also 2) detects the presence of required objects and spatially localizes the objects that are associated with the activity
- Activity Object Detection/Tracking (AODT)
 - A system 1) correctly detects/localizes the target activity, 2) correctly detects/localizes the required objects in that activity, and 3) correctly tracks those objects over time.
- The AOD and AODT tasks are NOT addressed in ActEV19 evaluations

Performance Metric Calculation



DET (Detection Error Tradeoff)



Primary Performance Measures (AD)

ActEV18

P_{miss} at $R_{fa} = 0.15$

$$P_{miss}(\tau) = \frac{N_{md}(\tau)}{N_{TrueInstance}}$$

$$R_{fa}(\tau) = \frac{N_{fa}(\tau)}{VideoDurInMinutes}$$



ActEV19

$$nAUDC_a = \frac{1}{a} \int_{x=0}^a P_{miss}(x) dx, x = T_{fa}$$

$$P_{miss}(x) = \frac{N_{md}(x)}{N_{TrueInstance}}$$

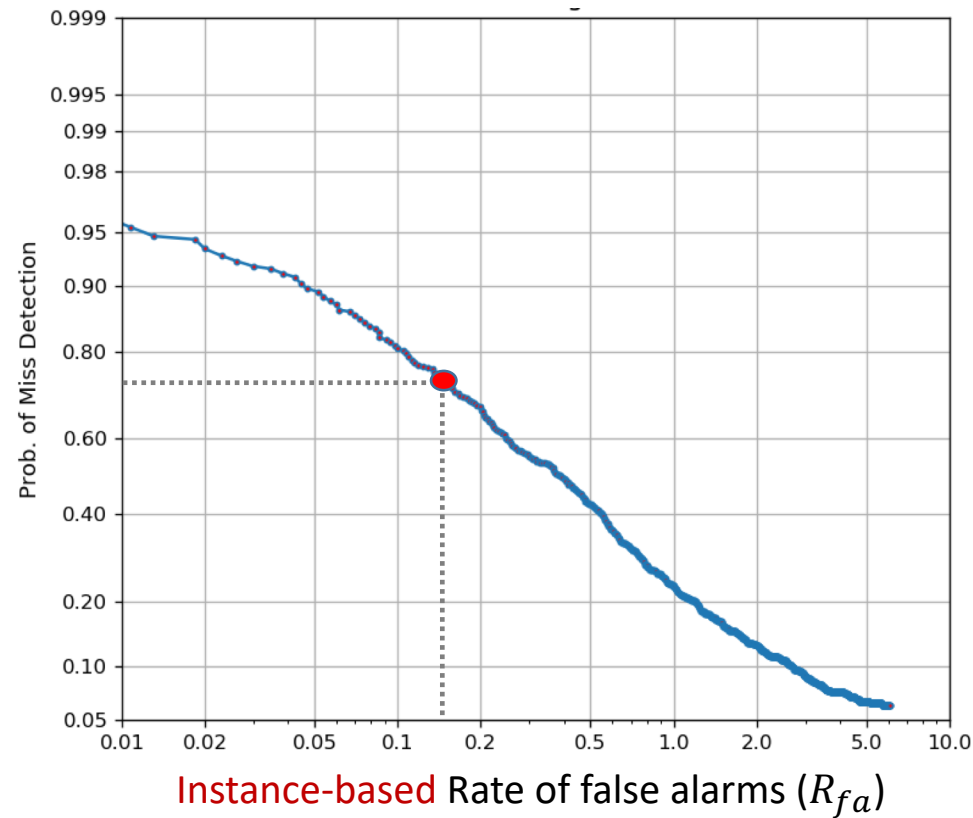
$$T_{fa} = \frac{1}{NR} \sum_{i=1}^{N_{frames}} \max(0, S'_i - R'_i)$$

nAUDC (normalized partial Area Under the DET Curve)

Performance Measures (AD)

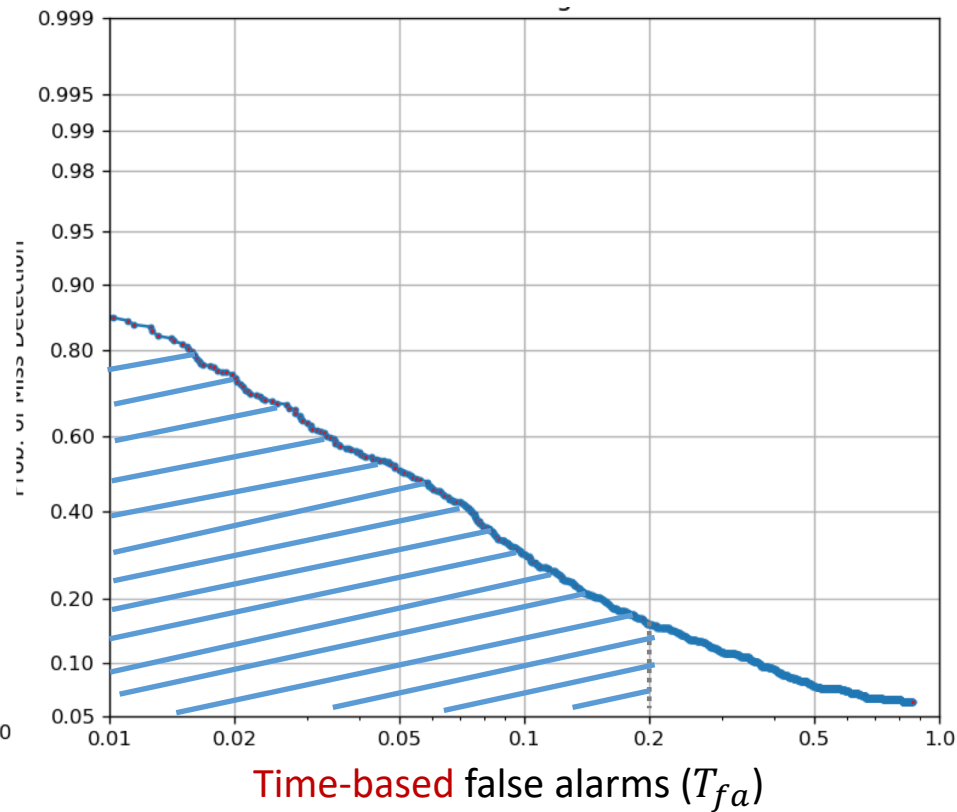
ActEV18

P_{miss} at $R_{FA} = 0.15$

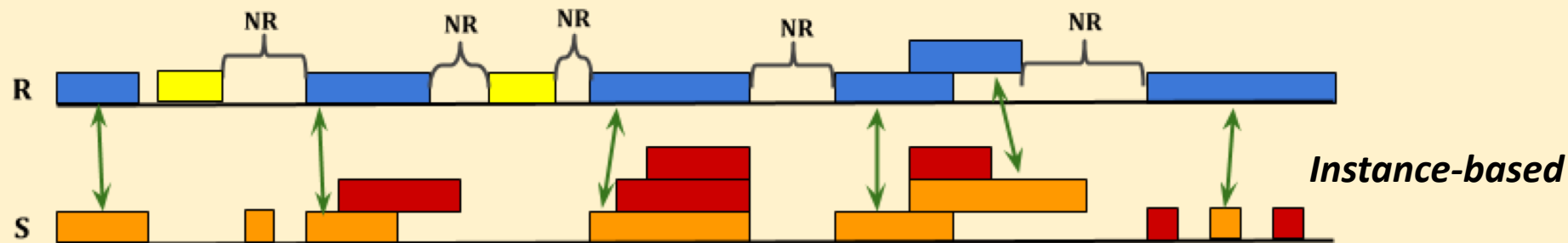


ActEV19

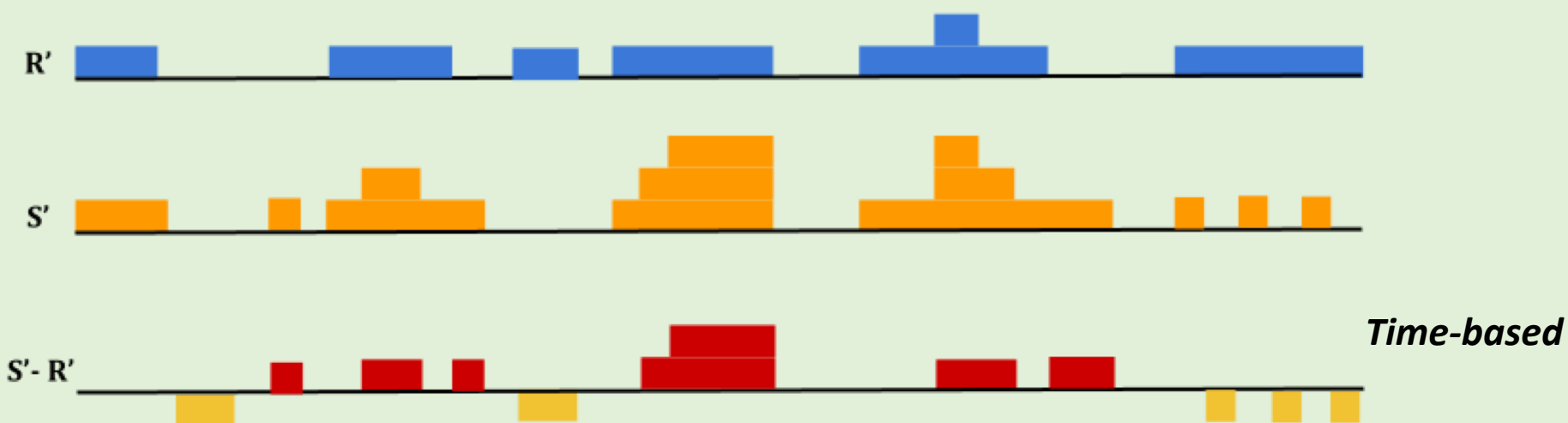
$nAUDC_a$, $a = 0.2$



Instance vs Time based False Alarms



Suppose that all S instances are greater than or equal to presenceConf threshold



NR: Non-Reference

ActEV19 Dataset

Activities and Number of Instances

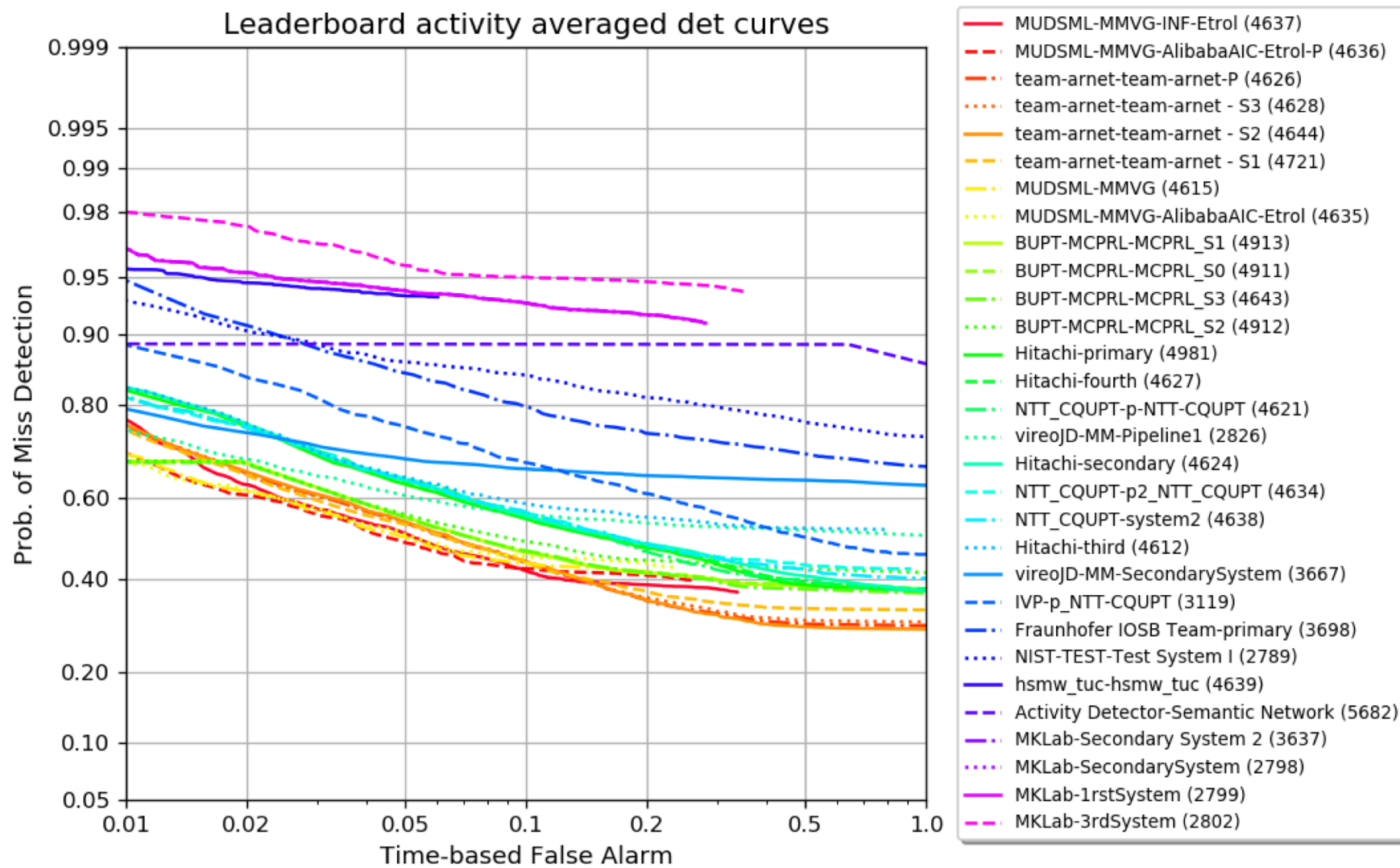
| Activity Type | ActEV18 (V1) | | ActEV19 (V1V2) | |
|---------------------------|--------------|------------|----------------|------------|
| | Train | Validation | Train | Validation |
| Closing | 126 | 132 | 126 | 132 |
| Closing_trunk | 31 | 21 | 31 | 21 |
| Entering | 70 | 71 | 70 | 71 |
| Exiting | 72 | 65 | 72 | 65 |
| Loading | 38 | 37 | 38 | 37 |
| Open_Trunk | 35 | 22 | 35 | 22 |
| Opening | 125 | 127 | 125 | 127 |
| Transport_HeavyCarry | 45 | 31 | 45 | 31 |
| Unloading | 44 | 32 | 44 | 32 |
| Vehicle_turning_left | 152 | 133 | 152 | 133 |
| Vehicle_turning_right | 165 | 137 | 165 | 137 |
| Vehicle_u_turn | 13 | 8 | 13 | 8 |
| Interacts | 88 | 101 | x | x |
| Pull | 21 | 22 | 21 | 22 |
| Riding | 21 | 22 | 21 | 22 |
| Talking | 67 | 41 | 67 | 41 |
| Activity_carrying | 364 | 237 | 364 | 237 |
| Specialized_talking_phone | 16 | 17 | 16 | 17 |
| Specialized_texting_phone | 20 | 5 | 20 | 5 |

Due to ongoing evaluations, the test sets are not included in the table

ActEV19

Results and Analyses

As of 11/13/2019



ActEV19 Participants

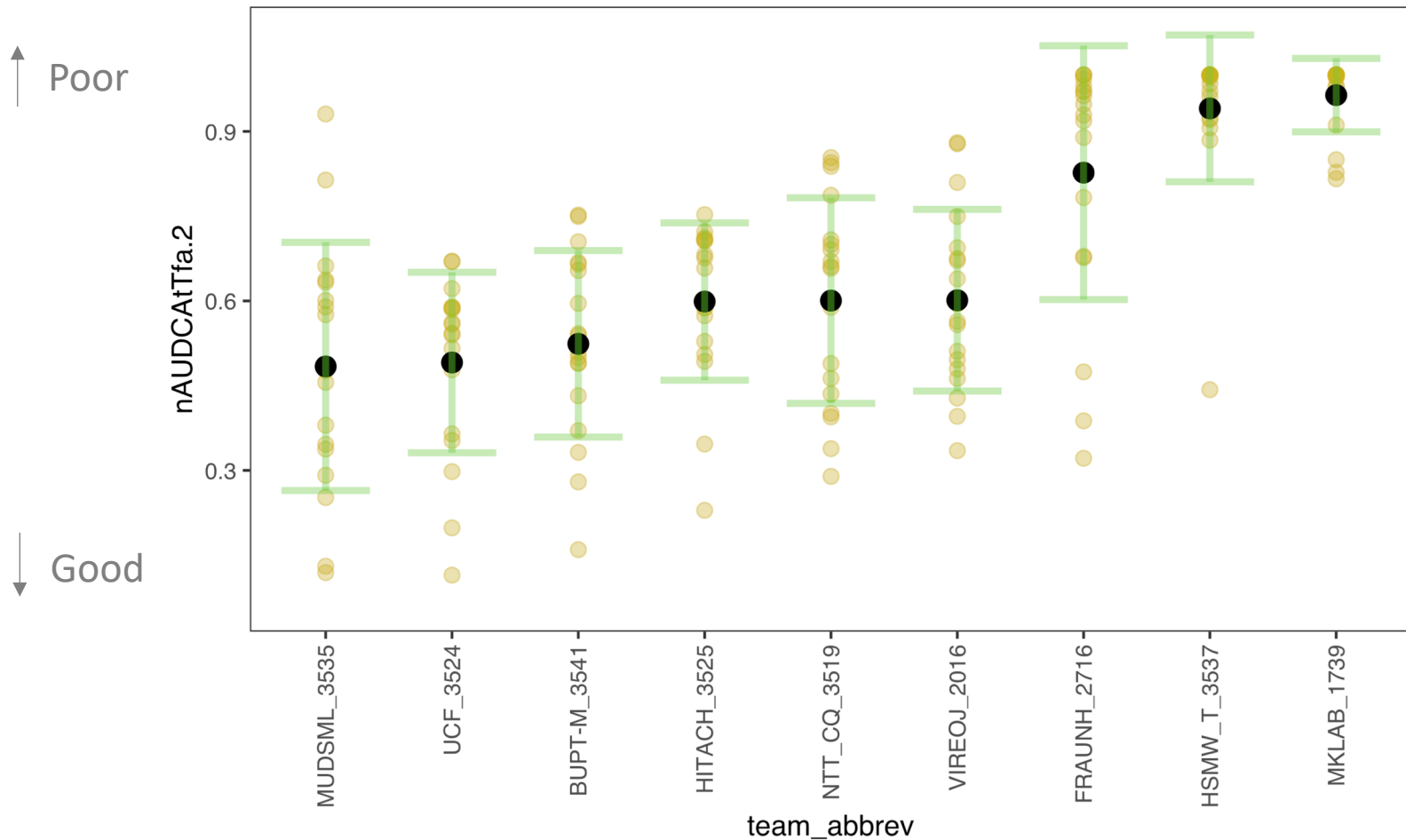
- 256 submissions (as of 11/1/2019) from 9 teams from 6 countries (best system result per site)

| Team | Organization | nAUC |
|-------------------|---|-------|
| BUPT-MCPRL | Beijing University of Posts and Telecommunications, China | 0.524 |
| Fraunhofer IOSB | Fraunhofer Institute, Germany | 0.827 |
| HSMW_TUC | University of Applied Sciences Mittweida and Chemnitz University of Technology, Germany | 0.941 |
| MKLab (ITI_CERTH) | Information Technologies Institute, Greece | 0.964 |
| MUDSML | Monash University, Australia and Carnegie Mellon University, USA | 0.484 |
| NII_Hitachi UIT | National Institute of Informatics, Japan Hitachi, Ltd., Japan University of Information Technology, Vietnam | 0.599 |
| NTT_CQUPT | NTT company & Chongqing University of Posts and Telecommunications, China | 0.601 |
| UCF | University of Central Florida, USA | 0.491 |
| vireoJD-MM | City University of Hong Kong and JD AI Research, China | 0.601 |

Performance Ranking (AD)

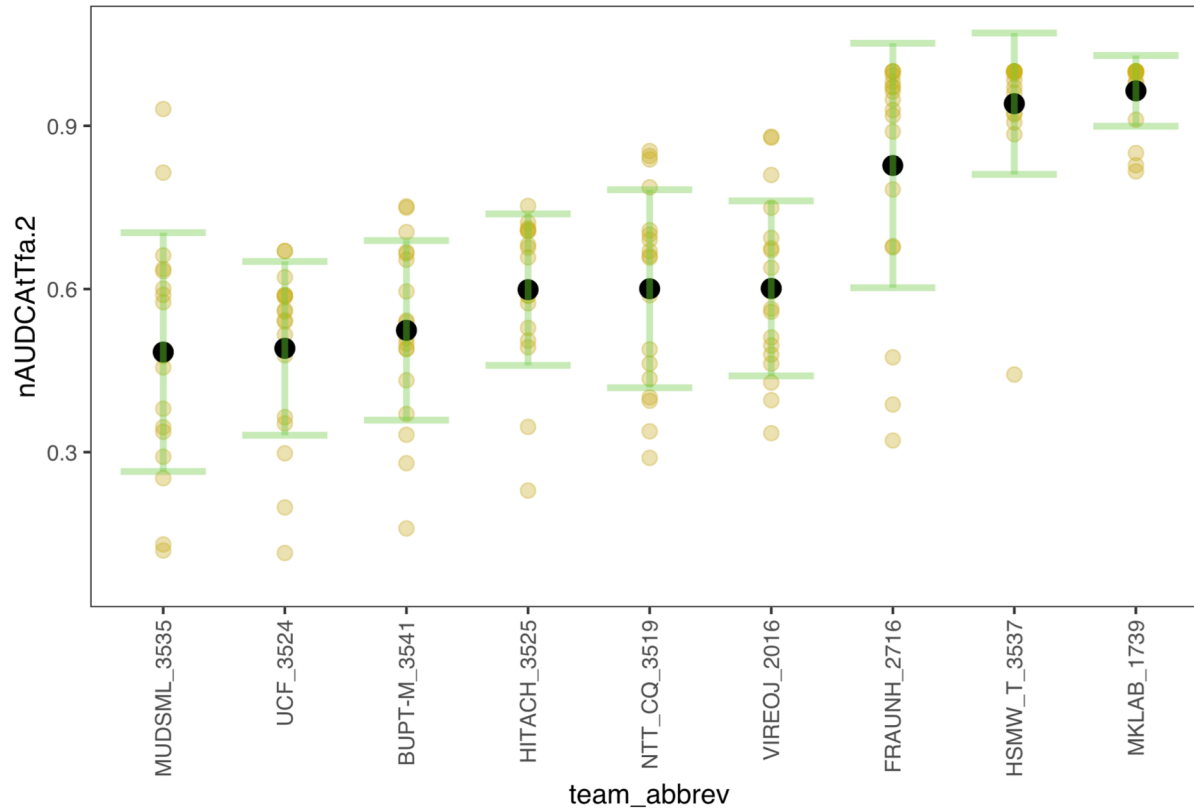
TRECVID Ranked list of systems (Best per site)

Data: V1V2, Type: TRECVID Metric: Ordered by nAUDCA_{Tf}a.2



TRECVID Ranked list of systems

Data: V1V2, Type: TRECVID Metric: Ordered by nAUDCA_{Tf}.2



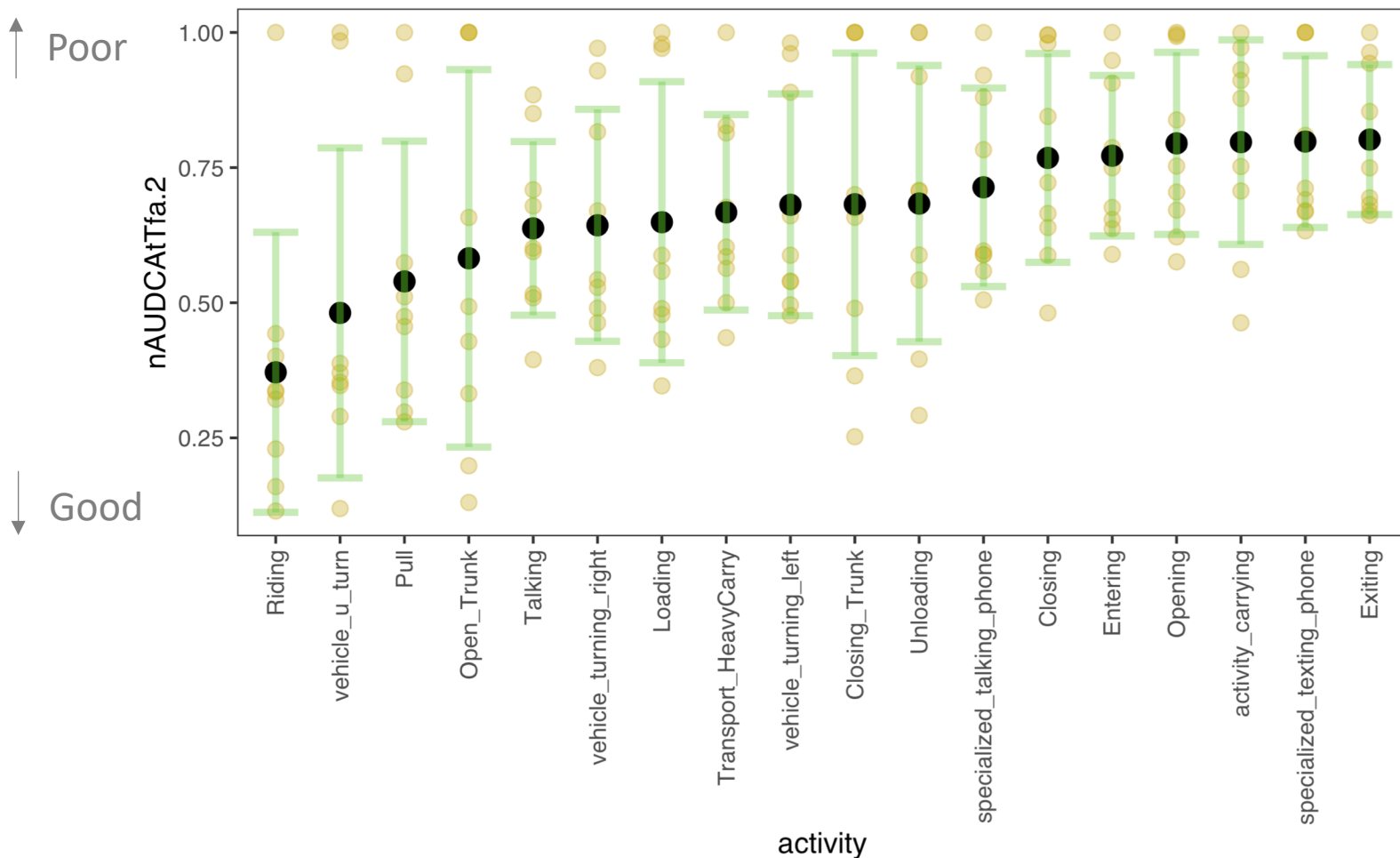
Observation

- Highest performance on activity detection:
 - MUDSML (nAUDC: 48.4%) followed by UCF (nAUDC: 49.1%)
- A large variance of the 18 activities across systems

Activity Ranking (AD)

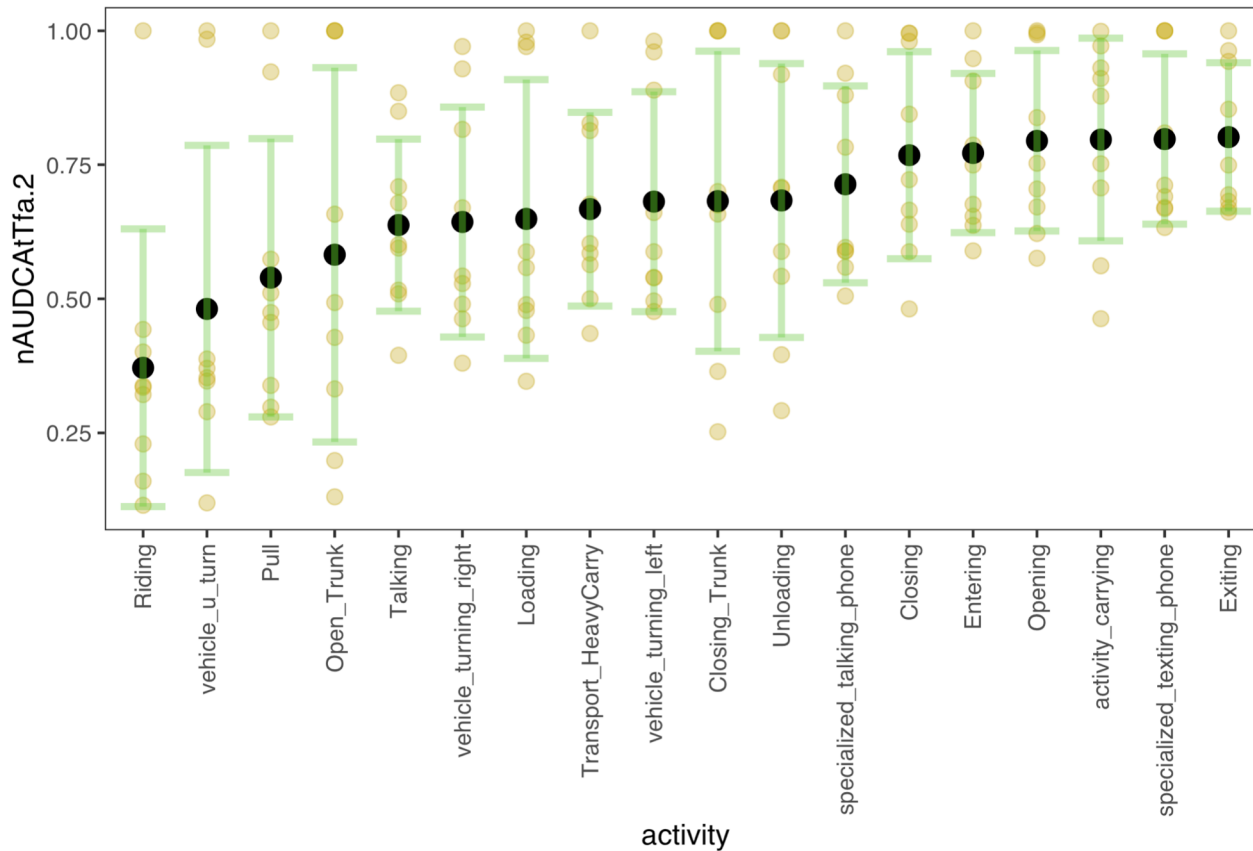
TRECVID Ranked list of activities across systems

Data: V1V2, Type: TRECVID Metric: Ordered by nAUDCA_{Tf}a.2



TRECVID Ranked list of activities across systems

Data: V1V2, Type: TRECVID Metric: Ordered by nAUDCAITfa.2



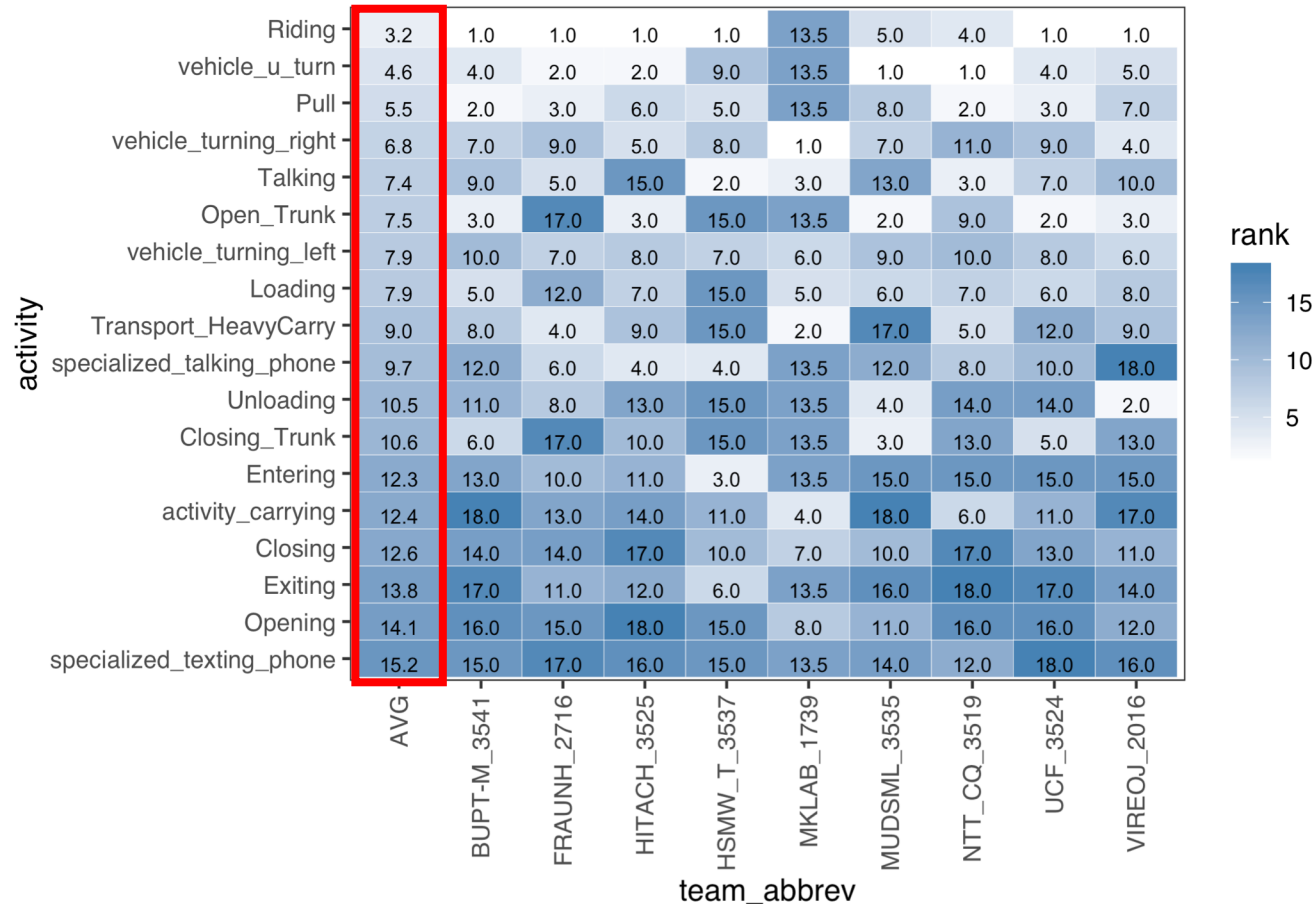
Observation

- Given the dataset and the 18 activities, “Riding” is the easiest to detect while “Exiting” is the hardest across the 9 systems
- “Open_Trunk” and “Closing_Trunk” have larger variance across systems

Which activities are easier or more difficult to detect?

TRECVID Summary of Activities Difficulty

Data: V1V2, Type: TRECVID Metric: nAUDCAtTfa.2



- X-axis: team names and average activity ranking (AVG)
- Y-axis: 18 activities - Numbers in the matrix: the ranking of 18 activities per system

The activity class was characterized by systems and baseline performance

Observation: the Riding, vehicle_u_turn, and Pull activities are easier to detect compared to the rest of the other activities

Comparison of ActEV18 and ActEV19 Results

| Team | ActEV18 | | ActEV19 | |
|-------------------|----------|---------|---------|--------|
| | Self(12) | LB (19) | LB (18) | |
| | PR.15↓ | PR.15↓ | PR.15↓ | nAUCDC |
| UMD | 0.618 | x | x | x |
| SeuGraph | 0.624 | x | x | x |
| Team_Vision | 0.710 | 0.709 | x | x |
| UCF | 0.759 | 0.733 | 0.680 | 0.491 |
| STR-DIVA Team | 0.827 | x | x | x |
| JHUDIVATeam | 0.887 | x | x | x |
| MUDSML (INF) | 0.896 | 0.844 | 0.789 | 0.484 |
| SRI | 0.927 | x | x | x |
| VANT | 0.940 | 0.882 | x | x |
| HSMW_TUC | 0.961 | x | 0.951 | 0.941 |
| BUPT-MCPRL | 0.990 | 0.749 | 0.736 | 0.524 |
| USF Bulls | 0.991 | 0.934 | x | x |
| MKLab (ITI_CERTH) | 0.999 | x | 0.968 | 0.964 |
| UTS-CETC | x | 0.925 | x | x |
| NII_Hitachi_UIT | x | 0.925 | 0.819 | 0.599 |
| Fraunhofer IOSB | x | x | 0.849 | 0.827 |
| NTT_CQUPT | x | x | 0.878 | 0.601 |
| vireoJD-MM | x | x | 0.714 | 0.601 |

T: TRECVID, D: DIVA, Self: Self-reported eval, LB: Leaderboard eval

PR.15: μP_{miss} at $R_{FA} = 0.15$

Comparison of ActEV18 vs ActEV19 (Leaderboard only)

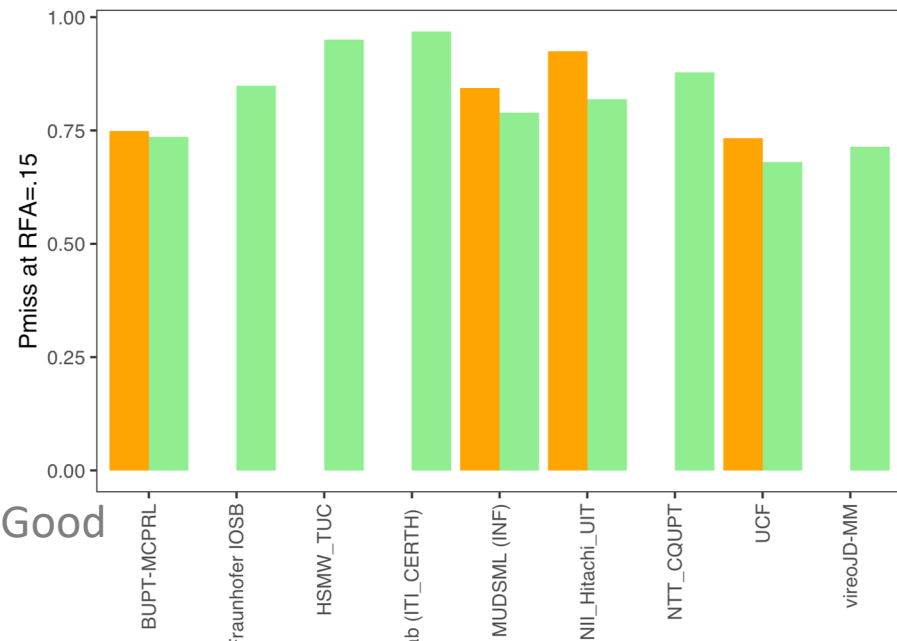
| | ActEV18 | ActEV19 |
|--------------|----------|------------|
| Dataset | VIRAT V1 | VIRAT V1V2 |
| # Activities | 19 | 18 |
| Metric | PR.15 | PR.15 |

| Team | ActEV18 | ActEV19 |
|-------------------|---------|---------|
| | LB (19) | LB (18) |
| | PR.15↓ | PR.15↓ |
| UCF | 0.733 | 0.680 |
| MUDSML (INF) | 0.844 | 0.789 |
| HSMW_TUC | x | 0.951 |
| BUPT-MCPRL | 0.749 | 0.736 |
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| NTT_CQUPT | x | 0.878 |
| vireoJD-MM | x | 0.714 |

PR. 15: P_{miss} at $R_{fa} = .15$ (ActEV18 scoring protocol)

ActEV18 (19 act) vs ActEV19 (18 act)

Poor

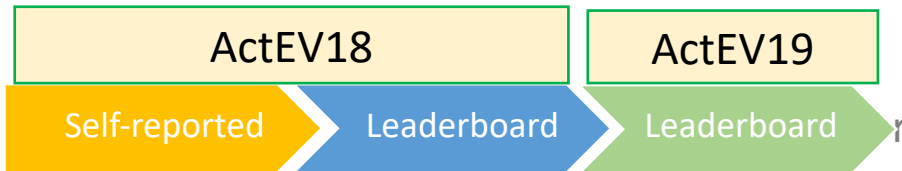


evaluation
■ ActEV18
■ ActEV19

Good

Observation: System performance improved from last year for leaderboard eval. For example, reduced ~12% relative error rate NII_Hitachi UIT, ~7% for and UCF and MUDSML

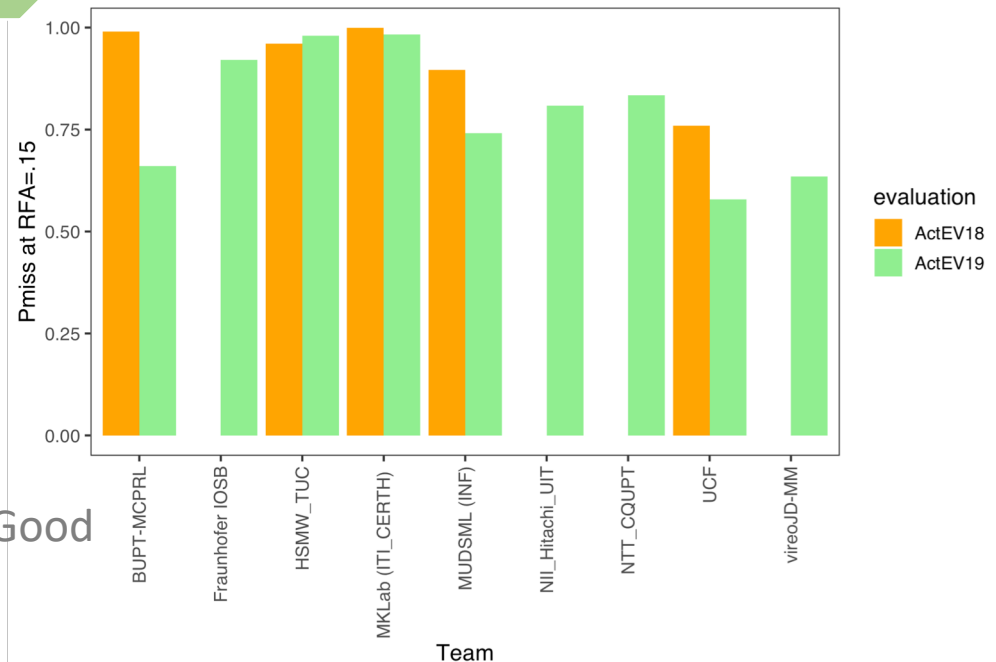
Comparison of ActEV18 vs ActEV19 (12 Activities only)



| Team | ActEV18 | ActEV19 |
|-------------------|---------|---------|
| | PR.15↓ | PR.15↓ |
| UCF | 0.759 | 0.605 |
| MUDSML (INF) | 0.896 | 0.731 |
| HSMW_TUC | 0.961 | 0.990 |
| BUPT-MCPRL | 0.990 | 0.683 |
| MKLab (ITI_CERTH) | 0.999 | 0.986 |
| NII_Hitachi_UIT | x | 0.827 |
| Fraunhofer IOSB | x | 0.921 |
| NTT_CQUPT | x | 0.826 |
| vireoJD-MM | x | 0.600 |

↓ Good

ActEV18 (12 act) vs ActEV19 (12 act)



Observation:

- System performance on 12 activities improved largely from ActEV18 to ActEV19
- Reduced 31% relative error rate for BUPT-MCPRL, 21% for UCF, and 18% for MUDSML

Summary

- New performance measure to be more relevant to the user cases
- 256 submissions out of 9 teams
- Given the test set and the 18 activities, “Riding” is the easiest while “Exiting” is the hardest across the 9 systems
- Large system improvements this year from last year

Next Steps

Next Steps

- WACV HADCV'20 (Human Activity Detection in multi-camera, Continuous, long-duration Video) workshop (***paper submission deadline: Dec 15, 2019***) the details at <https://wacv20.wacv.net>



- Resources: <https://actev.nist.gov> (click “Resources”)
 - Datasets (training data)
 - Baseline algorithms
 - Annotation Tools
- TRECVID ActEV20 plan
 - ActEV Task Discussion Session (including new M1 data release)

Sequestered Data Leaderboard (SDL)

- Anyone can ***submit their system to NIST***, which will then run the system on ***sequestered data*** (MEVA), post the results to the leaderboard
- Visit ongoing ActEV SDL Evaluation at <https://actev.nist.gov/sdl>
- MEVA data (<https://mevadata.org/>)
 - *37 activities (72 video hours) : Indoor and outdoor scenes, night and day, crowds and individuals, EO (Electro-Optical) and IR (Infrared) sensors*
 - ***New M1 data release***

| | |
|------------------|---|
| 9:00 - 9:30 am | Activities in Extended Video (ActEv) Task Overview |
| 9:30 - 10:00 am | BUPT-MCPRL at TRECVID 2019: ActEv <i>BUPT_MCPRL Team - Beijing University of Posts and Telecommunications</i> |
| 10:00 - 10:30 am | AI Surveillance System for Spatial-Temporal Activity Detection in Surveillance Scenarios <i>MUDSML + INF Teams - Monash University; Carnegie Mellon University</i> |
| 10:30 - 11:00 am | Our ActEv approach with object detection and custom tracking algorithm <i>HSMW_TUC Team - University of Applied Sciences Mittweida</i> |
| 11:00 - 11:30 am | Break with refreshments |
| 11:30 - 12:00 am | Real-time activity detection in surveillance videos <i>UCF Team - University of Central Florida</i> |
| 12:00 - 12:30 pm | Event Detection with Specialized Object Detectors <i>Hitachi Team</i> |
| 12:30 - 2:00 | Lunch |
| 2:00 - 2:30 pm | Traffic Danger Recognition with Surveillance Cameras Without Training Data, <i>Invited Talk: Lijun Yu, Carnegie Mellon University</i> |
| 2:30 - 2:50 pm | ActEv Task Discussion |

Questions?

<https://actev.nist.gov/>

Contact: actev-nist@nist.gov

TRECVID ActEV19 Feedback and ActEV20 Discussion

Sequestered Data Leaderboard (SDL)

- Anyone can ***submit their system to NIST***, which will then run the system on ***sequestered data*** (MEVA), post the results to the leaderboard
- Visit ongoing ActEV SDL Evaluation at [**https://actev.nist.gov/sdl**](https://actev.nist.gov/sdl)
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 - *37 activities (72 video hours) : Indoor and outdoor scenes, night and day, crowds and individuals, EO (Electro-Optical) and IR (Infrared) sensors*
 - ***New M1 data release***

2019 ActEV feedback and 2020 plans

- What do the teams think about the ActEV task ?
- Any feedback on the new Scoring Metric compared to the 2018 Metric?
- Any feedback on the data repo to download data (VIRAT, MEVA, ..) ?
- Any feedback on the scoring server and different documents?
- Besides the ActEV leaderboard, we have added the ActEV reports (report on next slide), any feedback?
- Current Plan is to continue the ActEV task with the VIRAT dataset with more activities (28 or more activities)

Current TRECVID ActEV reports (at the end of the evaluation)

BUPT-MCPRL-SYS-00293-20191001-113056-4859

| Metadata | |
|--------------------|---------------------------|
| Team Name | BUPT-MCPRL |
| Team Type | TrecVID |
| System name | MCPRL_S1 |
| Submission id | 3540 |
| Submitted Date | 2019-10-01 11:30:56 -0400 |
| Submission Target | TRECVID |
| Evaluation Name | ActEV-2018 |
| Evaluation Dataset | 1B-eval |

