

# 2011 TRECVID Workshop: Surveillance Event Detection (SED) Task Overview

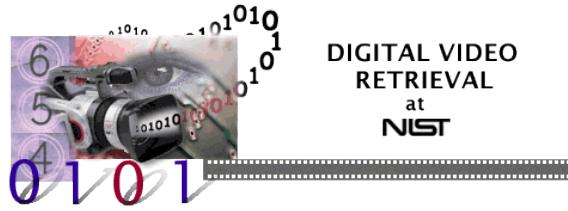
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December 5 to 7, 2011

NIST, Gaithersburg, MD, USA



# Motivation

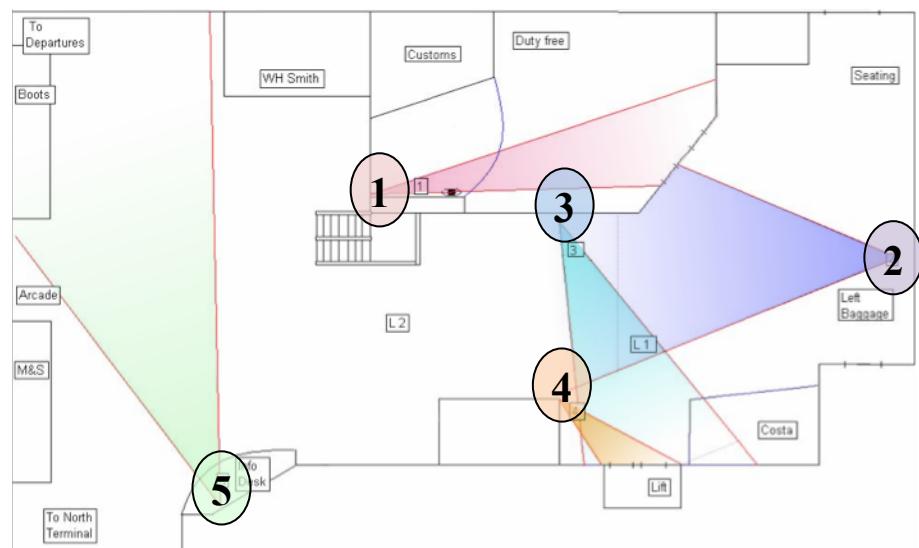
- SED addresses the need for automatic detection of events in large amounts of surveillance video
- Challenges
  - Requires application of several Computer Vision techniques
  - Involves subtleties that are readily understood by humans, difficult to encode for machine learning approaches
  - Can be complicated due to clutter in the environment, lighting, camera placement, traffic, etc.

# Surveillance Event Detection Task

- Given a textual description of an ***observable event of interest***, automatically detect all occurrences of the event in a non-segmented corpus of video
- Identify each event observation by:
  - The ***temporal extent*** (*beginning and end frames*)
  - A ***decision score***: a numeric score indicating how likely the event observation exists with more positive values indicating more likely observations (normalized)
  - An ***actual decision***: a boolean value indicating whether or not the event observation should be counted for the primary metric computation

# Evaluation Source Data

- Reused same data as SED 09 and 10 evaluations
-  
- UK Home Office collected CCTV video from 5 camera views at a busy airport
  - Development Set
    - 100 hours of video
    - 10 events annotated on 100% of the data
  - Evaluation Set
    - “iLIDS Multiple Camera Tracking Scenario Training set”
    - 45 hours of video
    - 10 events annotated on 1/3 of the data
      - 7 events evaluated



# Events and Instances per Hour (IpH)

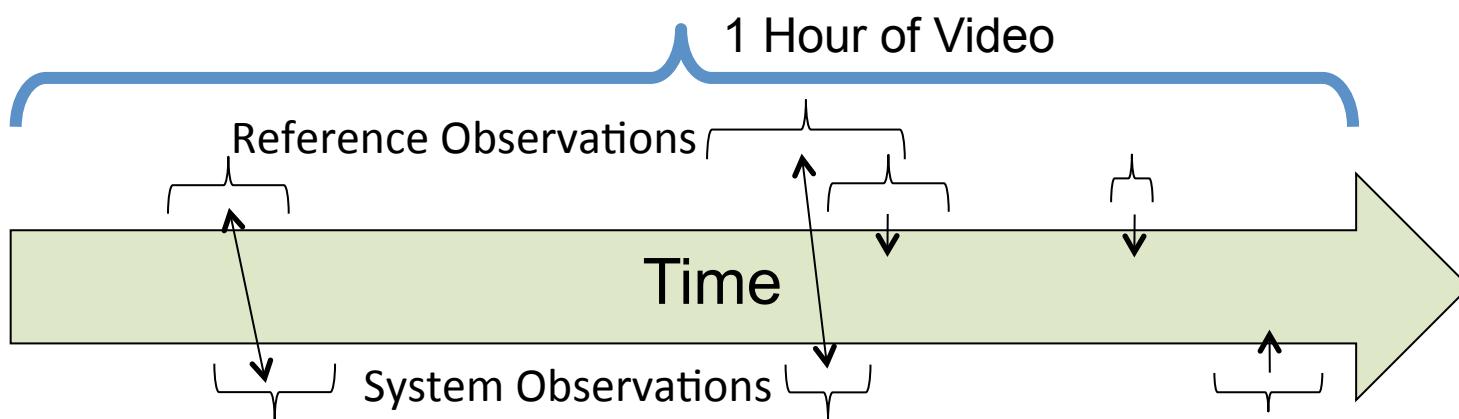
Single Person events		
PersonRuns	7.02 IpH	Someone runs ← <i>Lowest frequency</i>
Pointing	69.74 IpH	Someone points ← <i>Highest frequency</i>
Single Person + Object events		
CellToEar	12.73 IpH	Someone puts a cell phone to his/her head or ear
ObjectPut	40.74 IpH	Someone drops or puts down an object
Multiple People events		
Embrace	11.48 IpH	Someone puts one or both arms at least part way around another person
PeopleMeet	29.46 IpH	One or more people walk up to one or more other people, stop, and some communication occurs
PeopleSplitUp	12.27 IpH	From two or more people, standing, sitting, or moving together, communicating, one or more people separate themselves and leave the frame

ElevatorNoEntry, OpposingFlow, and TakePicture events were not evaluated in 2010 or 2011

# Evaluation Protocol & Scoring Process

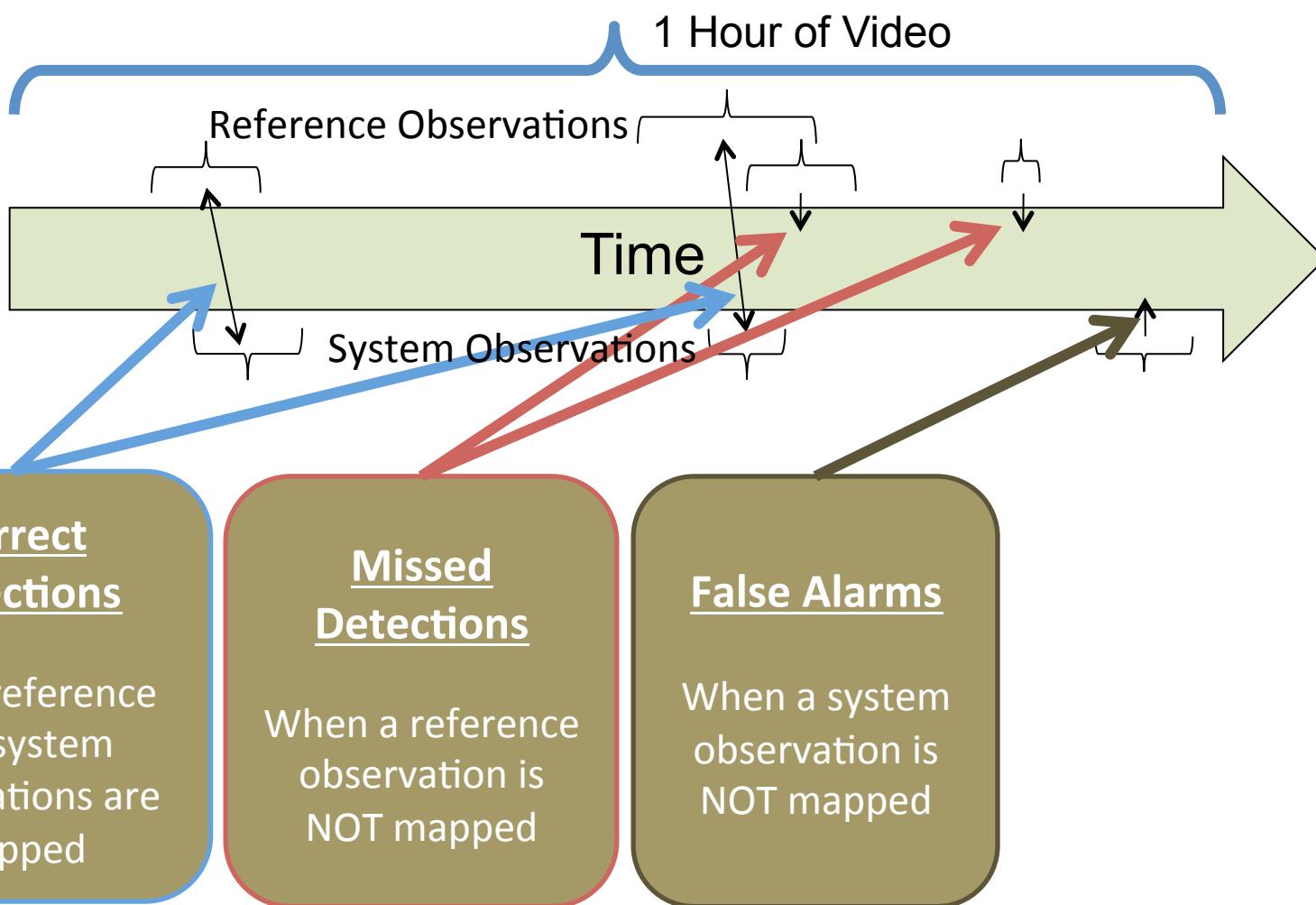
- Evaluation Plan  
<http://www.nist.gov/itl/iad/mig/trecvid.cfm>
- Framework for Detection Evaluation (F4DE) Toolkit  
<http://www.nist.gov/itl/iad/mig/tools.cfm>
- Four step evaluation process (for each event)
  1. Segment mapping
  2. Segment scoring
  3. Error metric calculation
  4. Error visualization

# Step 1: Segment Mapping



Utilizes the Hungarian Solution to Bipartite Graph Matching

# Step 2: Segment Scoring



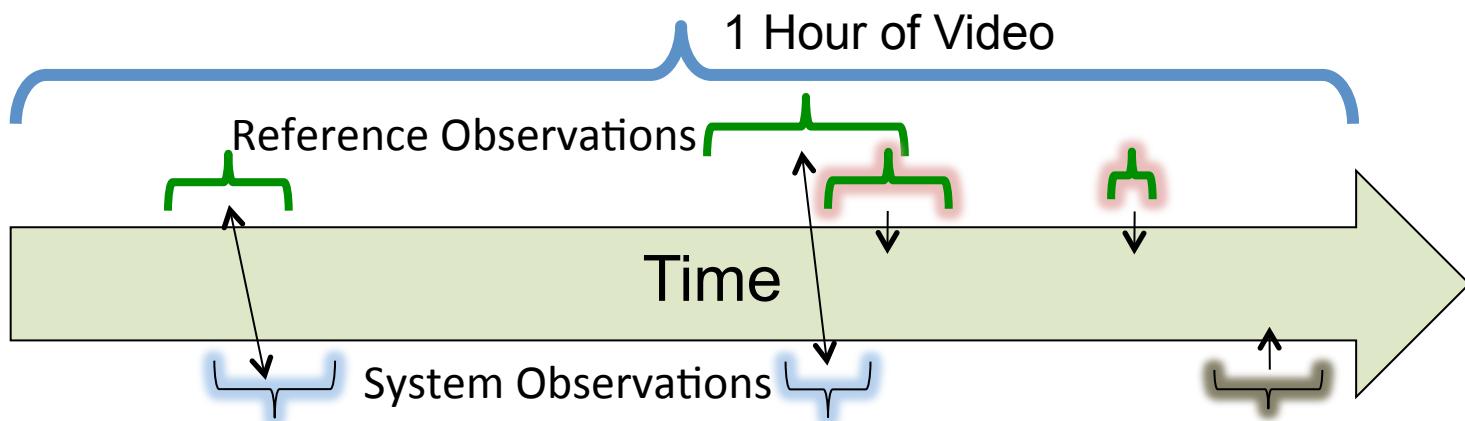
Correct Detections  
When reference and system observations are mapped

Missed Detections  
When a reference observation is NOT mapped

False Alarms  
When a system observation is NOT mapped

# Step 3: Error Metric Computation

Compute Normalized Detection Cost Rate (NDCR) (1/2)



$$P_{Miss} = \frac{\# MissedObs}{\# TrueObs}$$

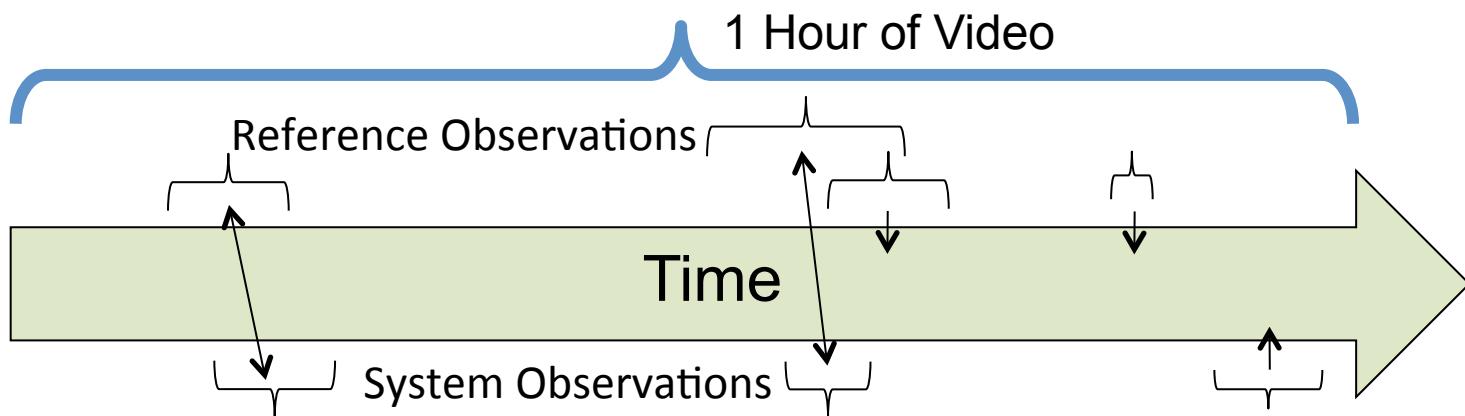
$$Rate_{FA} = \frac{\# FalseAlarms}{SignalDuration}$$

$$P_{Miss} = \frac{2}{4} = .50$$

$$Rate_{FA} = \frac{1}{1Hr} = 1FA / Hr$$

# Step 3: Error Metric Computation

Compute Normalized Detection Cost Rate (NDCR) (2/2)



Primary Metric

$$NDCR = P_{Miss} + \frac{Cost_{FA}}{Cost_{Miss} * Rate_{TARGET}} * Rate_{FA}$$

Beta

$$NDCR = 0.5 + \frac{1}{10 * 20} * 1 = .505$$

Range of NDCR() is [0: $\infty$ )

NDCR = 0.0 is a perfect system

NDCR = 1.0 is equivalent to a system that never detects anything

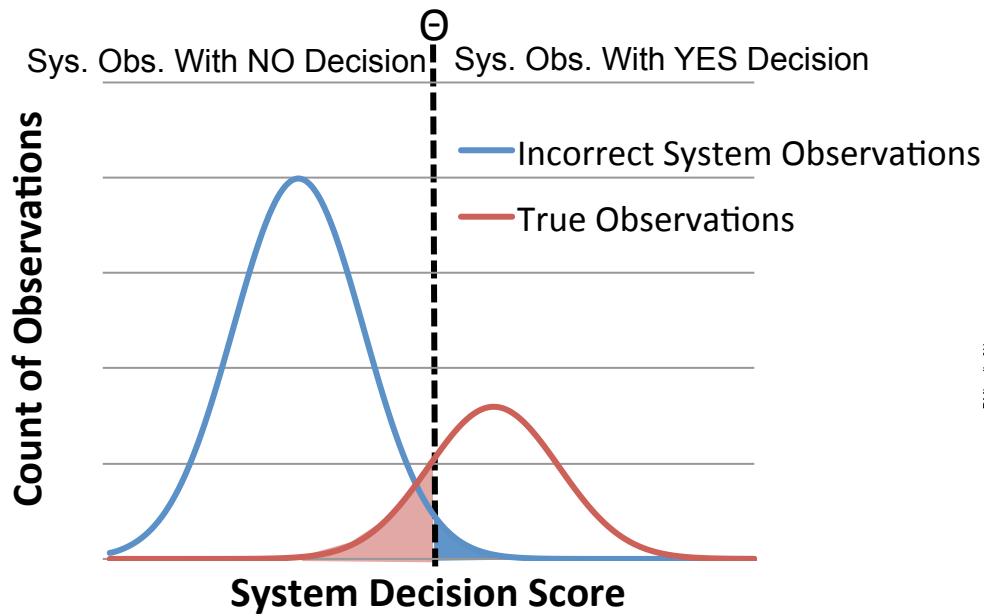
$$Cost_{Miss} = 10$$

$$Cost_{FA} = 1$$

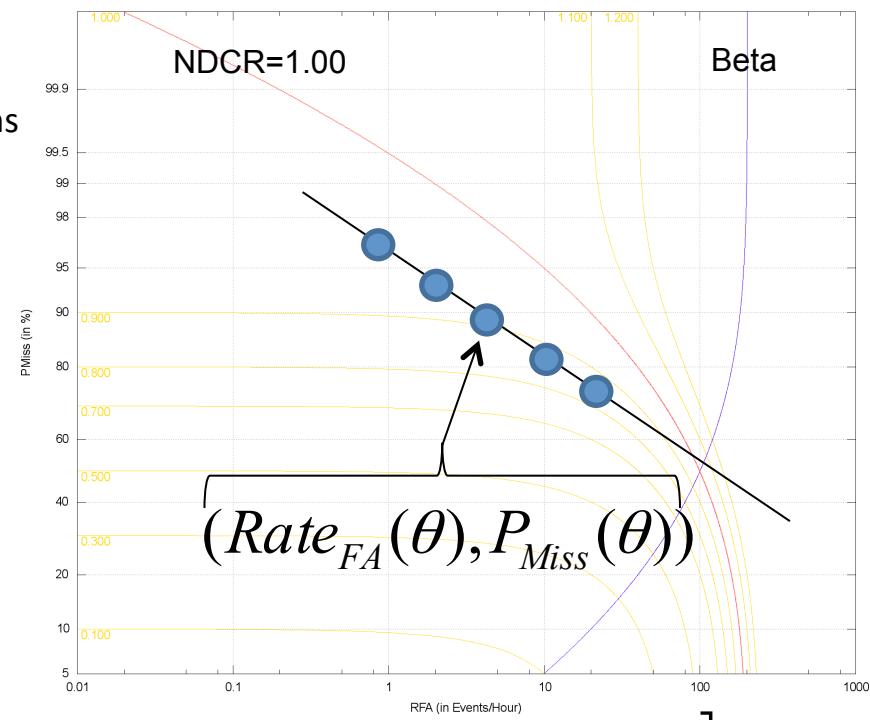
$$Rate_{TARGET} = 20$$

# Step 4: Error Visualization

Detection Error Tradeoff (DET) Curves ( $Prob_{Miss}$  vs.  $Rate_{FA}$ )



Compute  $Rate_{FA}$  and  $P_{Miss}$  for all  $\Theta$



$$\text{MinimumNDCR}(\theta) = \operatorname{argmin}_{\theta} \left[ P_{Miss}(\theta) + \frac{Cost_{FA}}{Cost_{Miss} * Rate_{TARGET}} * Rate_{FA}(\theta) \right]$$

$$\text{ActualNDCR(Act.Dec.)} = P_{Miss}(\text{Act.Dec.}) + \frac{Cost_{FA}}{Cost_{Miss} * Rate_{TARGET}} * Rate_{FA}(\text{Act.Dec.})$$

For more information about DETCurves: [http://www.nist.gov/speech/publications/storage\\_paper/det.pdf](http://www.nist.gov/speech/publications/storage_paper/det.pdf)

# 2011 SED Participants

(with number of systems per event)

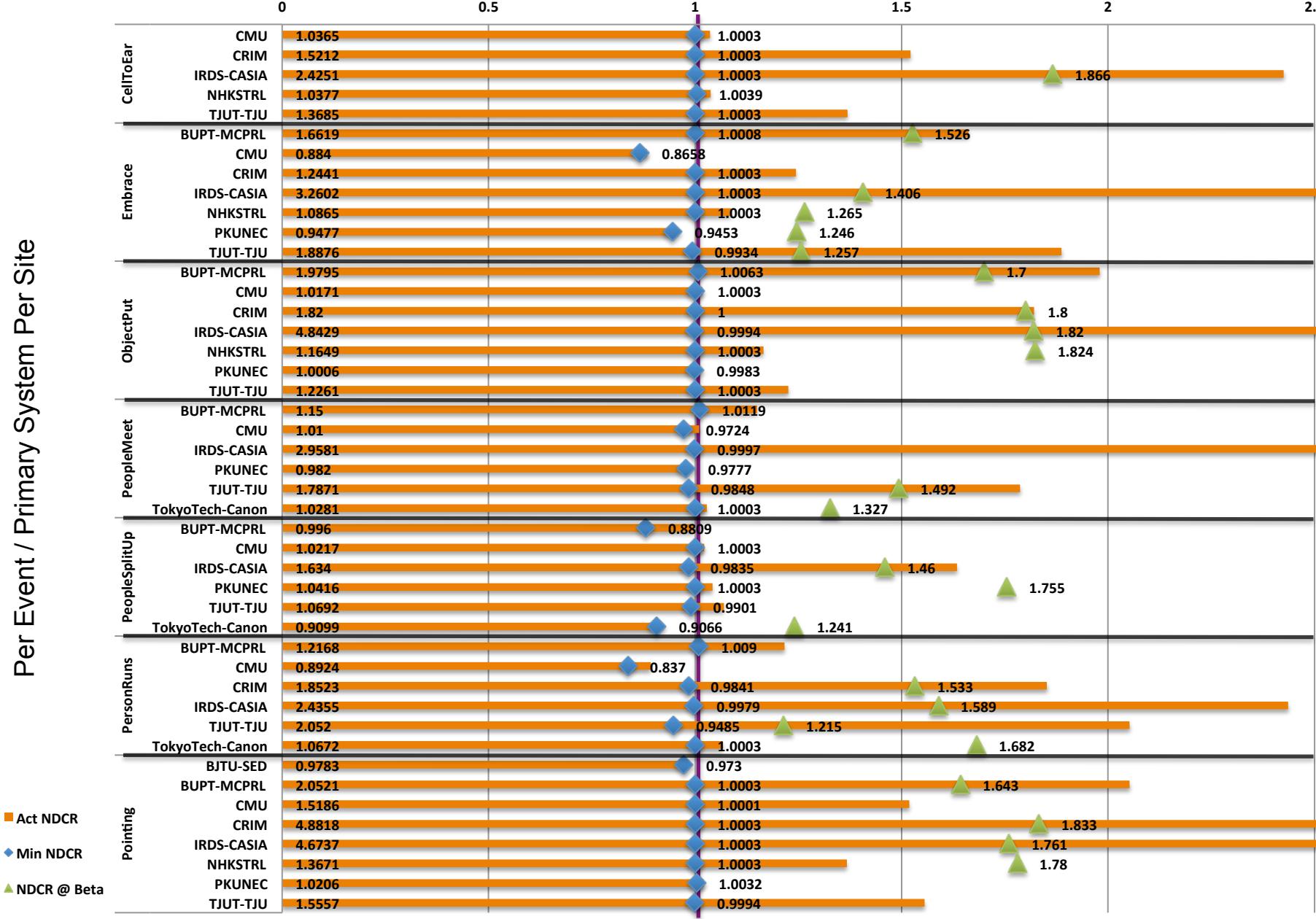
9 participating sites

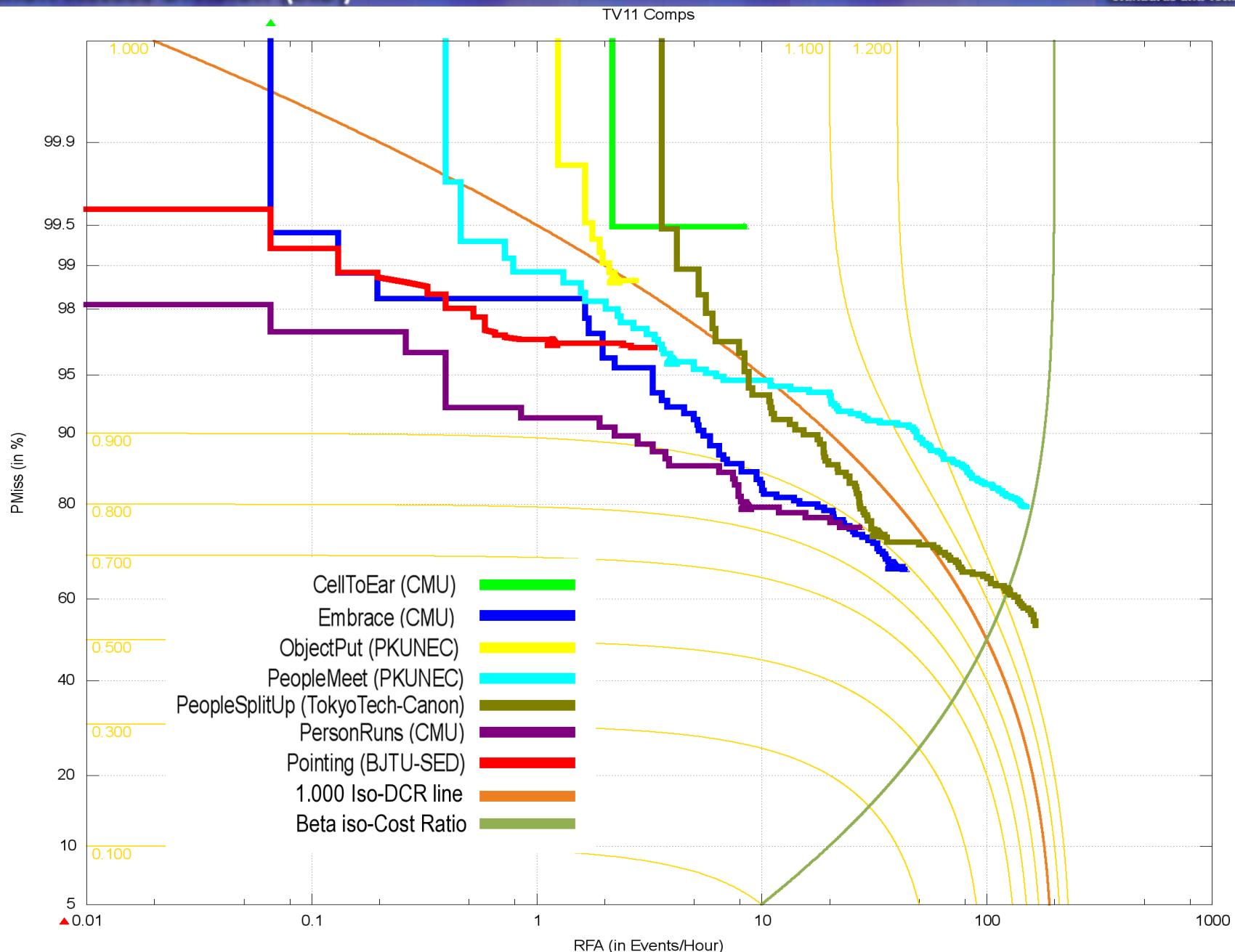
			Single Person				Single Person + Object		Multiple People			PeopleSplitUp
			PersonRuns	Pointing	CellToEar	ObjectPut	Embrace	PeopleMeet				
4 years in a row	Carnegie Mellon University [CMU]		9	9	9	9	9	9	9	9	9	9
	NHK Science and Technical Research Laboratories [NHKSTRL]			1	1	1	1	1				
3 years in a row	Beijing University of Posts and Telecommunications, MCPRL [BUPT-MCPRL]		2	2			2	2	1	1	1	
	Peking University, NEC [PKU-NEC]			3			3	3	3	3	3	
	Tokyo Institute of Technology, Canon [TokyoTech-Canon]		3						3	3	3	
2 years in a row	Centre de Recherche Informatique de Montréal [CRIM]		1	1	1	1	1					
	Beijing Jiaotong University [BJTU-SED]			1	1							
	Tianjin University [TJUT-TJU]		13	13	13	13	13	13	13	13	13	
New	Chinese Academy of Sciences [IRDS-CASIA]		5	5	5	5	5	5	5	5	5	
			Total participants per event				6	8	6	7	7	6

## Information Access Division (IAD)

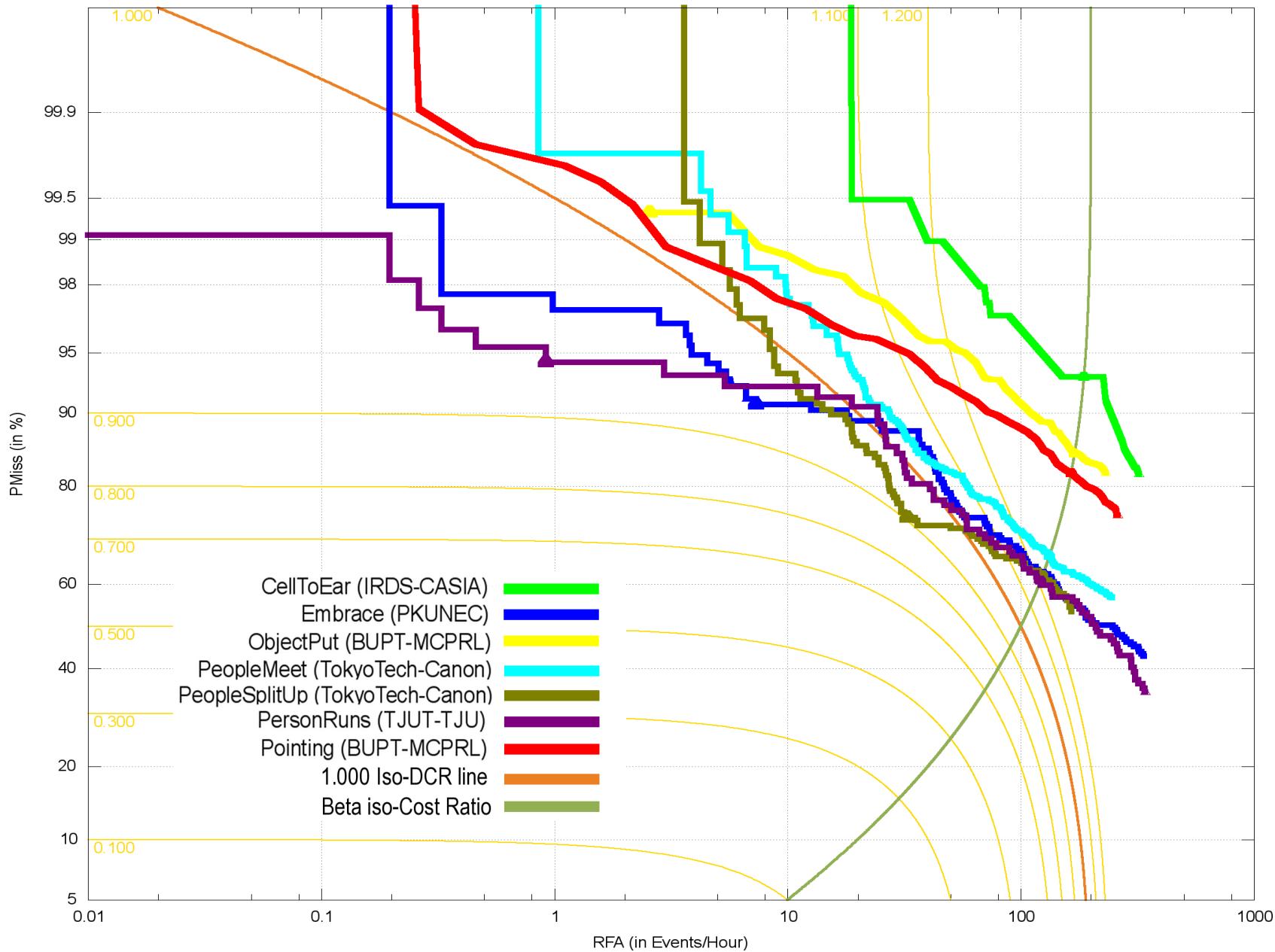
## 2011 NDCRs

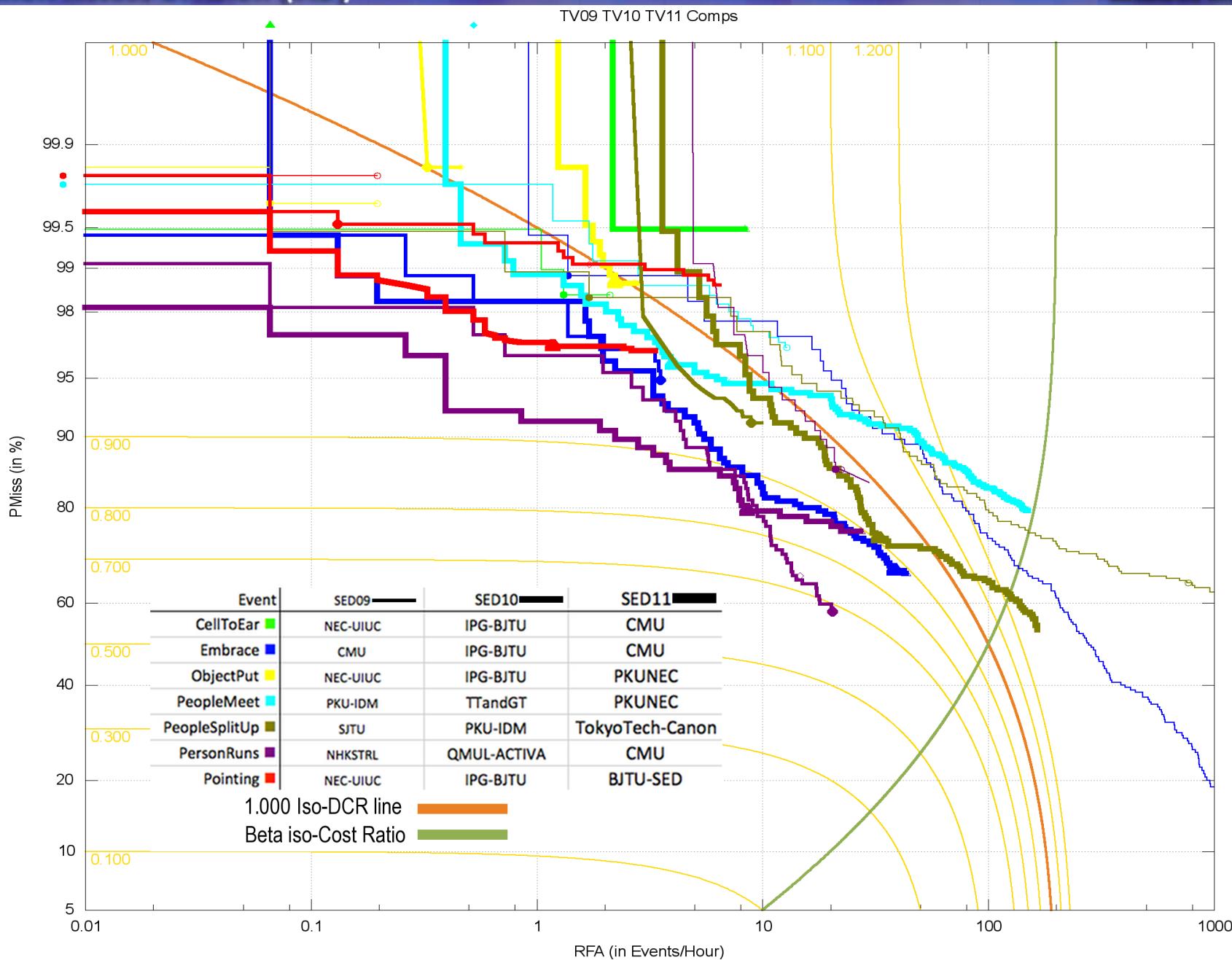
Per Event / Primary System Per Site





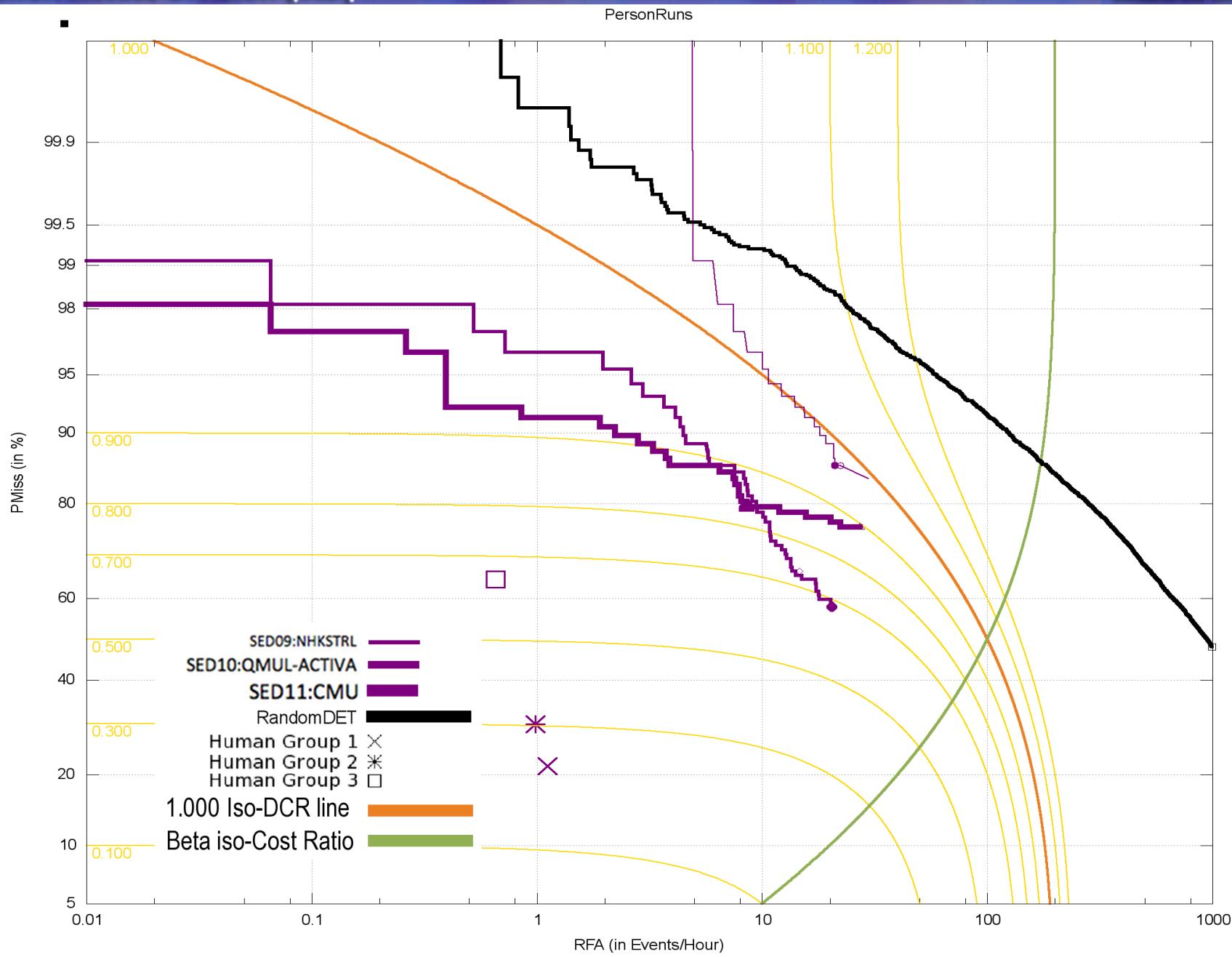
TV11 Comps

2011 Systems with Lowest NDCR @ Beta  
Per Event / Primary System Per Site

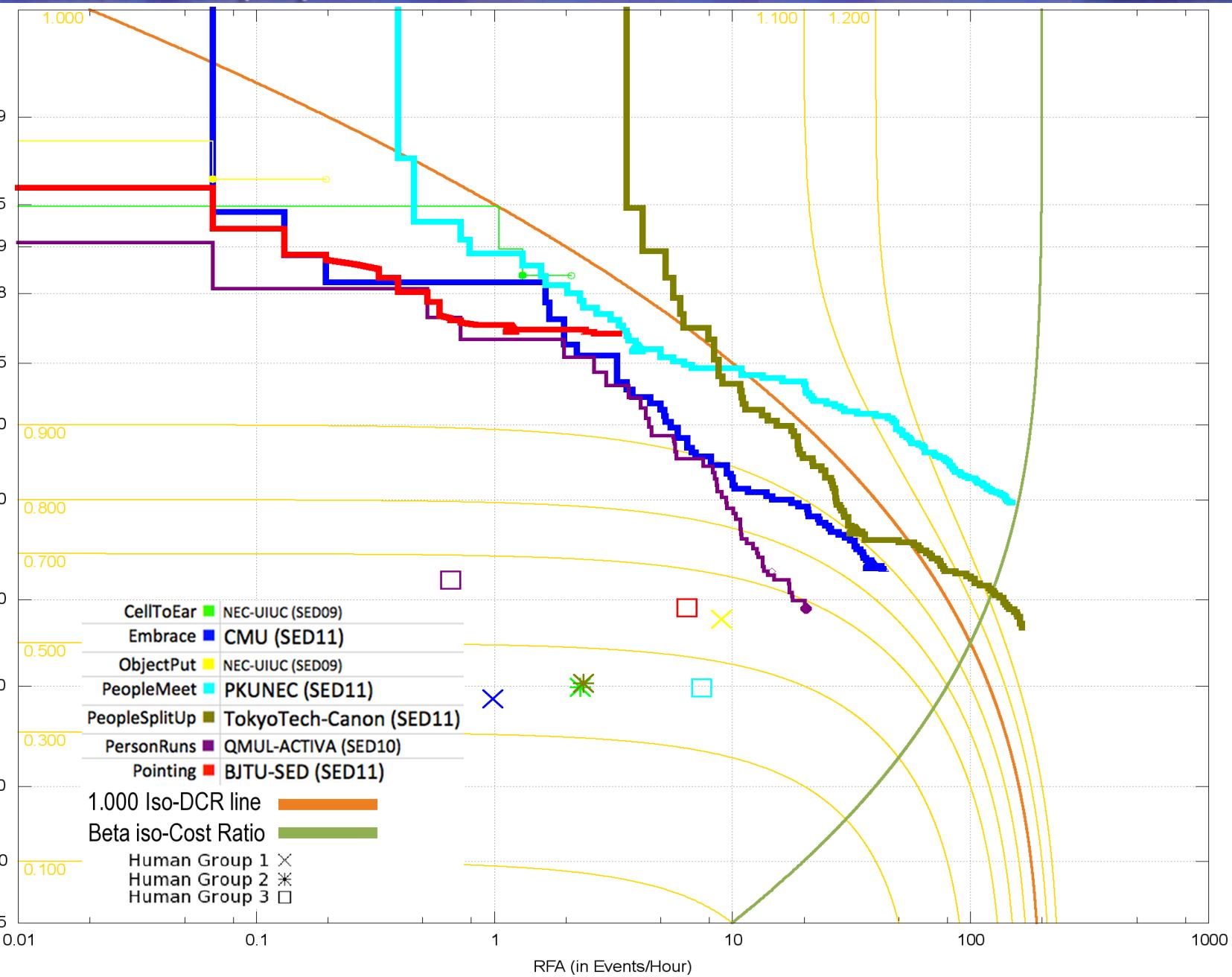
Past SED Systems with Lowest Act NDCR  
Per Event / Only keeping Lowest Act NDCR per comparable past SED

# Past SED Systems with Lowest Act NDCR

PersonRuns Event / Only Lowest Act NDCR per comparable past SED



## Information Access Division (IAD)

Past SED Systems with Lowest Act NDCR  
Per Event / Only keeping Lowest Act NDCR per comparable past SED

# Conclusions and Lessons Learned

- Improvement can be seen in most of the events
  - Improvement over most 2009 and 2010 scores
  - Systems are still not at “Human Group” level
    - Not a solved problem
    - Real world data is challenging
- Questions to think about...
  - Where should we go next ?