### 2010 ICPR Contest on Semantic Description of Human Activities (SDHA)

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## SDHA 2010

- The 1<sup>st</sup> Human Activity Recognition Contest
  - Human activities of general interests
    - Surveillance scenarios
  - Three challenges with three new datasets



Interaction challenge







Wide-area challenge

# SDHA 2010 challenges

- Interaction (UT-Interaction)
  - Continuous videos
    - Detection vs. classification
  - Human-human interactions
- Aerial-view (UT-Tower)

   Low-resolution: small actor
- Wide-area (UCR-Videoweb)
  - Multiple cameras, wide-area
  - Various activities







### **Results overview**

• We have invited the three finalists.

Challenge	TeamName	Authors	Institution	Success	Paper
Interaction	Team BIWI	Yao et al.	ETH	$\bigtriangleup$	Variations of a Hough-Voting Action Recognition System
	TU Graz	-	TU Graz	Х	-
	SUVARI	-	Sabanci Univ. <sup>1</sup>	Х	-
	Panopticon	-	Sabanci Univ. <sup>1</sup>	Х	-
	Imagelab	Vezzani et al.	Univ. of Modena and Reggio Emilia	0	HMM based Action Recognition with Projection Histogram Features
	ECSI_ISI	Biswas et al.	Indian Statistical Institute	0	-
Aerial-view	BU_Action	Guo et al.	Boston University	0	Aerial View Activity Classification by Covariance Matching of Silhouette Tunnels
	Team BIWI	Yao et al.	ETH	0	Variations of a Hough-Voting Action Recognition System
Wide-area	Vistek	-	Sabanci Univ. <sup>2</sup> , Univ. of Amsterdam	Х	-

## **Interaction Challenge**

## Interaction challenge

Previous KTH dataset

- Goal
  - Complex activity recognition from continuous videos
    - Surveillance cameras
  - Interactions



VS.

New **UT-Interaction** dataset



Human interactions

Pedestrians

Multiple activities

- Dynamic surveillance-type environments
  - Pedestrians

## **UT-Interaction dataset**

- Dataset description
  - 720\*480
  - Six types of humanhuman interactions
  - Two different sets



- Different background: parking lot vs. lawn
- 10 scenes for each set
- More than 120 activity executions







## Evaluation

- Cross validation
  - 10 scenes, leave-one-out = 10-folds



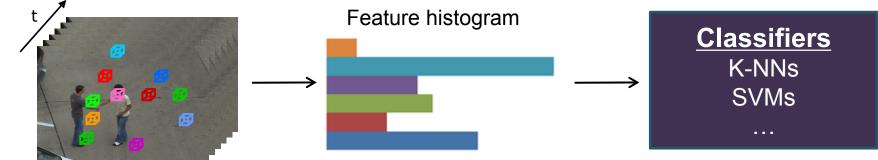
- Two problems
  - Classification
    - Choose activity category given segmented videos.
  - Detection
    - Localization in continuous videos

## UT-Interaction results – set1

#### **Classification accuracies:**

	Shake	Hug	Kick	Point	Punch	Push	Total
Laptev + kNN	0.18	0.49	0.57	0.88	<u>0.73</u>	0.57	0.57
Laptev + Bayes.	0.38	0.72	0.47	0.9	0.5	0.52	0.582
Laptev + SVM	0.49	0.79	0.58	0.8	0.6	0.59	0.642
Latpev + SVM (best)	0.5	0.8	0.7	0.8	0.6	0.7	0.683
Cuboid + kNN	0.56	0.85	0.33	0.93	0.39	0.72	0.63
Cuboid + Bayes.	0.49	0.86	0.72	0.96	0.44	0.53	0.667
Cuboid + SVM	0.72	0.88	0.72	0.92	0.56	0.73	0.755
Cuboid + SVM (best)	<u>0.8</u>	0.9	0.9	<u>1</u>	0.7	0.8	0.85
Team BIWI	0.7	<u>1</u>	<u>1</u>	<u>1</u>	0.7	<u>0.9</u>	<u>0.88</u>

#### **Baseline methods:**

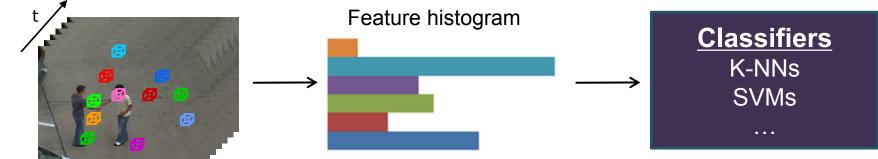


## UT-Interaction results – set2

#### **Classification accuracies:**

	Shake	Hug	Kick	Point	Punch	Push	Total
Laptev + kNN	0.3	0.38	0.76	0.98	0.34	0.22	0.497
Laptev + Bayes.	0.36	0.67	0.62	0.9	0.32	0.4	0.545
Laptev + SVM	0.49	0.64	0.68	0.9	0.47	0.4	0.597
Latpev + SVM (best)	0.5	0.7	0.8	0.9	0.5	<u>0.5</u>	0.65
Cuboid + kNN	0.65	0.75	0.57	0.9	0.58	0.25	0.617
Cuboid + Bayes.	0.26	0.68	0.72	0.94	0.28	0.33	0.535
Cuboid + SVM	0.61	0.75	0.55	0.9	0.59	0.36	0.627
Cuboid + SVM (best)	<u>0.8</u>	<u>0.8</u>	0.6	0.9	0.7	0.4	0.7
Team BIWI	0.5	<u>0.9</u>	<u>1</u>	<u>1</u>	<u>0.8</u>	0.4	<u>0.77</u>

#### **Baseline methods:**



### Interaction summary

- Classification problem
  - Successful results with UT-Interaction dataset.
  - Hierarchical approaches
    - Actions of each actor in human-human interaction
- Detection problem
  - Continuous recognition was requested.
  - **None** among four teams succeeded.
  - Future exploration
    - A hierarchical approach showed its potential.

## **Aerial-view Challenge**

## Aerial-view challenge

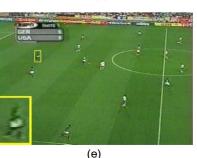
- Goal
  - Classification of human actions from
     **low-resolution** videos
    - Human height: 20 pixels
  - Top-down viewpoint
    - Unmanned aerial vehicles (UAVs)



(a)





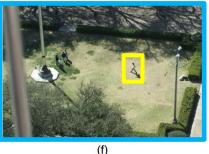












## **UT-Tower dataset**

- Dataset description
  - 360\*240
  - -9 types of actions
  - Two different settings
    - Lawn vs. square





## Evaluation

- Classification problem
  - Segmented videos
    - Only one action per video.



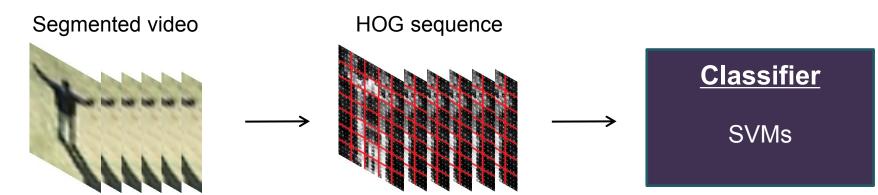
- Bounding boxes and foreground masks
  - Spatial information provided.
- Cross validation
  - 108 videos, 108 leave-one-out
    - 107 training videos and 1 testing video
    - Abundant training videos

## **UT-Tower results**

#### **Classification accuracies:**

	Point Stand	l Dig	Walk (	Carry	Run	Wave 1	Wave 2	Jump	Total
Team <b>BIWI</b>	<u>100</u> 91.7	<u>100</u>	<u>100</u>	<u>100</u>	<u>100</u>	83.3	83.3	<u>100</u>	95.4
<b>BU Action</b>	91.7 83.3	<u>100</u>	<u>97.2</u>						
ECSU_ISI	<u>100</u> 83.3	91.7	<u>100</u>	<u>100</u>	<u>100</u>	<u>100</u>	91.7	91.7	95.4
Imagelab	83.3 83.3	<u>100</u>	96.3						
Baseline	<u>100</u> 83.3	<u>100</u>	<u>100</u>	<u>100</u>	<u>100</u>	83.3	<u>100</u>	<u>100</u>	96.3

#### **Baseline method:**



## Aerial-view summary

- Most of the teams showed successful results.
  - Abundant training data: 107 training, 1 testing.
  - Baseline method also showed good results.
- Spatial info. provided: Bounding boxes
   Good segmentation method required.
- Classification vs. detection?

- Most difficult action: Standing

## Wide-area Challenge

## Wide-area challenge

- Open challenge using large-scale dataset
  - Multiple cameras observing a wide-area
    - Surveillance
  - Contestants were asked to formulate their own problem.



# Open challenge

- Select a portion of the entire dataset
   39 possible scenes
- Choose evaluation
  - What activity will the system recognize?
  - Classification? Detection? Multiple cameras?
- Example problems
  - Detecting interactions between two persons
    - Hand-shake
  - Group activities
    - A person joining a group

## UCR-Videoweb dataset

- Continuous dataset
  - 2.5 hours of videos divided into 39 scenes.
  - -4~8 cameras
  - Multiple types of activities
    - Human interactions, group actions, vehicles, ...

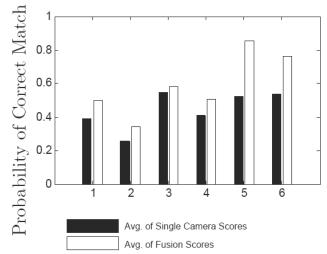


## Example results - 1

- Human interaction detection problem
  - A setting similar to the interaction challenge

Interaction	Our recognition accuracy	False positive rate
Shake hands	0.68	0.57
Hug	0.74	0.55
Point	0.63	0.25

- Multi-camera retrieval problem
  - Retrieving similar activities using multiple cameras.



Different Action Classes

## Example problems - 2

Group activity detection

Activity	Precision	Recall	Total	True	Ground
			$\mathbf{Fetched}$	Pos.	Truth
Person Entering Building	1	1	4	4	4
Person Exiting Building	1	1	2	2	2
Person Entering Vehicle	0.75	0.75	4	3	3
Person Exiting Vehicle	1	1	3	3	3
People Walking Together	1	0.6	3	3	5
People Coming Together	0.7	0.7	7	5	5
People Going Apart	0.8	1	5	4	5
People Milling Together	0.78	0.92	14	11	13
People Meandering Together	0.85	0.92	27	23	25
Group Formation	1	0.78	7	7	9
Group Dispersal	0.8	0.8	5	4	4
Person Joining Group	1	0.95	18	18	19
Person Leaving Group	1	1	11	11	11

### Wide-area summary

- Open challenge
  - UCR-Videoweb dataset with 2.5 hours of videos
- Provided a test bed for approaches
  - Difficult problems can be posed.
    - Continuous videos
    - Multiple cameras (4~8)
    - Various activities



[Kamal, A., Sethi, R., Song, B., Fong, A., Roy-Chowdhury, A.: Activity recognition results on UCR Videoweb dataset. In: Technical Report, Video Computing Group, University of California, Riverside (2010)]

## Summary

- Introduced 3 new datasets/challenges.
- 8 teams attempted these challenges.
  - We invited 3 finalists based on their algorithms and results.
- No winner for the *interaction* and *wide-area*.
- The winner of *aerial-view* challenge is
  - Team BU Action Covariance Manifolds
    - Kai Guo, Prakash Ishwar, and Janusz Konrad
- Remaining problem: continuous recognition

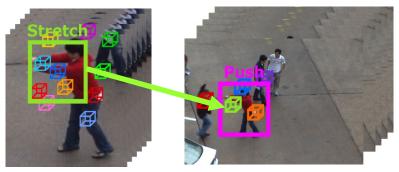
# Thank you

• Thank you for your participation!

- The SDHA contest finalists will present their algorithms and results.
  - Imagelab: University of Modena and Reggio Emilia
  - BU Action Covariance Manifolds: Boston University
  - Team BIWI: етн

# Coming up next

- UT-Interaction dataset version 1.5
  - Sub-event labels
     for hierarchical
     recognition



- Result updates
  - Results of other research works
    - e.g. BMVC 2010
    - We will maintain the performance tables.
      - http://cvrc.ece.utexas.edu/SDHA2010
- 2<sup>nd</sup> SDHA?