# **Action recognition**

Cordelia Schmid

**INRIA** Grenoble



#### Action recognition – examples

• Short actions, i.e. answer phone, shake hands

answer phone



hand shake



Hollywood dataset



#### Action recognition – examples

• Activities/events, i.e. birthday party, grooming an animal



Birthday party

Grooming an animal



#### TrecVid Multi-media event detection task (MED)



### Action recognition - tasks

• Action classification: assigning an action label to a video clip





...

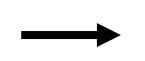
Making sandwich: present Feeding animal: not present



### Action recognition - tasks

• Action classification: assigning an action label to a video clip

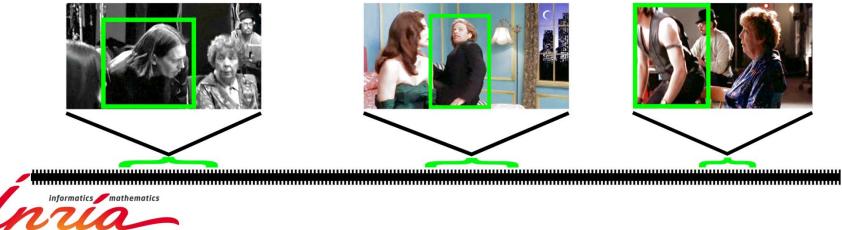




. . .

Making sandwich: present Feeding animal: not present

• Action localization: search locations of an action in a video



### Action recognition - tasks

• Action localization + interaction with an object





[Prest et al., PAMI 13]

## Why automatic video understanding?

#### Huge amount of video is available and growing daily

B B C Motion Gallery



TV-channels recorded since 60's



>34K hours of video upload every day





~30M surveillance cameras in US => ~700K video hours/day

### Why automatic video understanding?

- Query for videos in professional Archives and YouTube
- Analyze and describe content of videos



Education: How do I make a pizza?



Sociology research: Influence of character smoking in movies

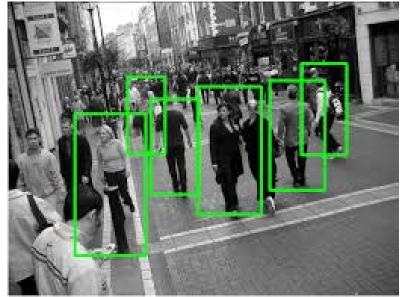


### Why automatic video understanding?

- Car safety & self-driving and video surveillance
  - Detection of humans (pedestrians) and their motion, detection of unusual behavior



**Courtesy Volvo** 



**Courtesy Embedded Vision Alliance** 



• Complete description (story) of a video





• Complete description (story) of a video





• Complete description (story) of a video





• Complete description (story) of a video





### Action recognition - difficulties

- Large variations in appearance
  - Viewpoint changes
  - Intra-class variation
  - Camera motion



### Variation in appearance: viewpoint change







### Variation in appearance: intra-class variation







### Variation in appearance: camera motion







### Action recognition - difficulties

- Large variations in appearance
  - Viewpoint changes
  - Intra-class variation
  - Camera motion
- Manual collection of training data is difficult
  - Many action classes, rare occurrence
  - Pose and object annotation often a plus
- Action vocabulary is not well defined
  - What is the action granularity?
  - How to represent composite actions?



### Action recognition – approaches

- Action recognition from still images
  - Human pose + interaction with objects
  - Extract key frames from video



Results on PASCAL VOC 2010 Human action classification dataset [Prest et al., PAMI 2012]



### Action recognition – approaches

• Motion information necessary to disambiguate actions



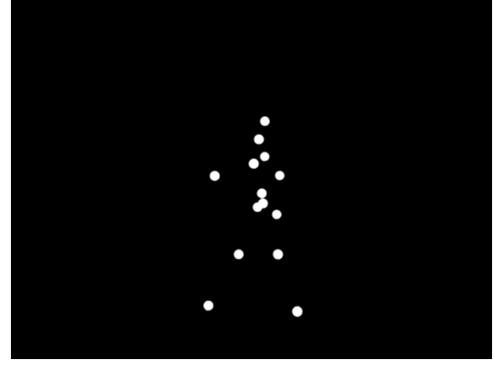
Open or close door?

• Motion often sufficient by itself



## Motion perception

- Gunnar Johansson [1973] pioneered studies on sequence based human motion analysis
- Moving light displays enable identification of motion, familiar people and gender





male walker

## **Overview**

- Optical flow
- Video classification
  - Bag of spatio-temporal features
- Action localization
  - Spatio-temporal human localization

