

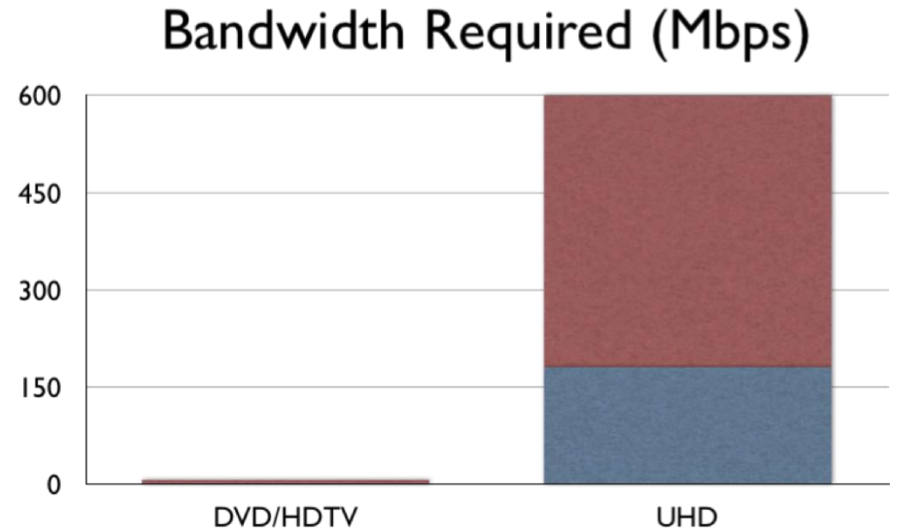
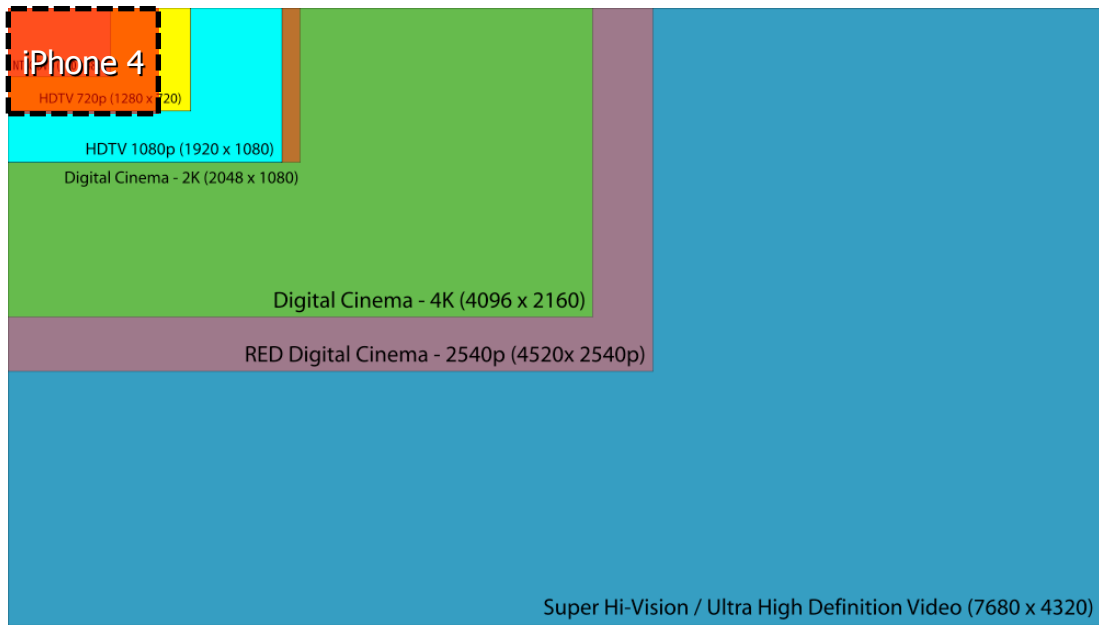
# Crowdsourced Automatic Zoom and Scroll for Video Retargeting

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IRIT (Toulouse, France)



## **Video retargeting:**

Making a large video fit into a smaller screen and available with network capacities.

# One simple way:

Scale down the video to the resolution  
of the screen

# Example



# Drawback:

Important details may not be visible

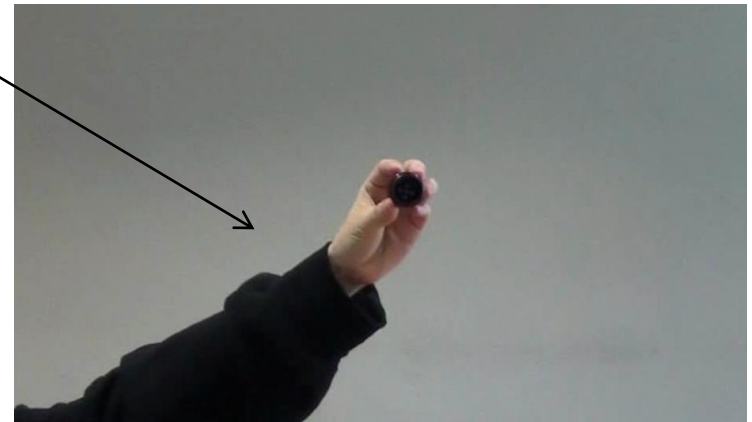
# What makes a good video retargeting ?

- Good comprehension of the video content
- The video is aesthetically satisfying

Important region



Zoom



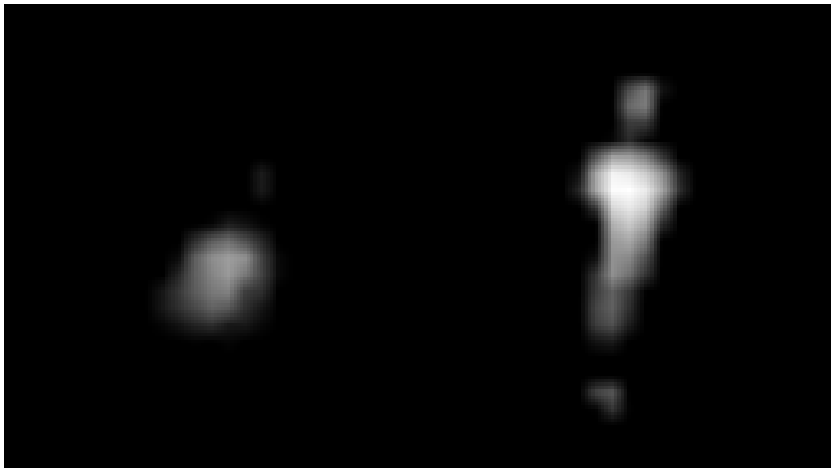
**Idea:** Zoom and scroll to show only interesting regions of the video





Problem: how to find the  
region **automatically** ?

# Approaches using Content Analysis



Saliency map

Motion detection

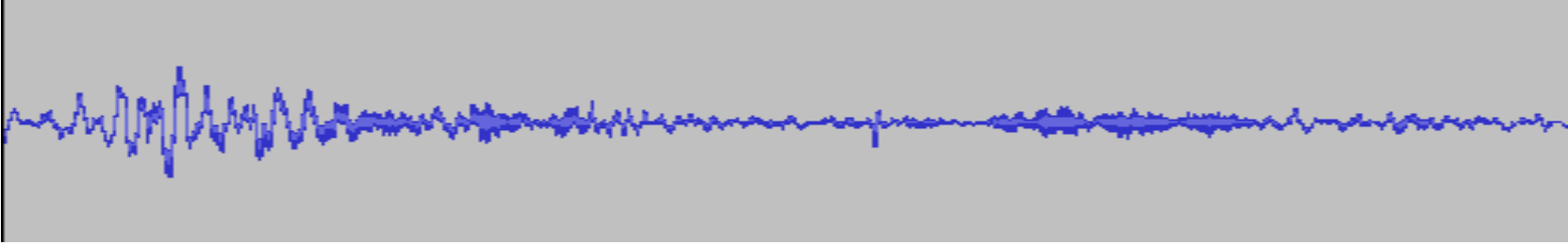
**Too many regions**

Liu, Gleicher

MM 06

Avidan, Shamir

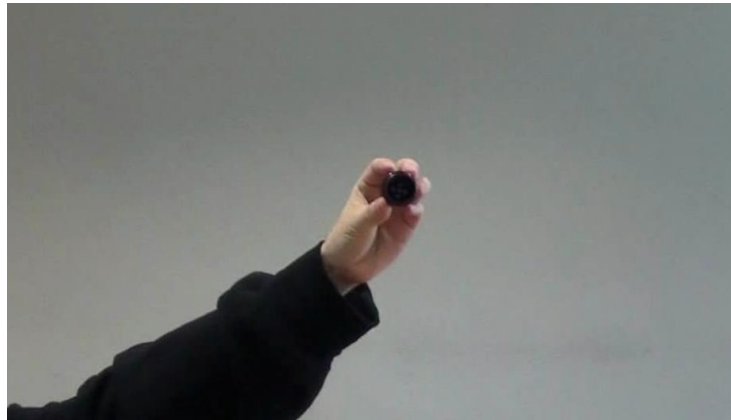
Commun. ACM 09



Speech Recognition + Natural Language processing



Object recognition

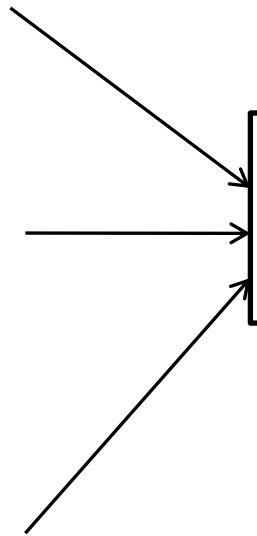


# Our idea: Crowdsourcing

Identifying regions of interest by gathering implicit input from users.



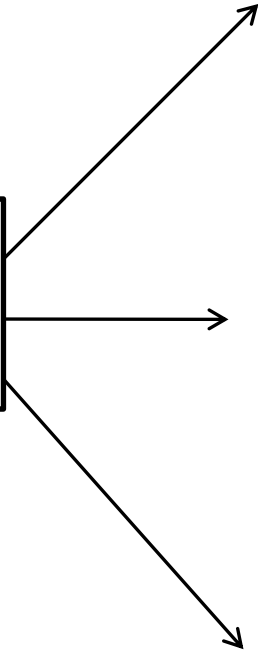
Active  
Viewers



Viewer  
traces



Retargeted  
video



Passive  
Viewers

Use zoomable video

# Interface

## Dice Trick (Ch)

**Card Trick**

**Card Transfert**

**Dice Trick (En)**

**Dice Trick (Ch)**

**<< Index**



0:12 / 2:39

00:00



# Example of user interaction

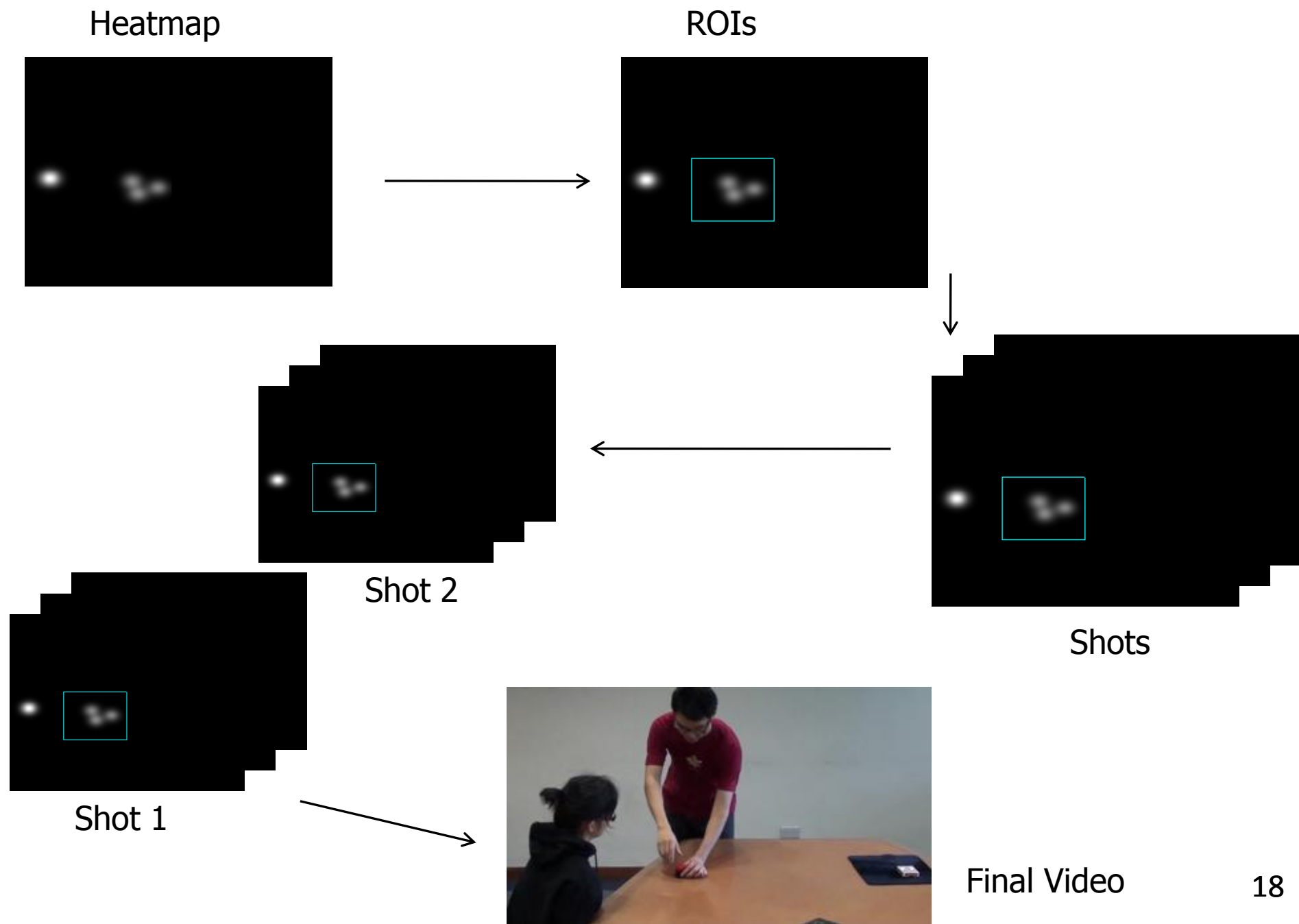




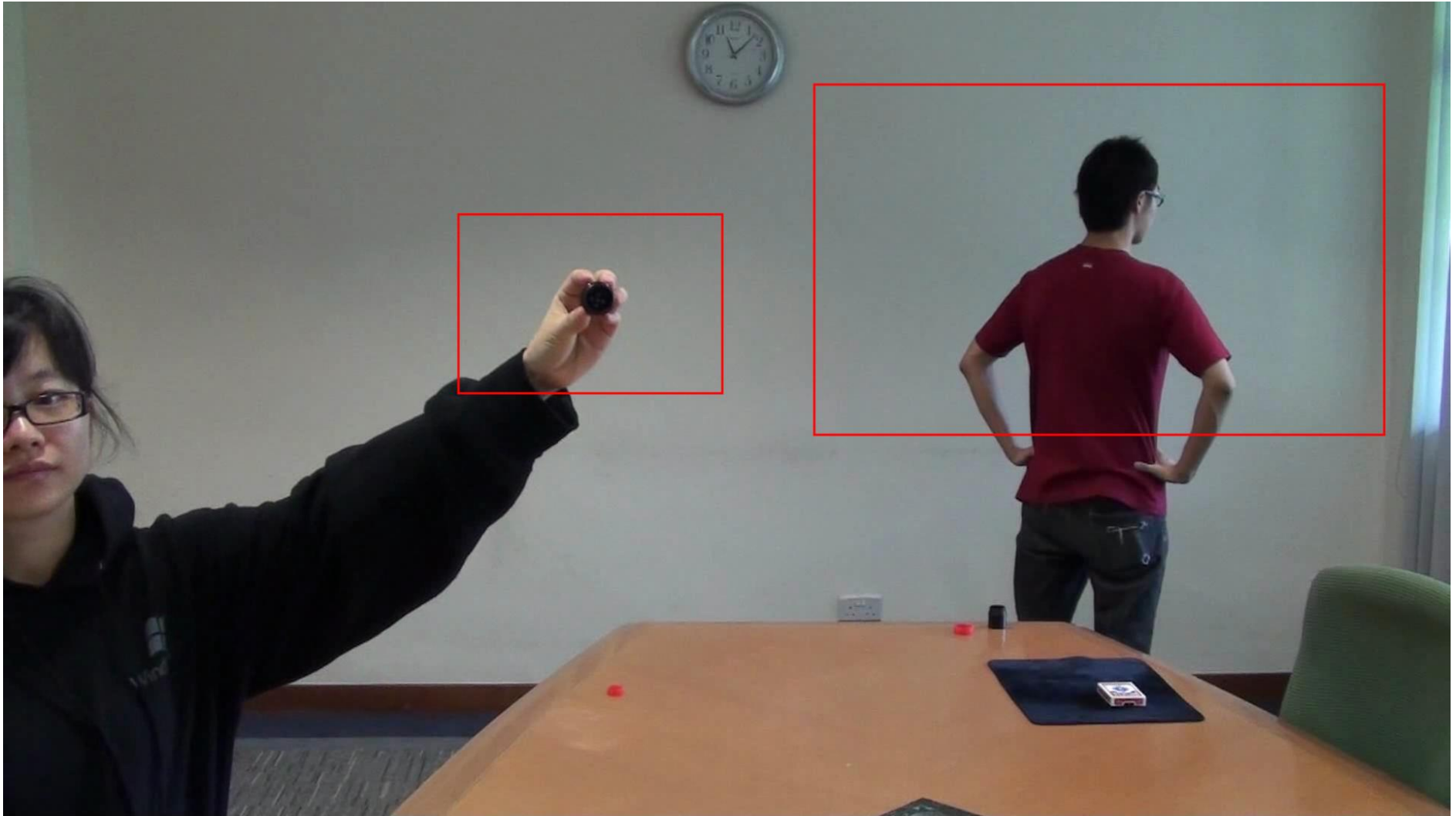
# Crowdsourcing

- Tutorial: how to use the interface ?
- Magic videos :
  - HD Videos : 1920 × 1080 pixels
  - Fixed camera
  - Obvious ROIs : magician's hands, cards, dice...
- Between 7 and 12 viewers for each video
- 11,183 interaction events logged

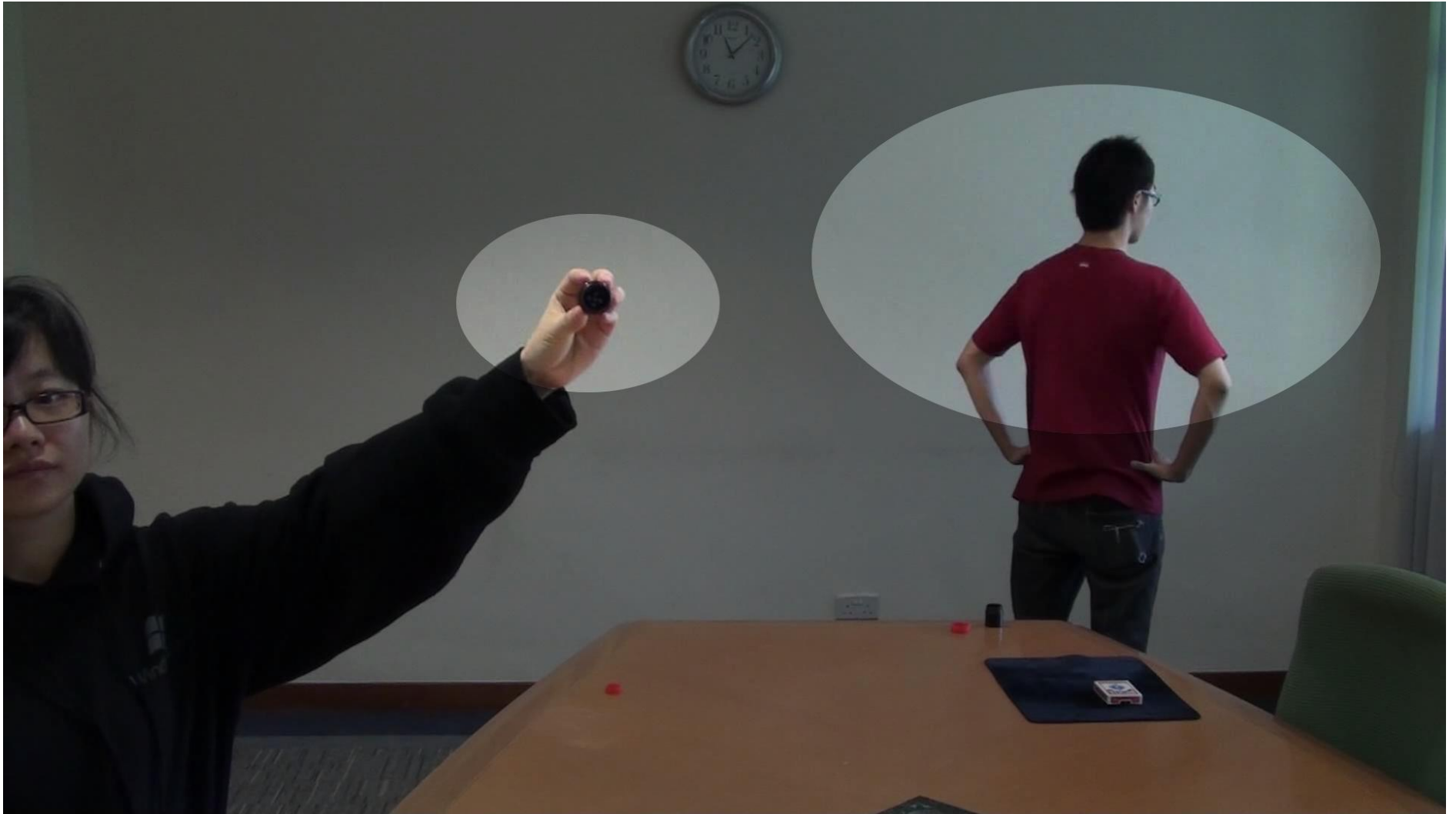
# Automatic Generation of Retargeted Video



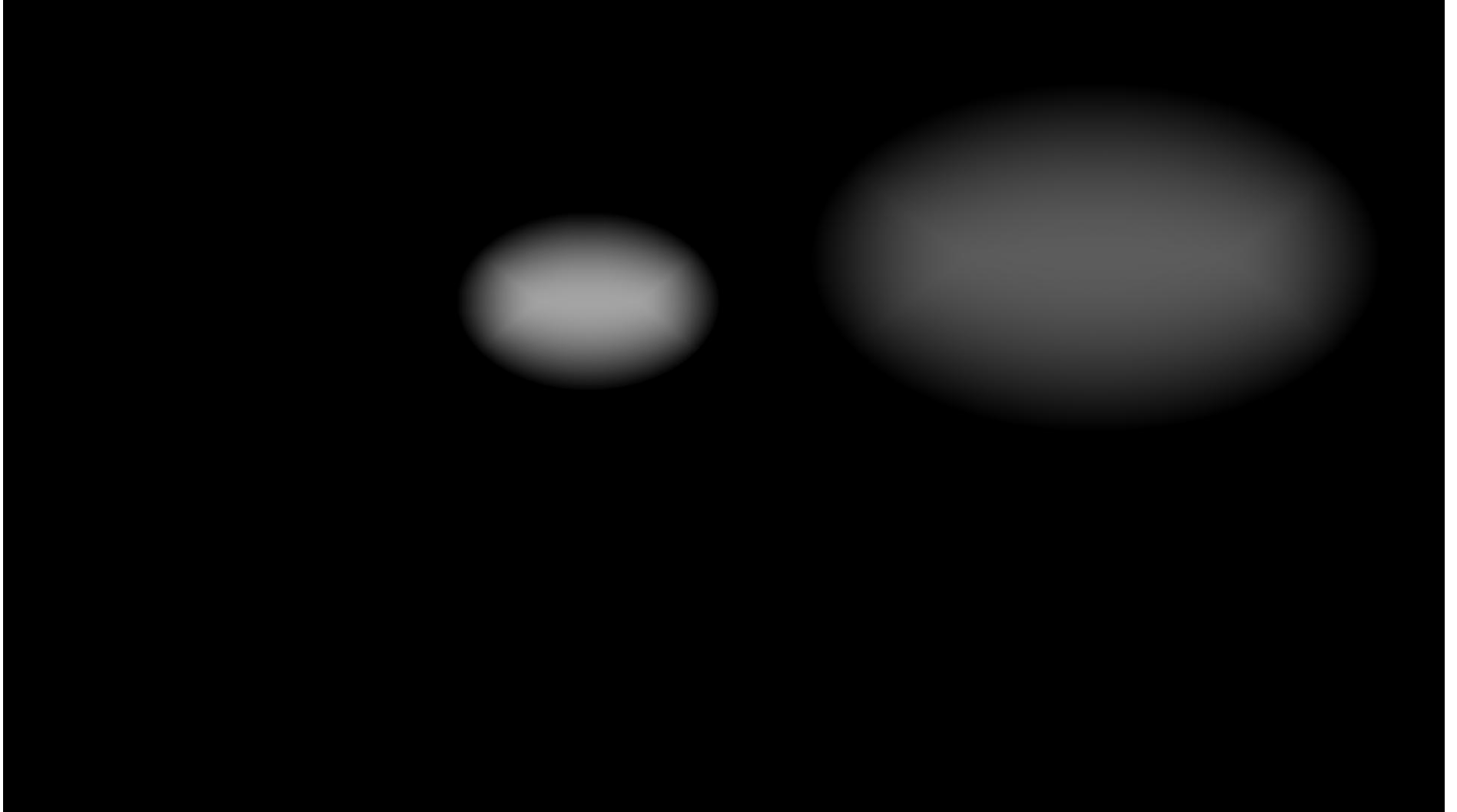
# Building Heatmaps



# Building Heatmaps



# Building Heatmaps



# Analyzing Heatmaps

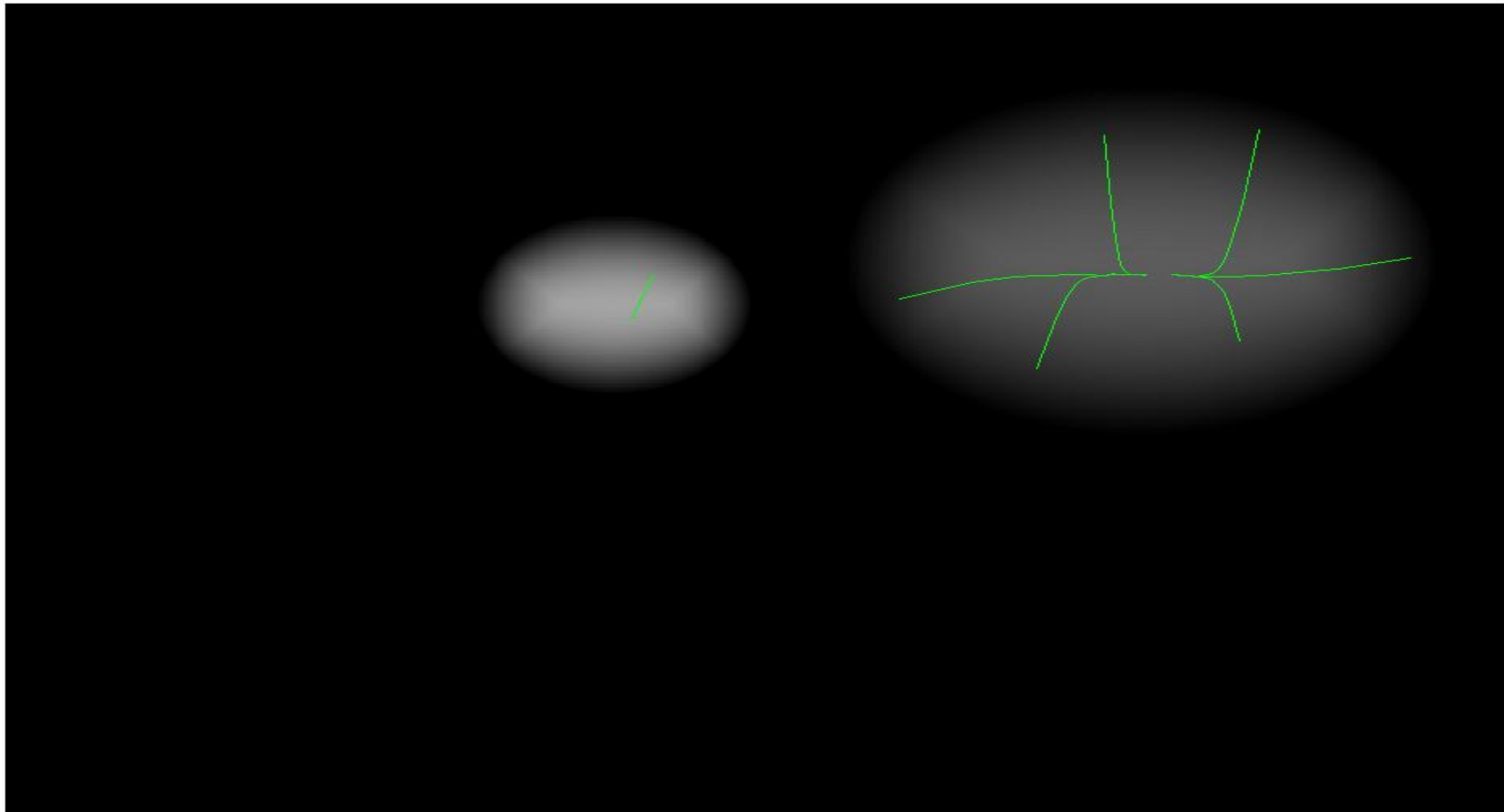
Here draw gaussians in 3d with matlab

Mean Shift { GMM (Gaussian Mixture model)

- K
- $w_i$
- $m_i$
- $\Sigma_i$

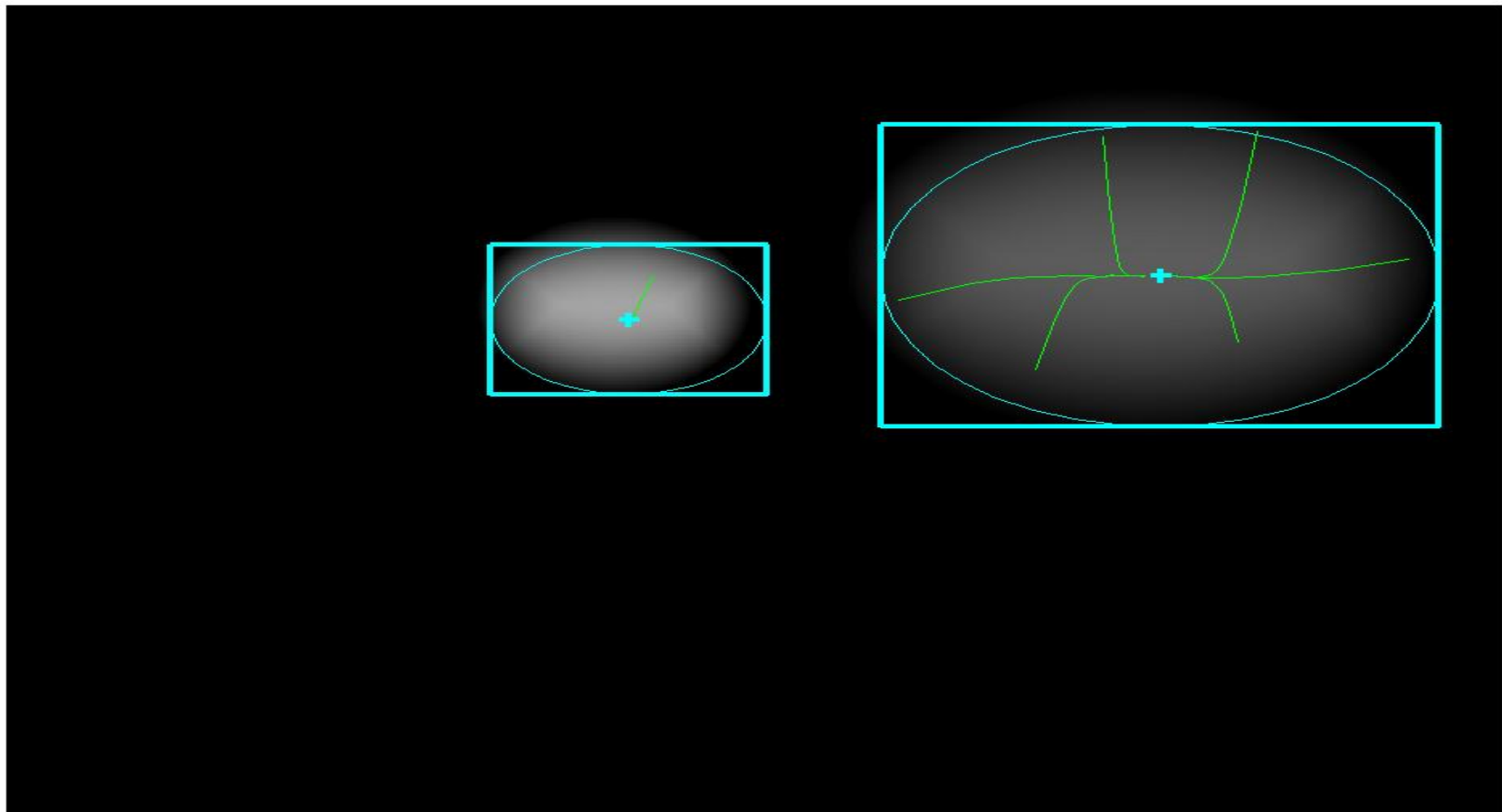
# Finding Modes

Mean-Shift: Clustering algorithm  
(Comaniciu, ICCV 02)



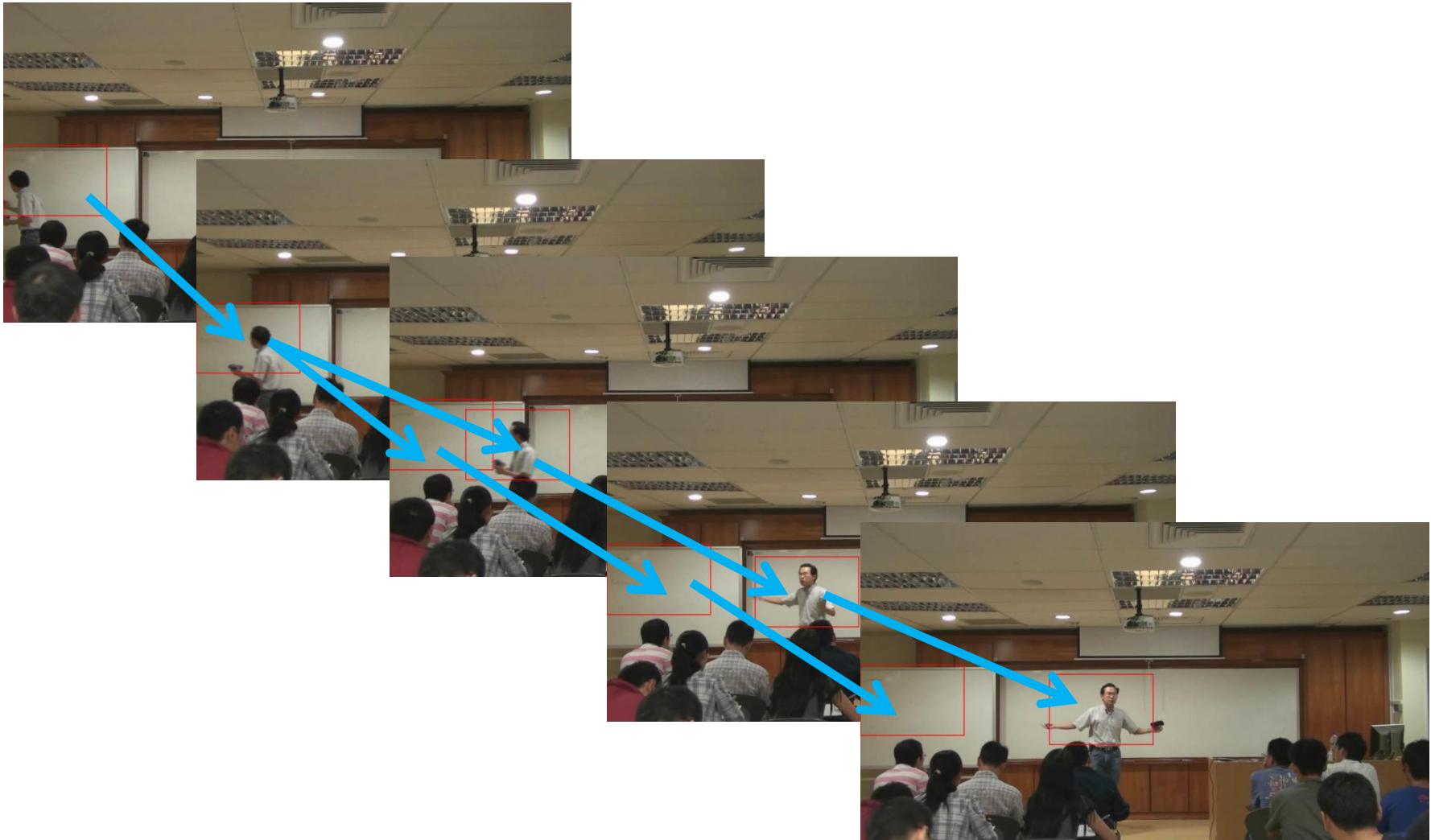
# Determining ROI size

Minimum Covariance Determinant (MCD)

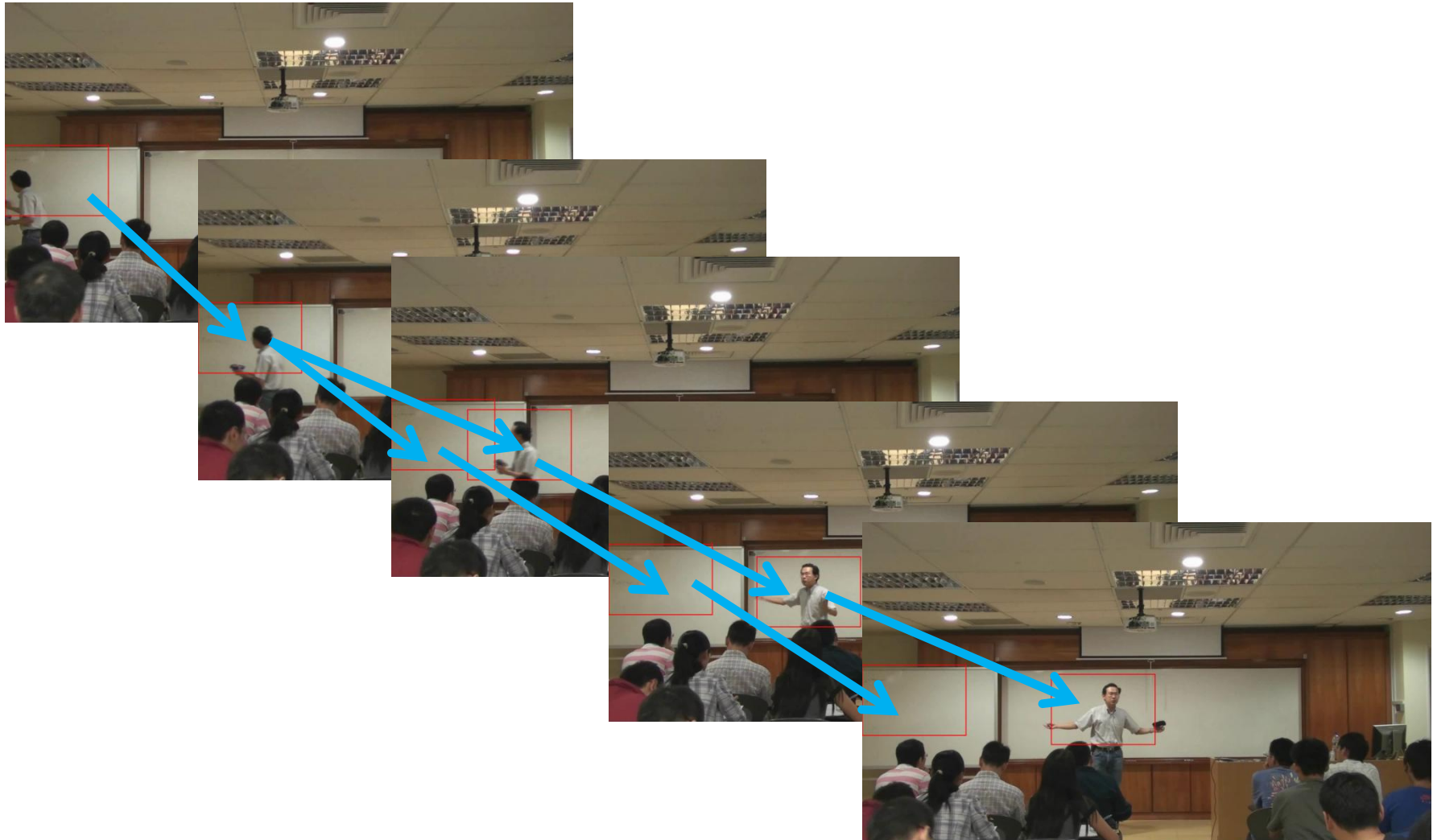




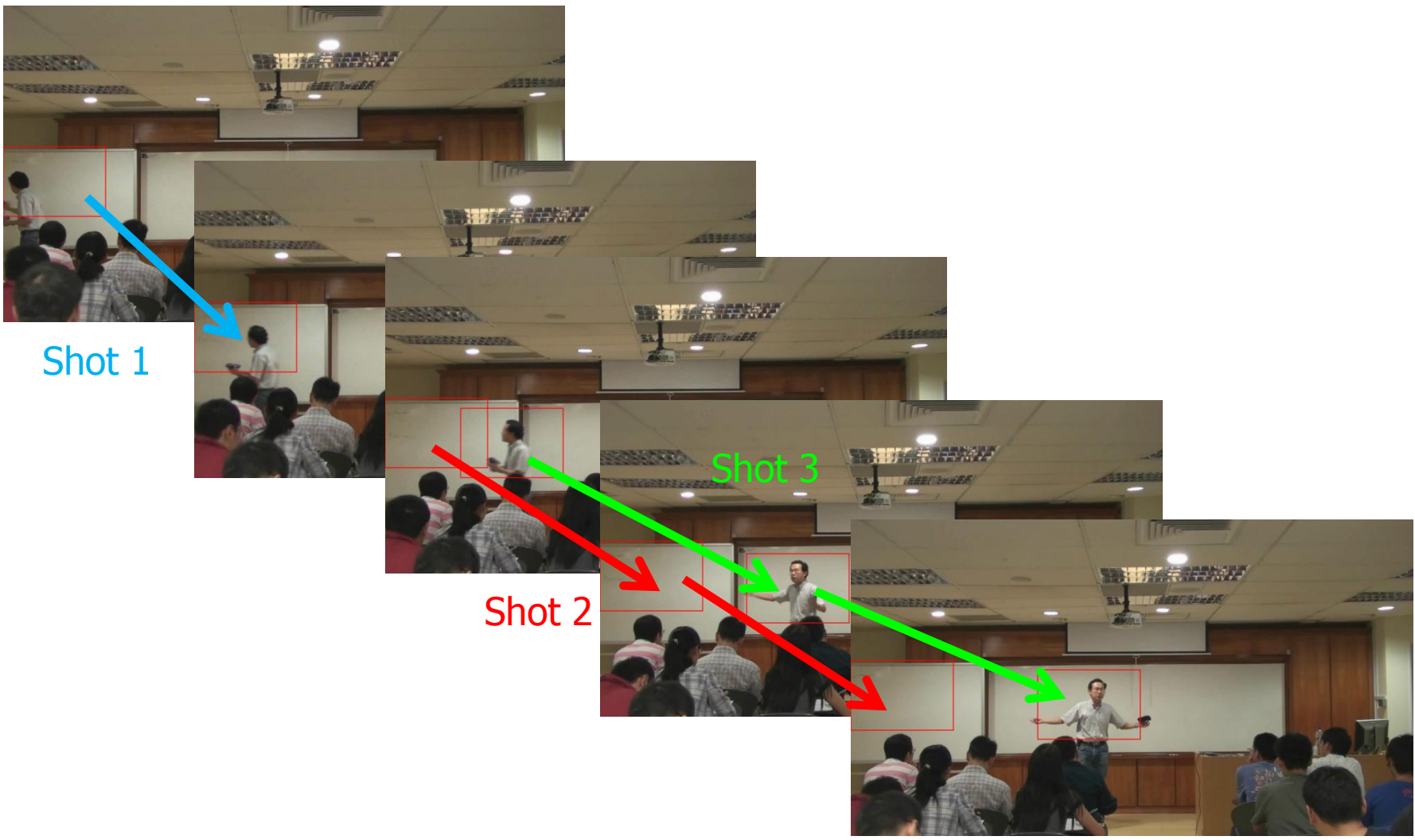
# Building a ROI Dynamics Graph



# Cutting the graph into shots



# Shots selection



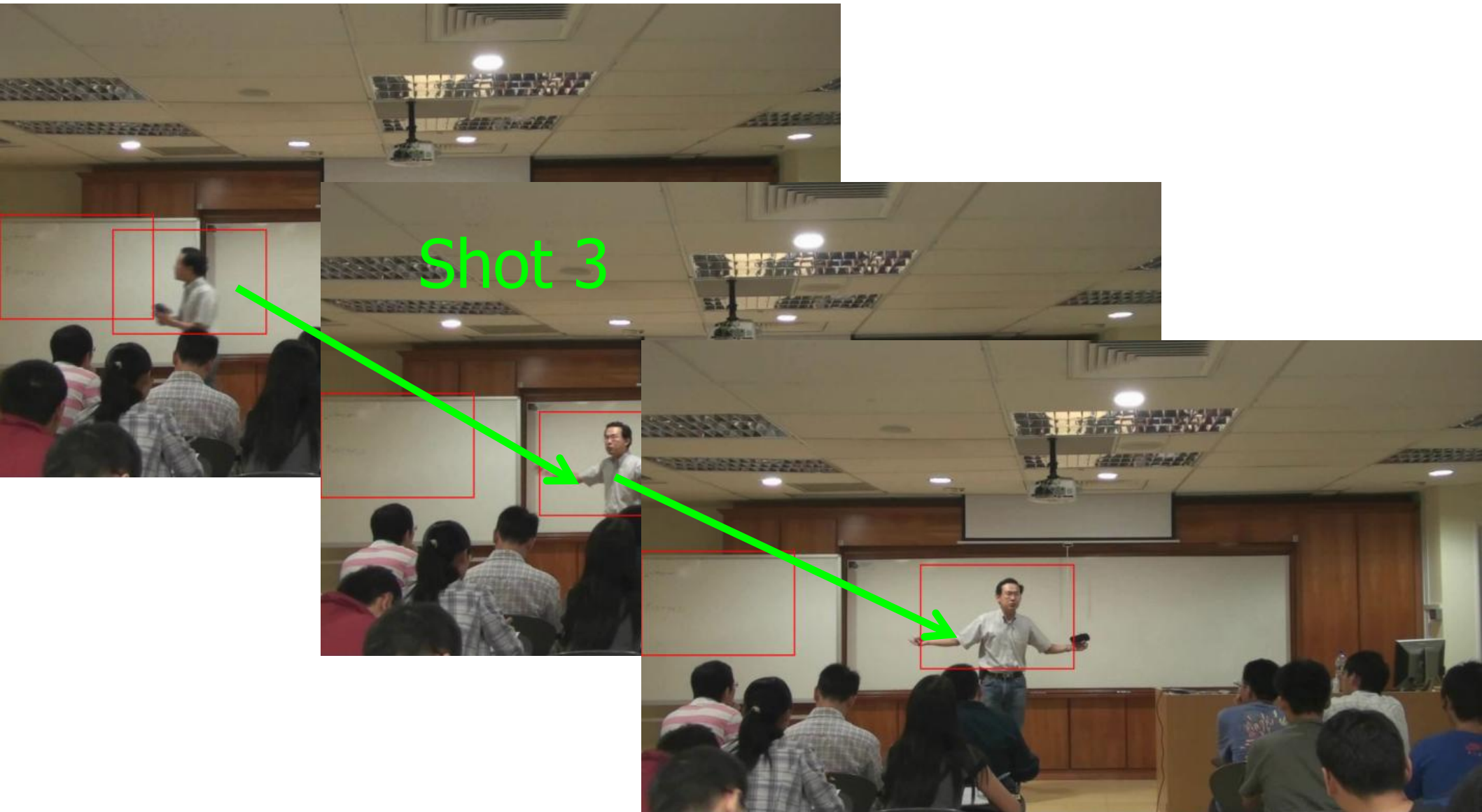
# Result video



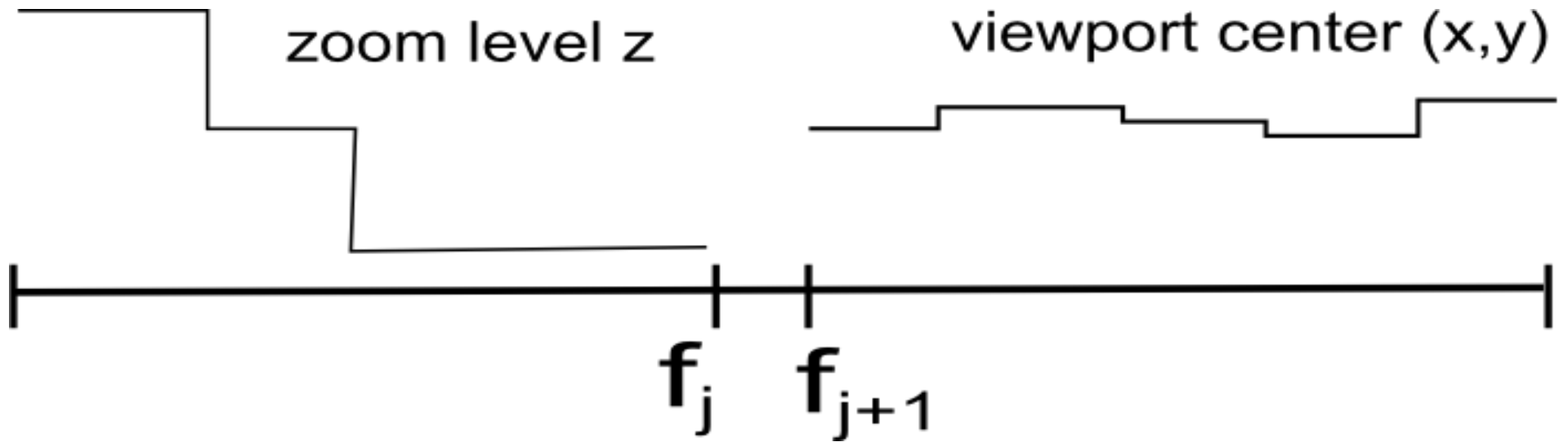
# Integrating Reframing techniques

- Bottom-up reframing
  - Type of shot: fixed, zooming or dolly
  - Shot level: stabilization according to its type
  - Inter-shot level: transitions and reestablishing shots

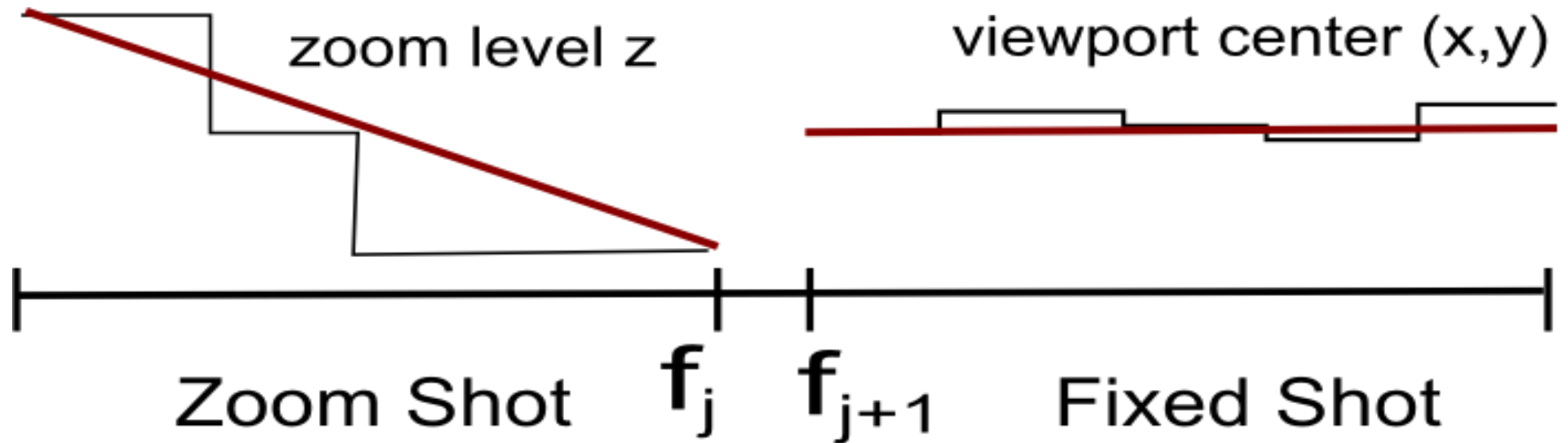
# Dolly shot



# Shots

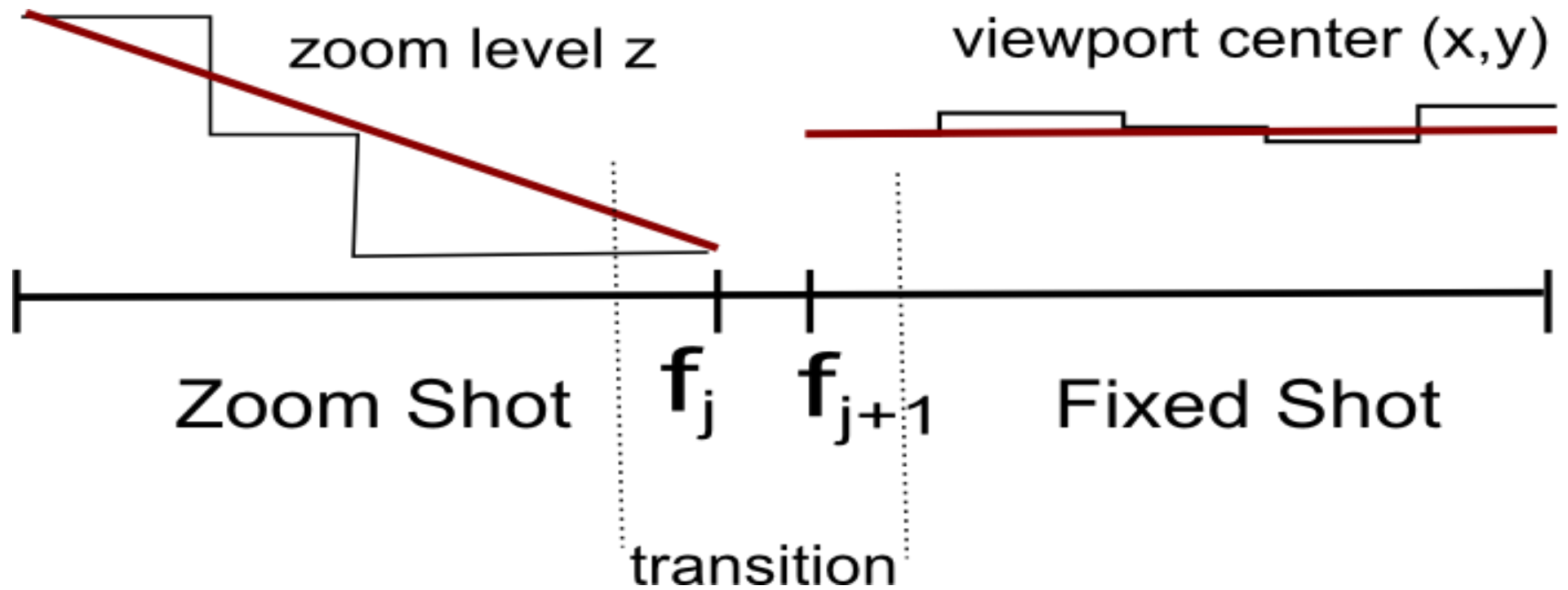


# Shot stabilization





# Transitions



# Reestablishing shots



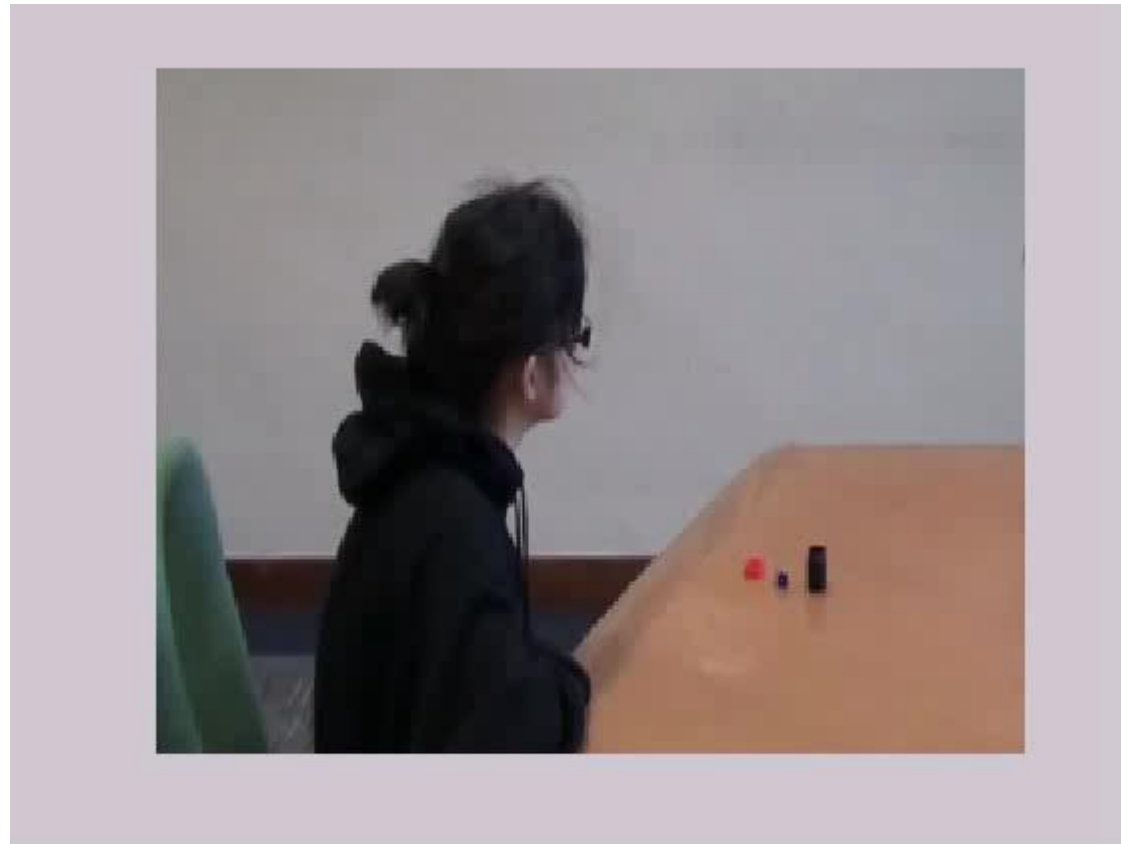
# Final Result



# Results validation

- 3 poor videos:
  - User interaction (*user*)
  - Retargeted version without reframing techniques (*noRT*)
  - Original version scaled down (*nozoom*)
- Retargeted version with reframing techniques (*crowdsourced*)
- Ground truth (*expert*)

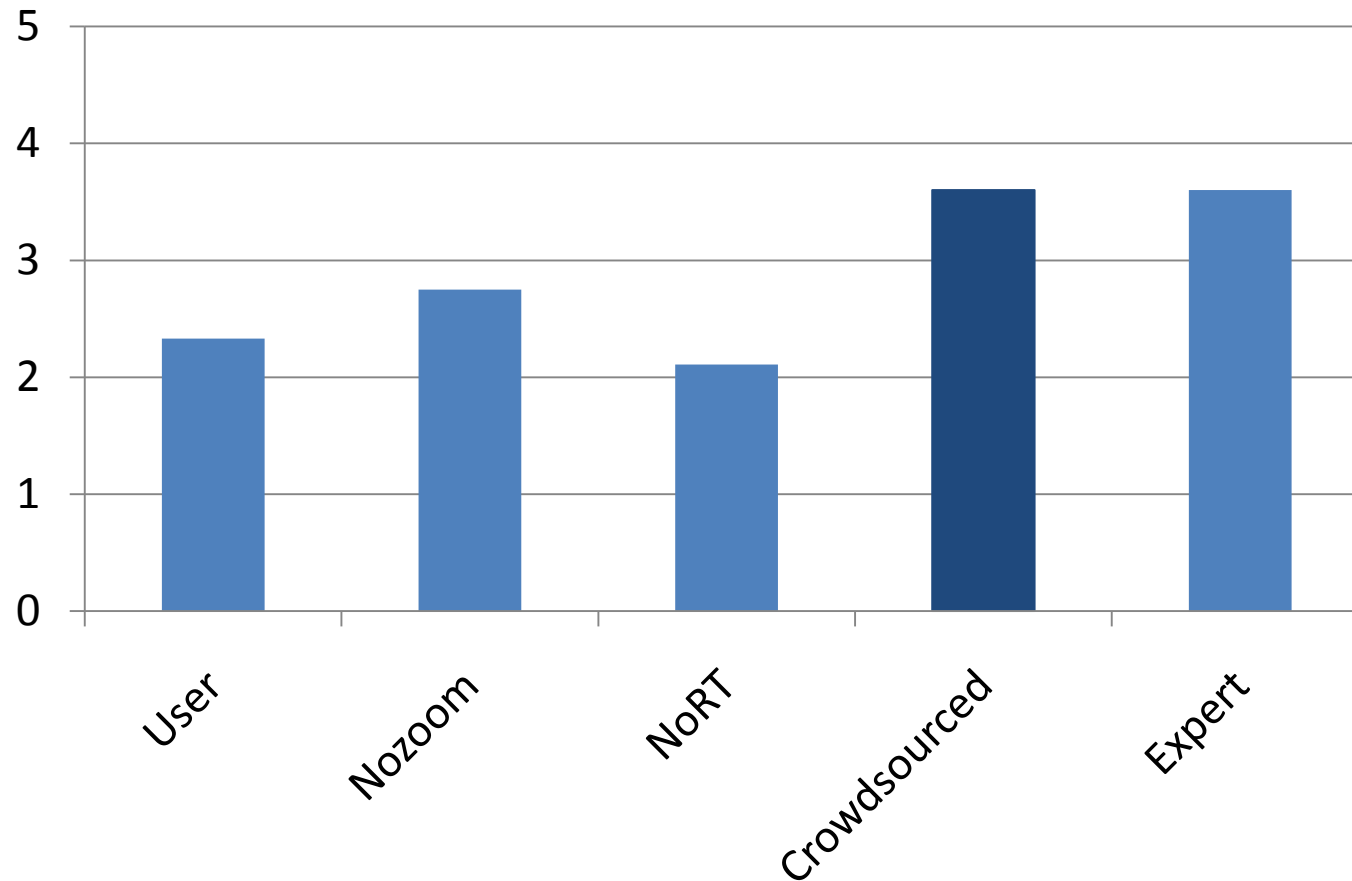
# Ground Truth



# Protocol

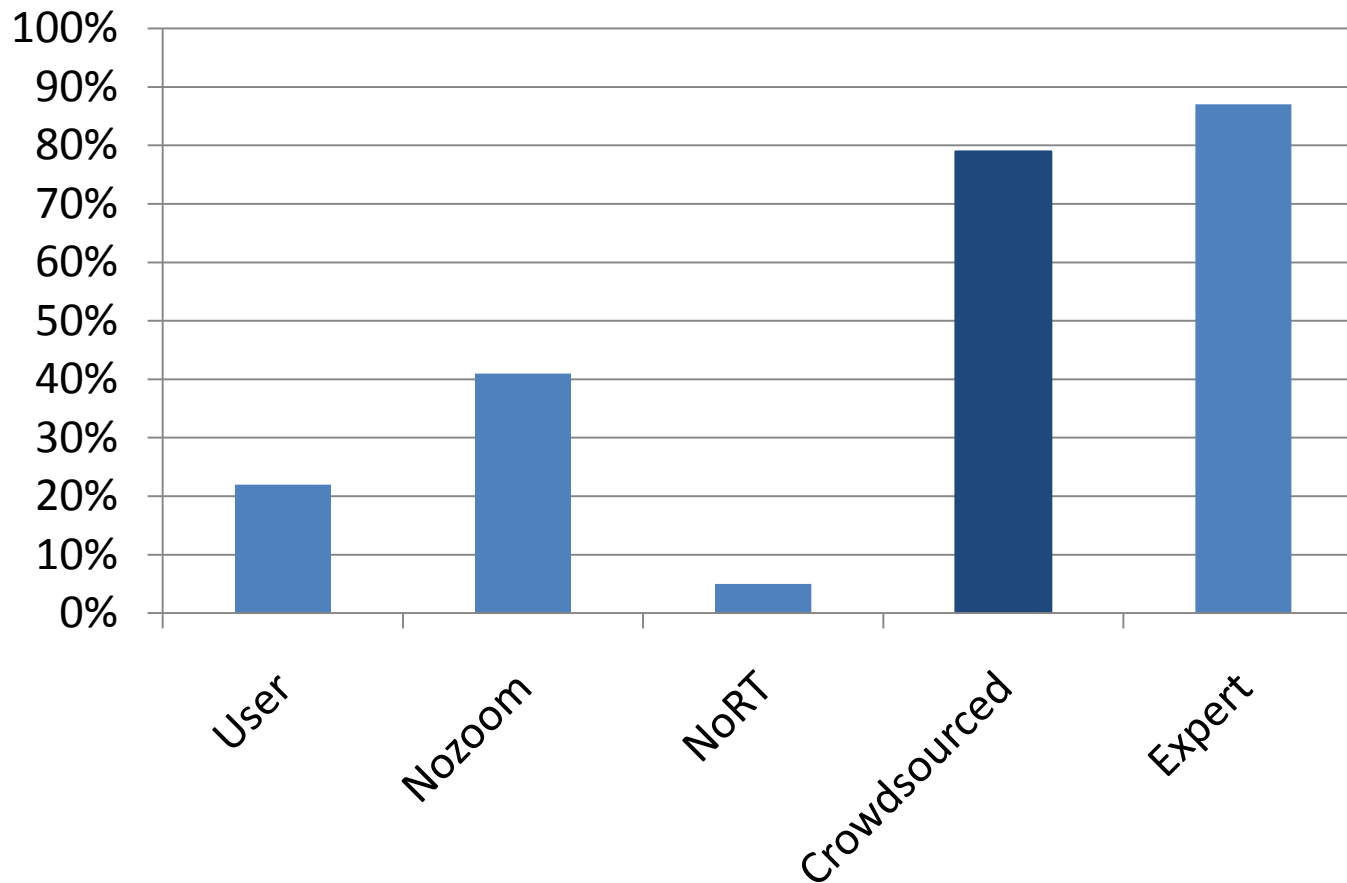
- 48 participants divided into 3 categories
  - User – crowdsourced – expert (18)
  - NoRT – crowdsourced – expert (18)
  - Nozoom – crowdsourced – expert (12)
- 3 questions were asked to the participants

# Rate the video editing of the video



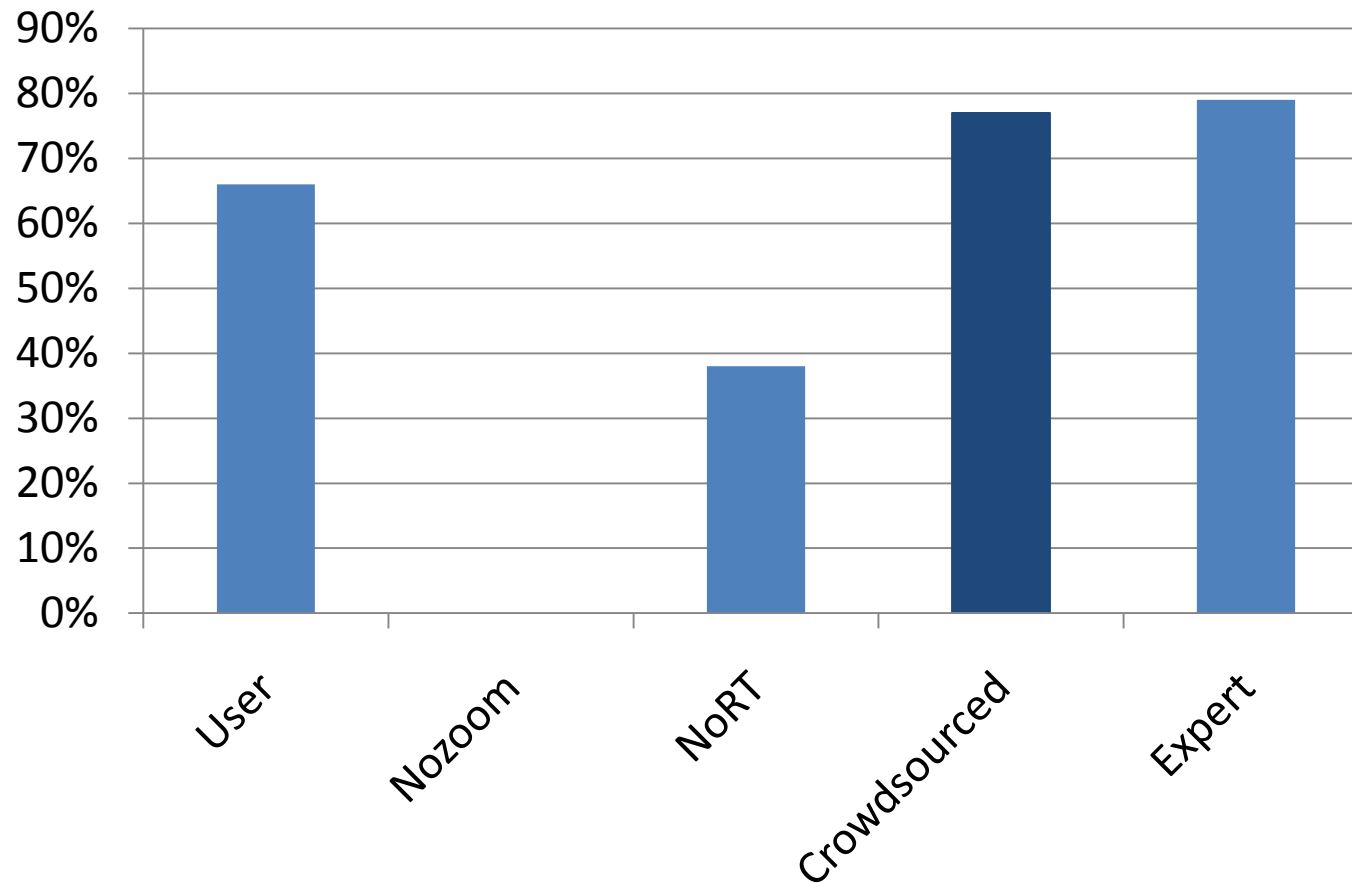
NoRT = retargeted version without reframing techniques

# Is the video editing reasonable ?





# Does the video manage to convey important information ?



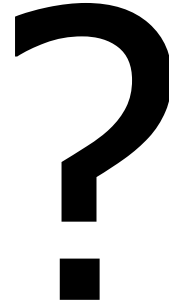
# Summary

- Gather **implicit** input from users
- No content analysis
- In our examples** : less than 12 viewers are enough to detect ROIs

# Future work

- Explore alternative methods for intermediary steps:
  - Modelling heatmaps not as a GMM
  - Adding cinematographic rules
  - Classify users into different profiles and generate a retargeted video for each profile

# Questions



# Results

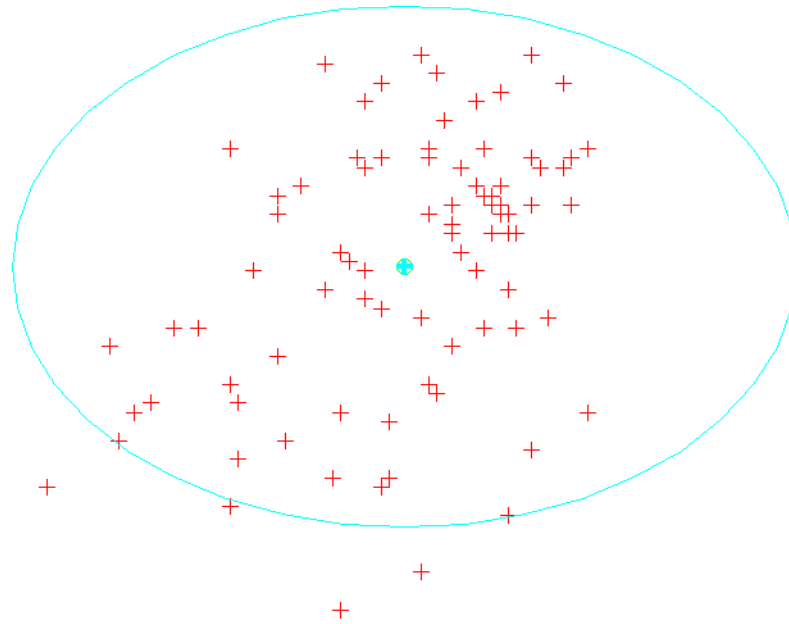
	User	Nozoom	noRT	Crowdsourced	Expert
Ratings	2.33	2.75	2.11	3.6	3.6
Reasonability	22%	41%	5%	79%	87%
Efficiency	66%	0%	38%	77%	79%

# Using aesthetics

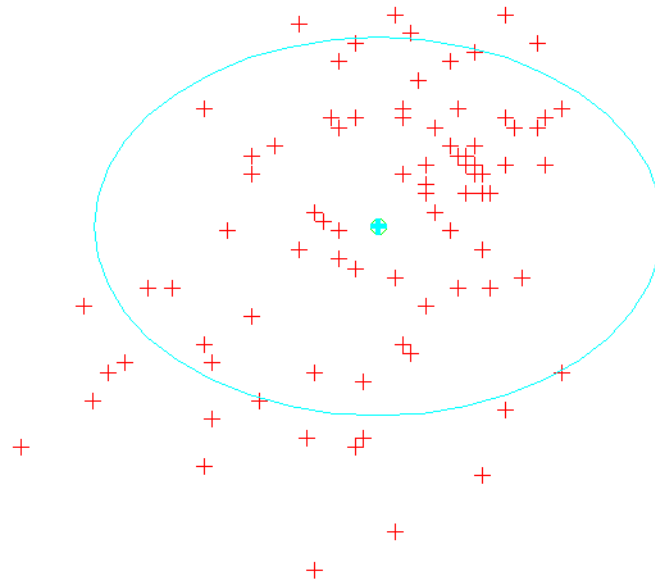
Liu, Chen, Wolf and Cohen-Or. Optimizing Photo Composition, *Computer Graphic Forum*

Luo, Yi wen and Tang, Xiaoou. Photo and Video Quality Evaluation : Focusing on the Subject, *ECCV 08*

# MCD Covariance



# MCD Covariance





# Gym Video Retargeted

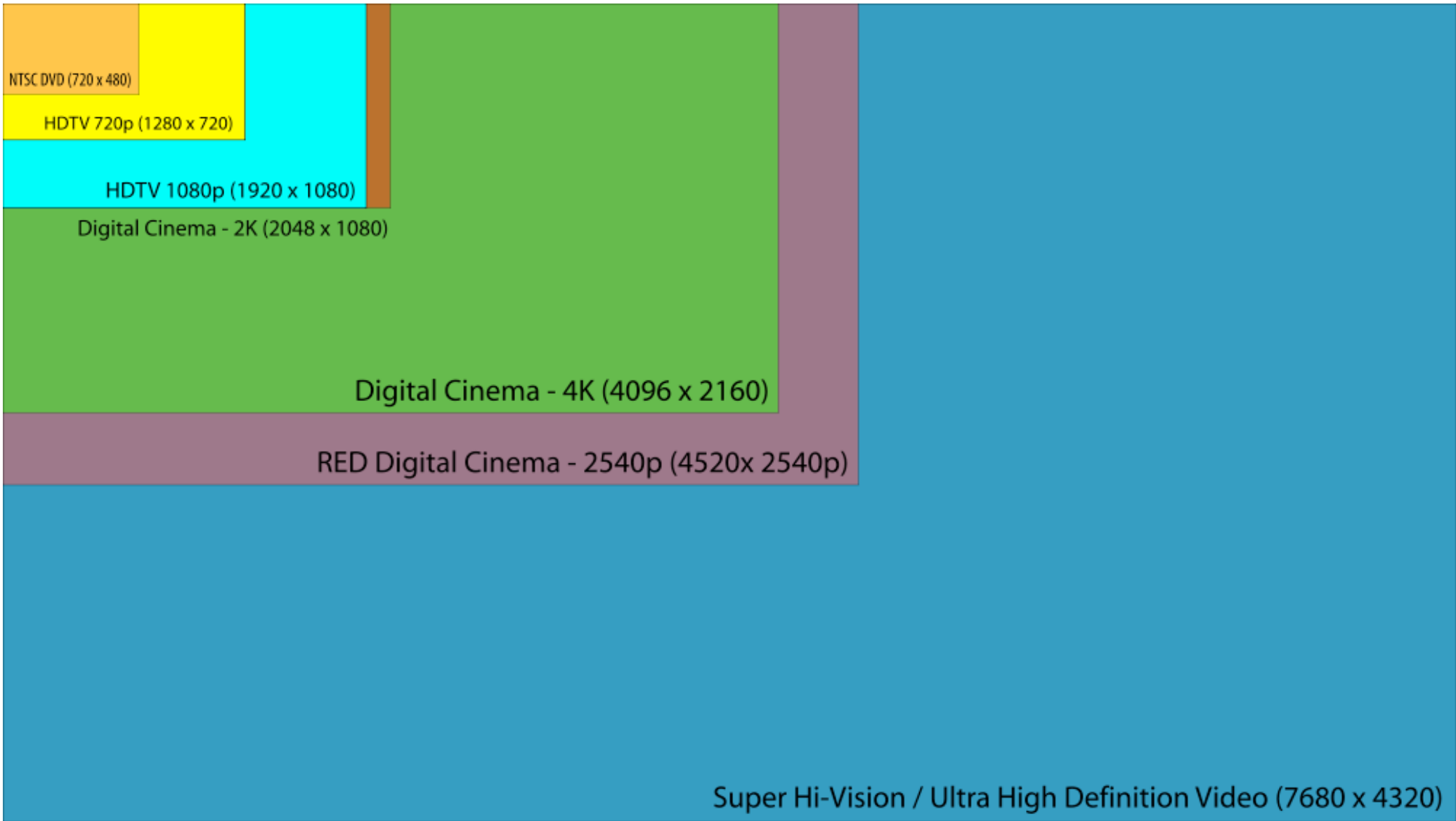


# Crowdsourcing

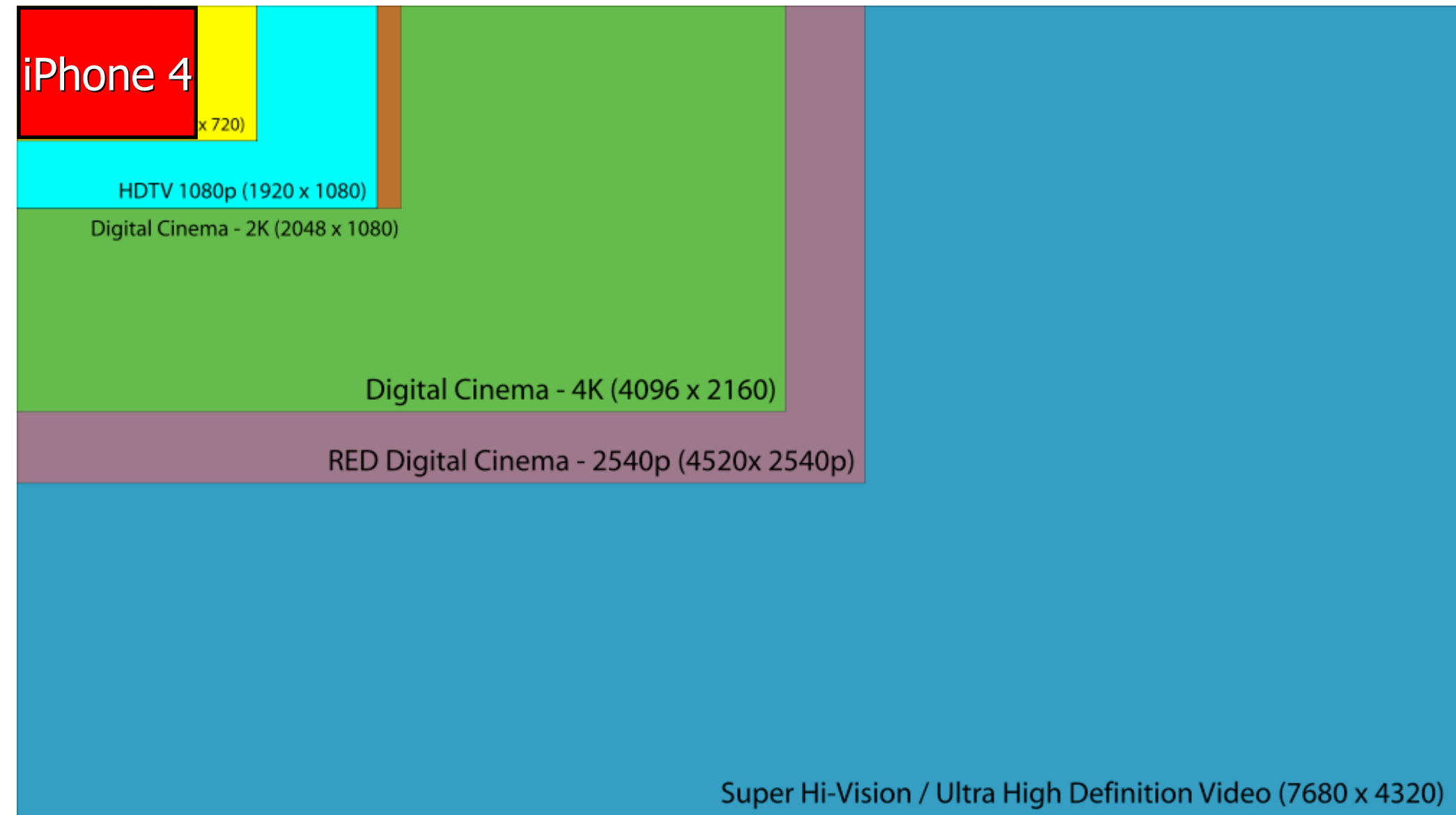
Shamma, Shaw, Shafton, Liu. Watch what I watch, *MIR 07*

# Overview

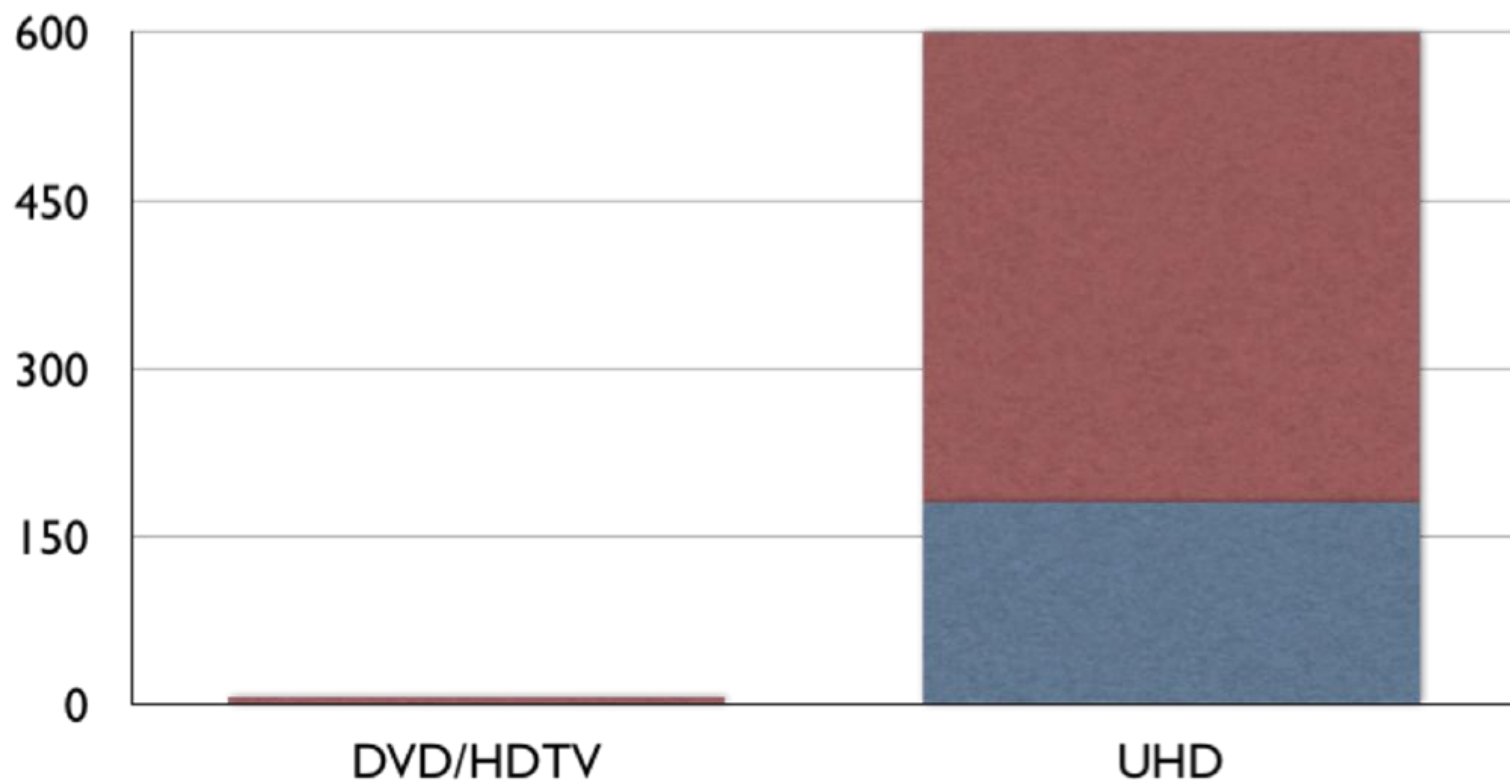
- Video retargeting
- Zoomable video
- Finding users' interests
- Creating shots
- Integrating reframing techniques
- Results validation



960 x 640

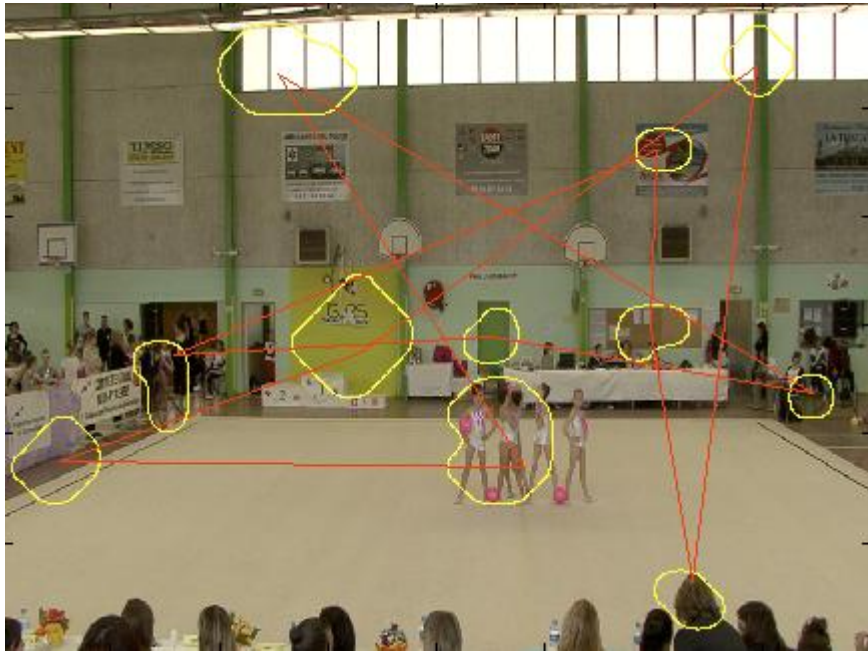


# Bandwidth Required (Mbps)





# Approaches using Content Analysis



Saliency map



Motion detection

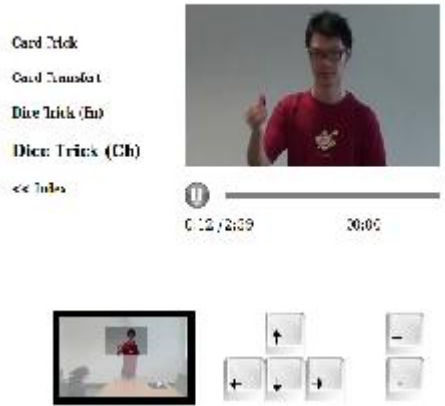
Liu, Gleicher  
Avidan, Shamir

MM 06  
Commun. ACM 09



# Crowdsourcing

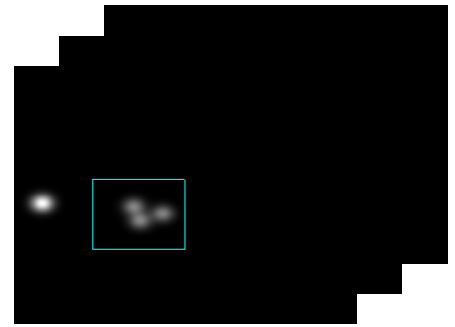
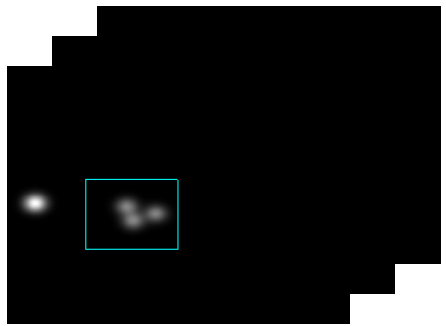
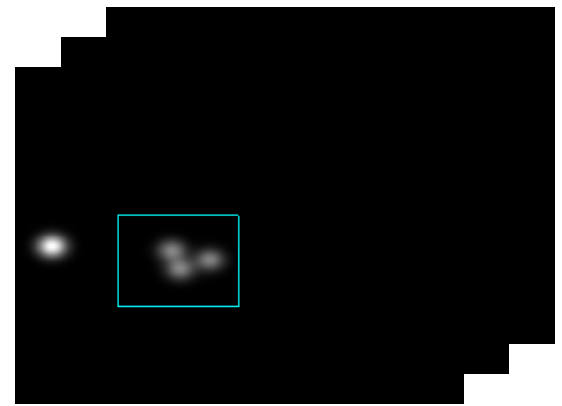
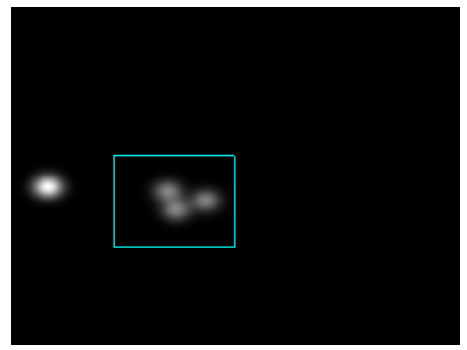
Dice Trick (Ch)



## Heatmap



## Hotspots



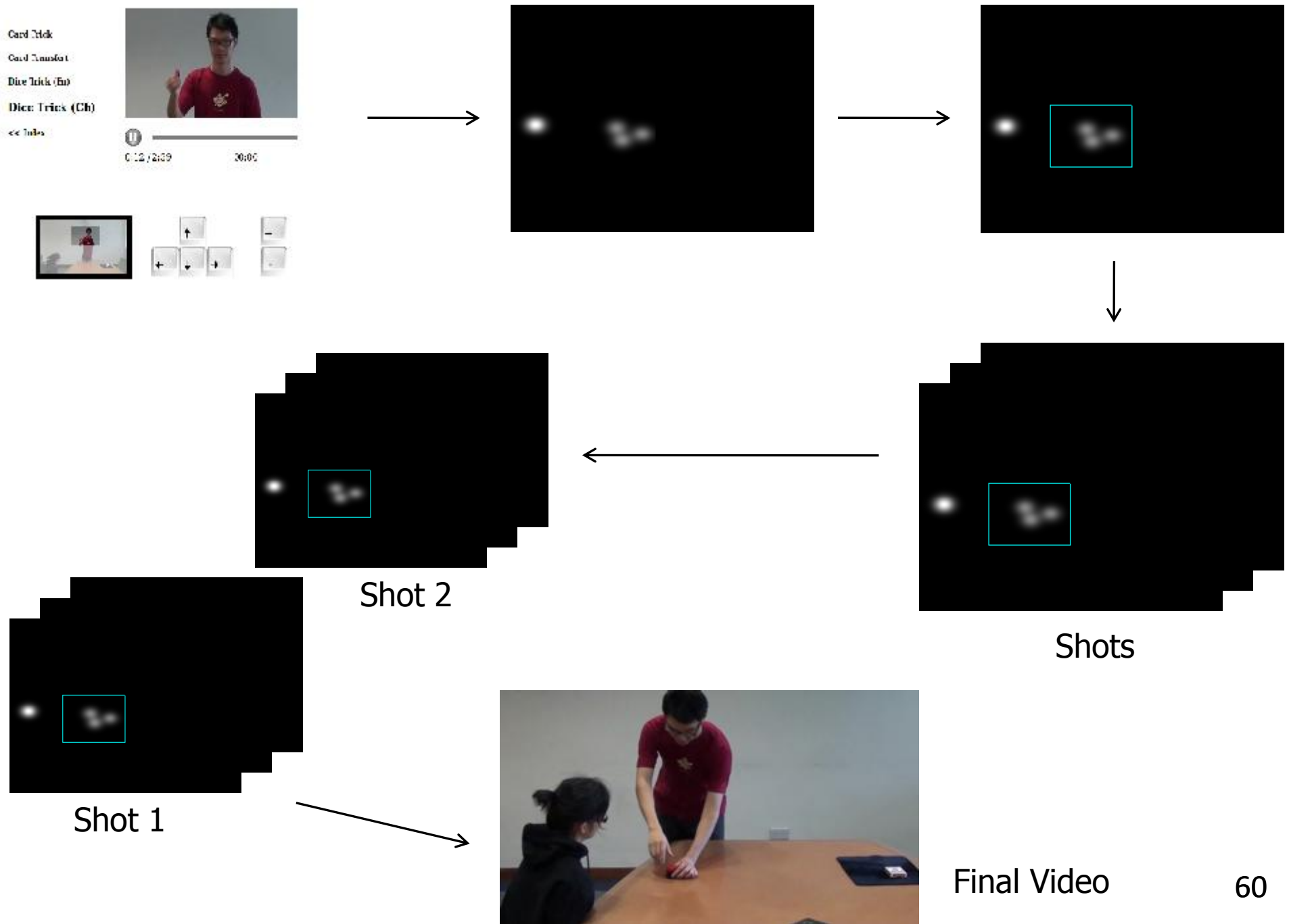
Final Video

60

Shot 2

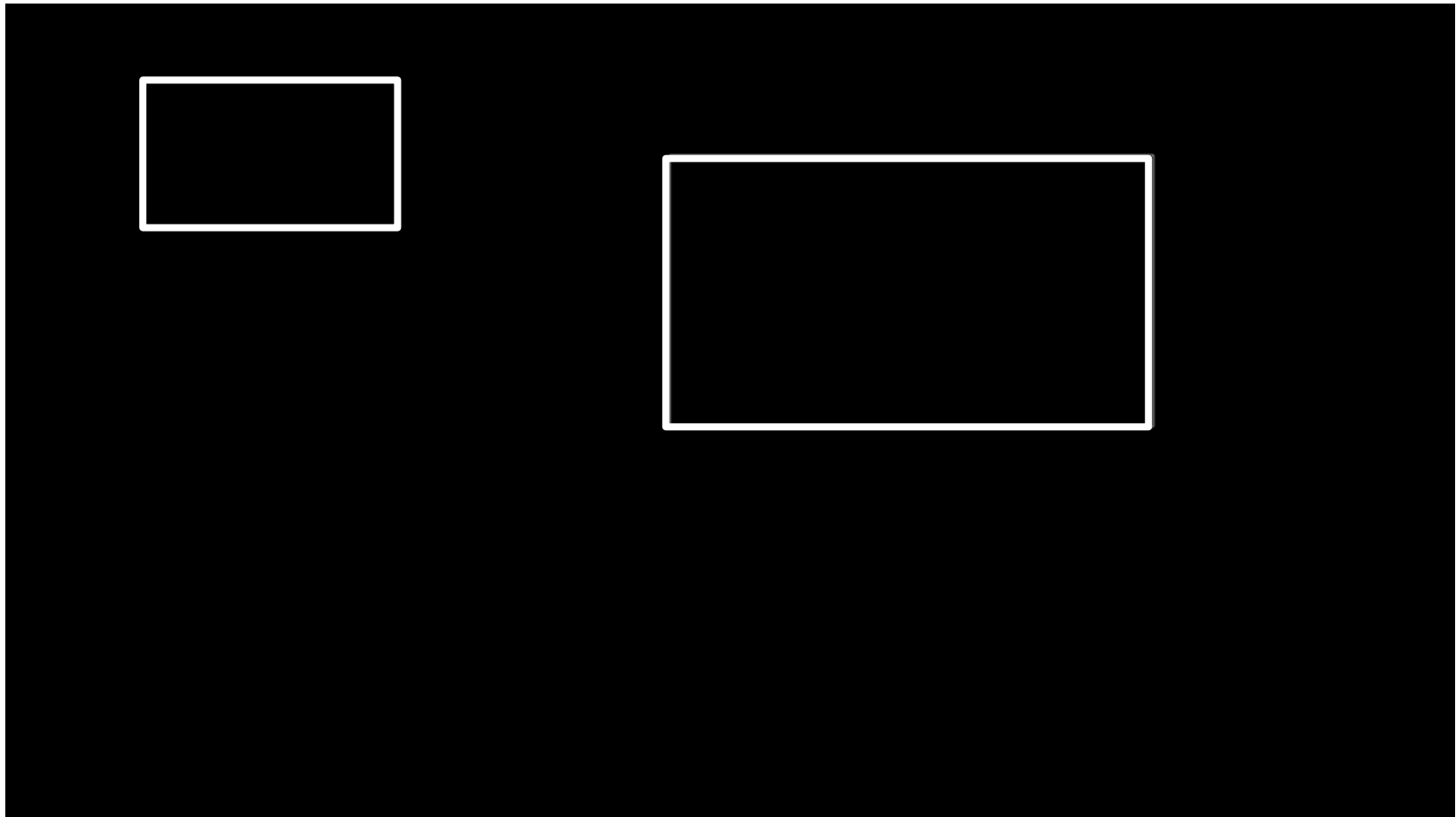
Shot 1

Shots



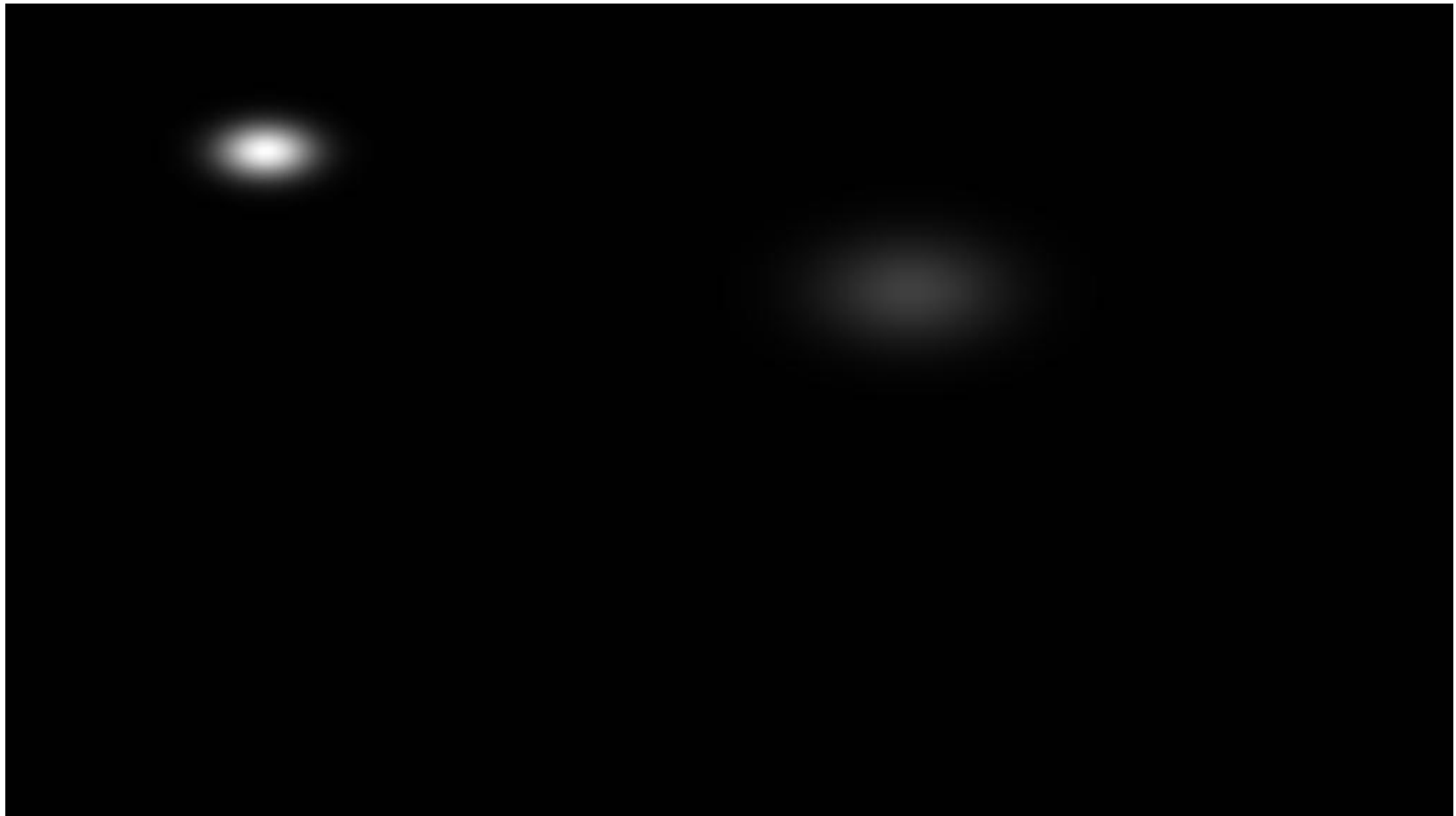
# Creating Heatmaps

- Modelization of ROIs as a GMM (Gaussian Mixture Model)

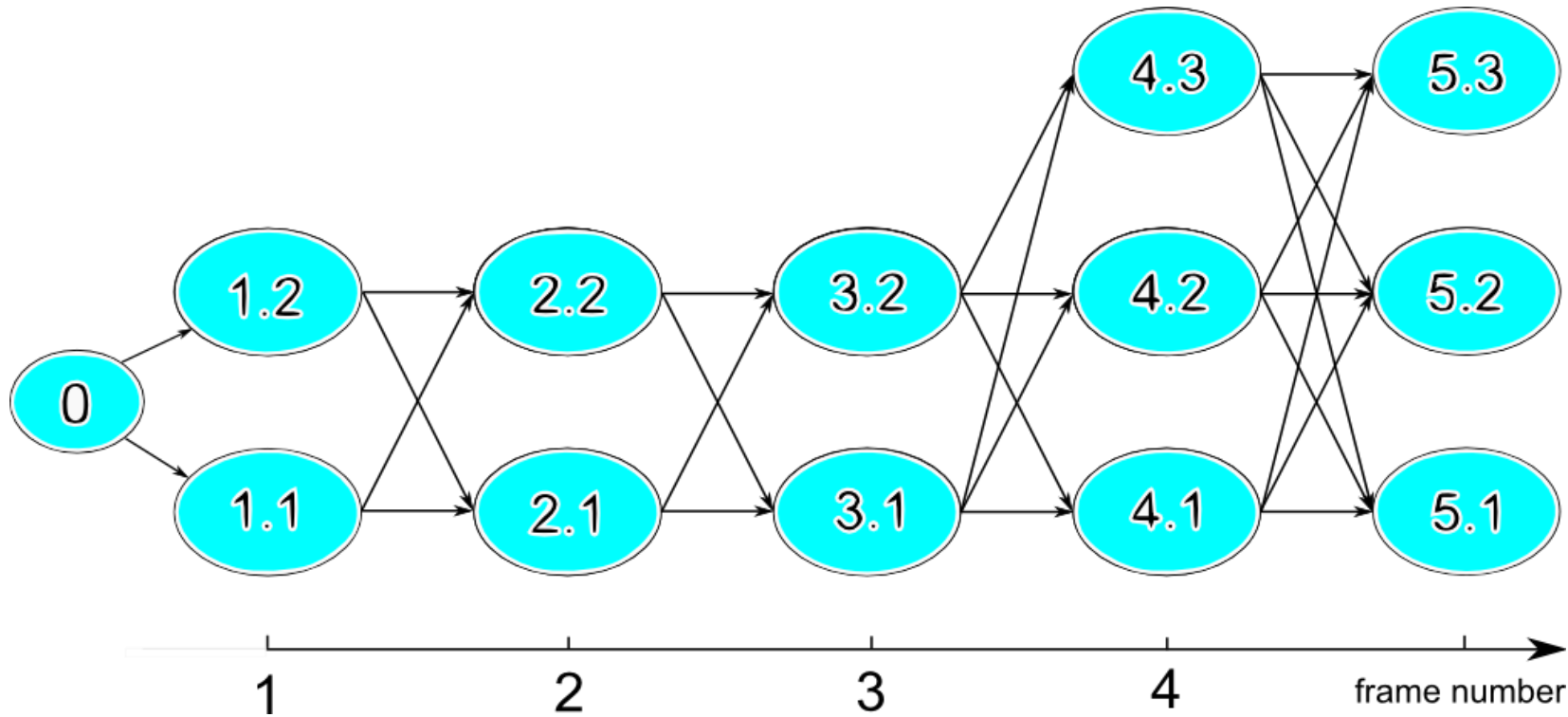
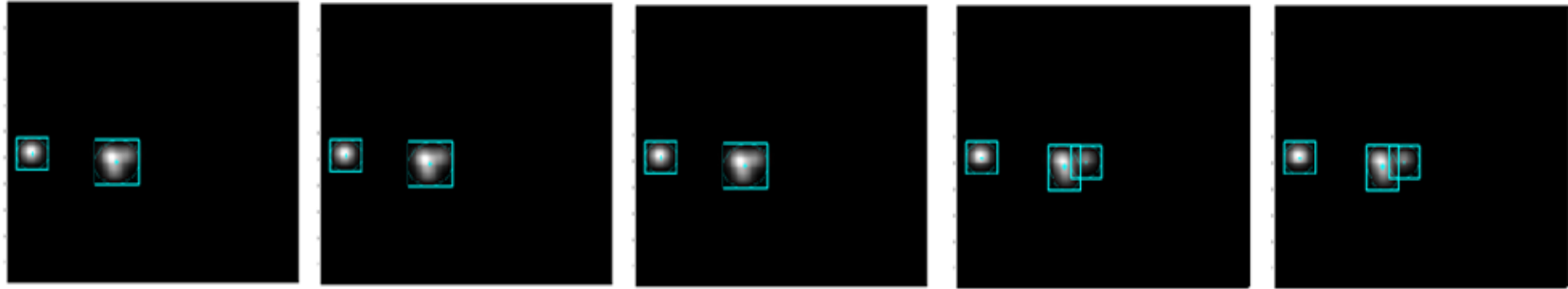


# Creating Heatmaps

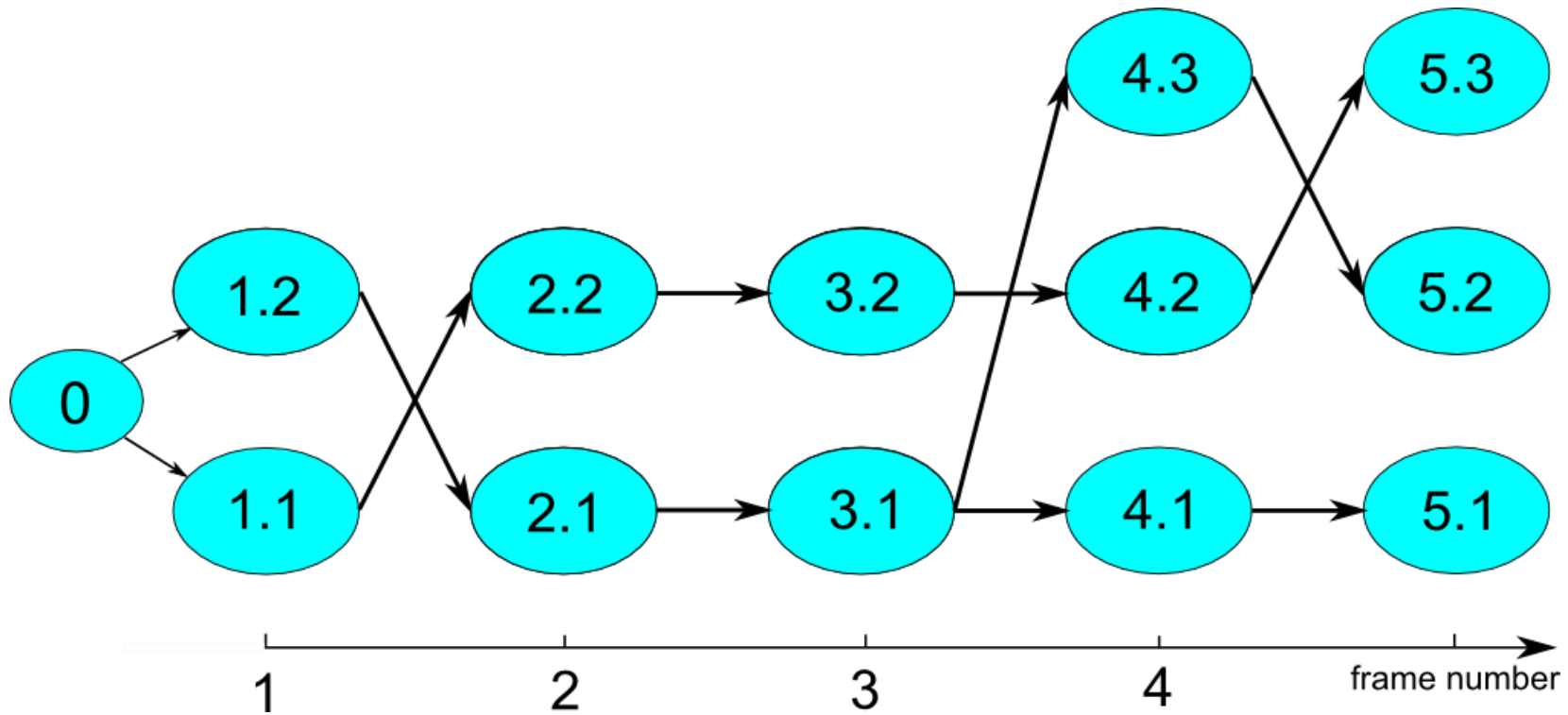
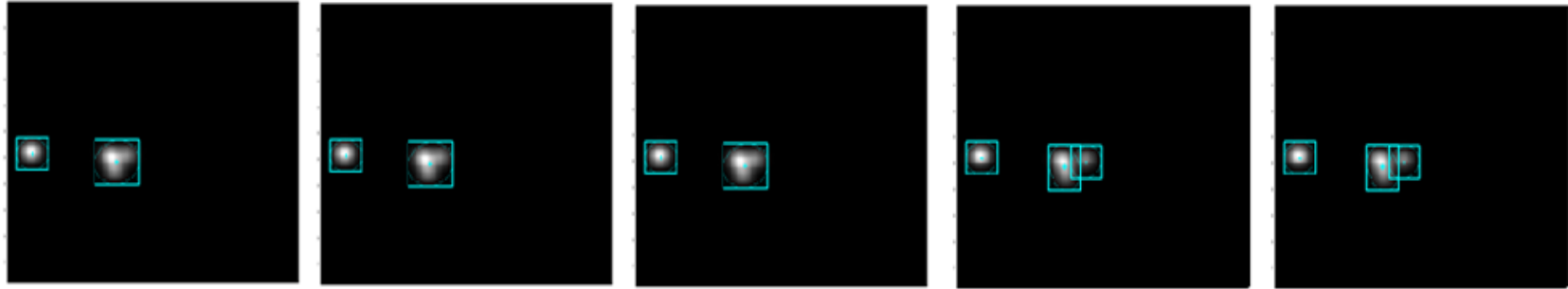
- Modelization of ROIs as a GMM (Gaussian Mixture Model)



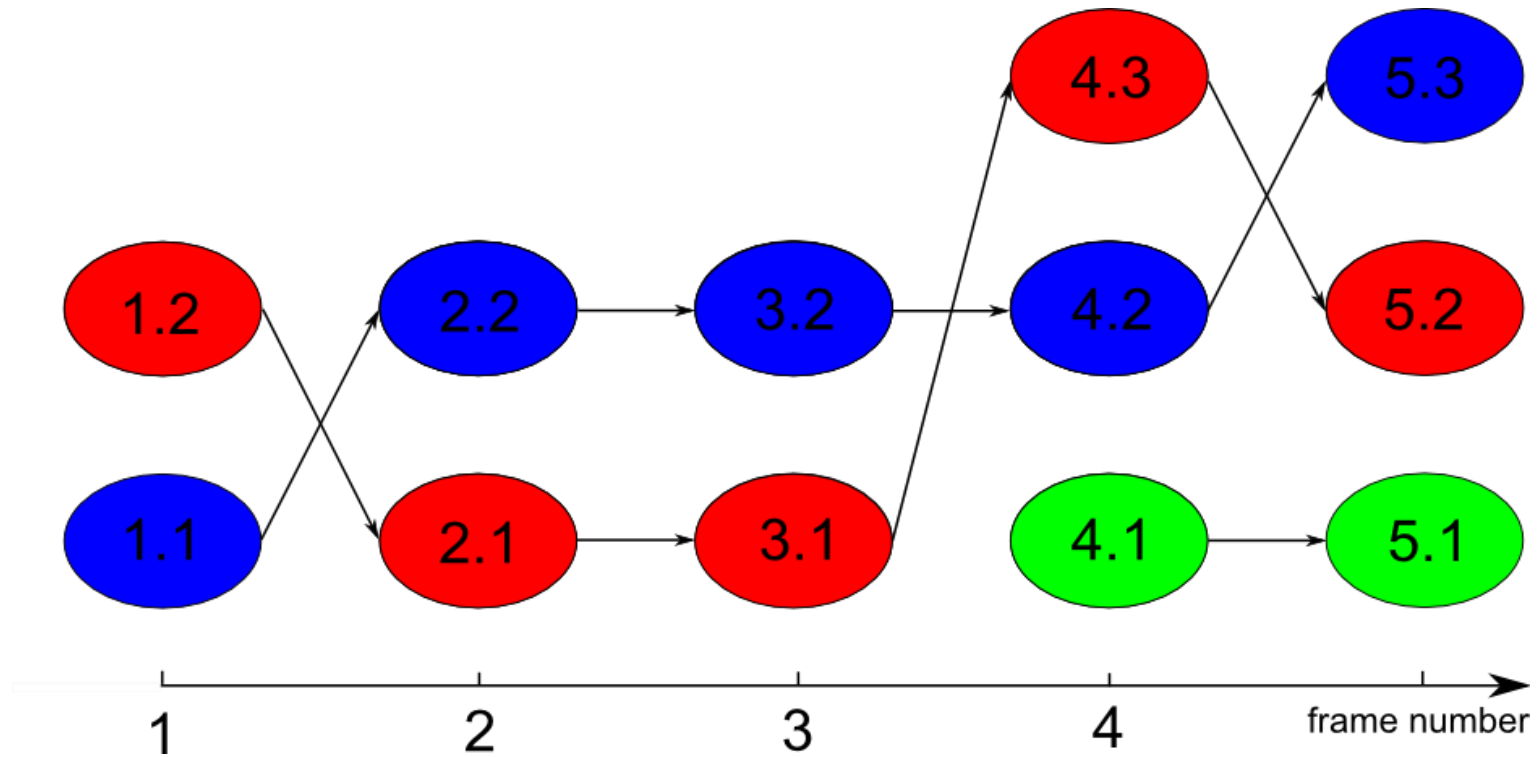
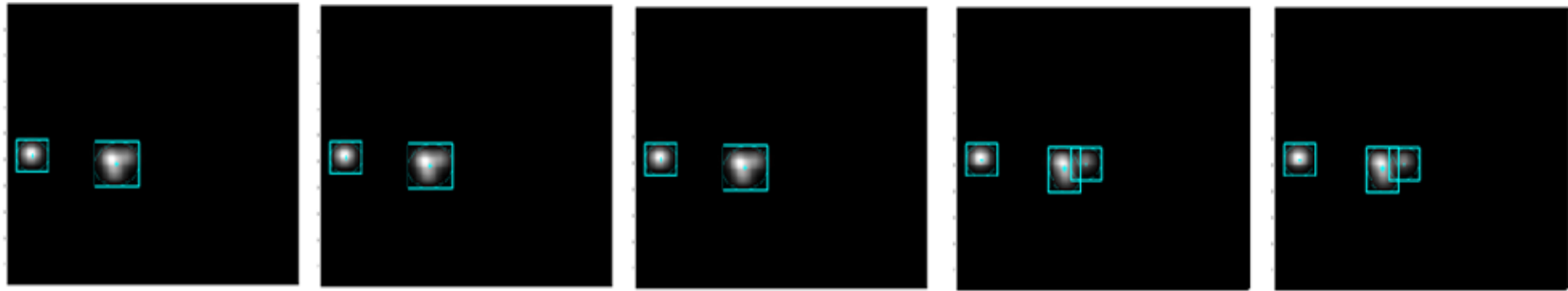
# Building a ROI dynamics graph



# Minimal spanning tree



# Cutting the tree into shots



# Shots selection

Shots are selected according to their popularity:

