

#### Week 4-b



Knowledge-based Event Modeling

Motion Detection Analysis Iconic-based Grouping & Browsing

Image Recognition Video Parsing and Segmentation

Low

High

Level of Abstraction

Fine

Coarse<sup>2</sup>

## Video DBMS

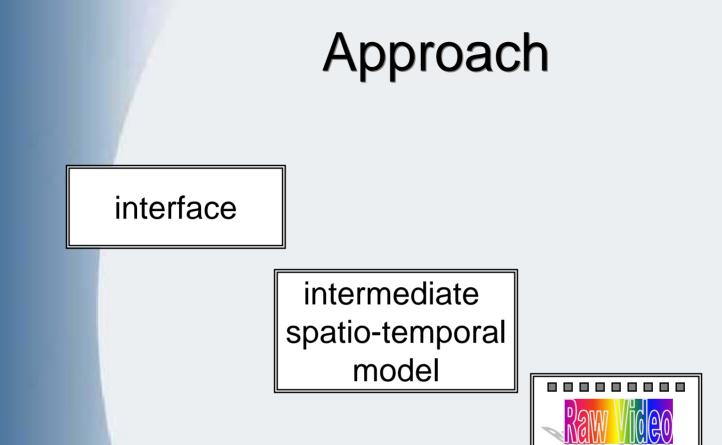
Design and development of a video database management system that allows intelligent querying and searching

- Content-based searching of video data based on object motion
- A visual query interface to describe complex events in an intuitive manner

## **Example Video Queries**

- "Find video clips where four T-33A's fly in an arrow formation"
- "Find video clips where a Blue Angels aircraft draws a spiral trajectory"
- "Search for football clips that contains a touch-down"

Querying such events requires motion-based content description along with the use of conventional image features



- Video parsing and segmentation
- Low-level image-based searching by representative frames
- Motion-based modeling and indexing of video objects
- Spatial semantics based indexing of video objects

# Video Parsing

Scene change detection (uncompressed)
Abrupt vs. Gradual
Color histogram- and/or pixel-based difference.
Abrupt:

Nagasaka & Tanaka, Otsuji, Akutsu et al. Hsu et al.

Gradual:

Tonomura et al., Zhang et al., Shahraray, Zabih et al.

Scene change detection (compressed)

DC Image Sequence Based (Princeton)
DC Coefficients Based (Siemens)

# **Object Motion Tracking**

- Color segmentation
  - Divide frame into predefined number of regions
  - Identify the individual color areas
- Motion analysis
  - Estimate motion between two consecutive frames

# **Object Motion Tracking**

#### Motion segmentation

- Segment motion vector field
- Identify the aggregate displacement of regions
- Motion compensation
- Rule-based technique to refine boundaries and distinguish between stationary and moving objects.

# Motion-based Modeling and Indexing

## **Current Approaches**

- STL & algebraic models: Italy, Purdue, MIT
- Trail model (VSDG): Purdue
- Trajectory model: ASU (Gulshani)

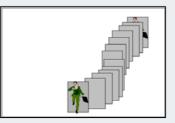
These formalisms have been extended by several researchers

## **Spatio-Temporal Logic**

Formal semantic modeling approach Efficient query processing Searching by exact comparisons Restricted to pre-defined formalisms Insufficient visual query support

# **Trail-based Modeling**

- Bounding box salient objects
- Spatio-temporal information about objects
  - Mosaic representation of object motion
  - Attached time duration: added flexibility
- Object relationships can be represented in a graphical data structure (VSDG)



# Trail Model: VSDG

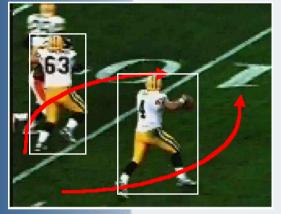
#### Video Semantic Directed Graph

VSDG is a directed bipartite G=<V1, V2, E> V1= Set of nodes representing objects in a video clip D: V1 ---> I, mapping from nodes to set of duration in terms of number of frames

where Z = Set of motion vectors associated with the bounding boxes of objects

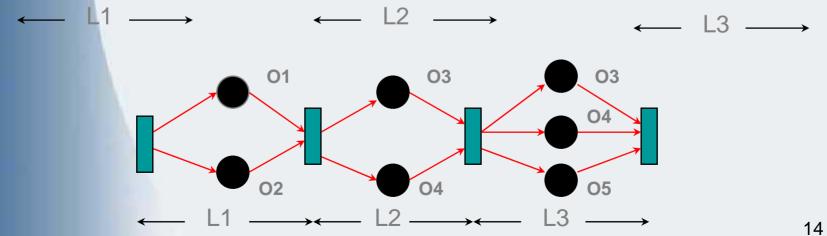
V2 = Set of nodes marking the appearances of new object(s) of interest.

## **VSDG Example**









## Trail Model

Parallel to emerging video standards such as MPEG4 and MPEG7

Practical and natural for visual querying

Low precision

 Computationally expensive in query evaluation

## **Trajectory Model**

- Special case of VSDG, where the centroid of each bounding box is tracked.
- Good low-level support: MPEG
   No searching technique exists.

## **Trail-based Search**

**Issues**:

- Fuzziness
- Translational invariance
- Speed invariance
- Performance

## **Trail Search Types**

Trail image comparison:

- Spatial absolute exact screen location
- Spatial invariant translation
  - Fourier-based convolution
- Scale invariant object and trail sizes
  - Mellin-based pattern matching algorithm

## Mellin Transform - Features

 $[M(x)](u,v) = \Sigma \Sigma x(k,l) k^{-(ju+1)} l^{-(jv+1)}$ 

• Scale invariance:

 $\begin{aligned} x_{ab}(k,l) = x(ak,bl) \\ [M(x_{ab)}](u,v) &= a^{-ju} b^{-jv}[M(x)](u,v) \\ |[M(x_{ab})](u,v)| &= |[M(x)](u,v)| \end{aligned}$ • Computational efficiency:  $[M(x_{ab)}](u,v) &= [FFT(x_{ab})](\log u, \log v) \\ O(N \log N) \text{ complexity} \end{aligned}$ 

## Problems - Issues

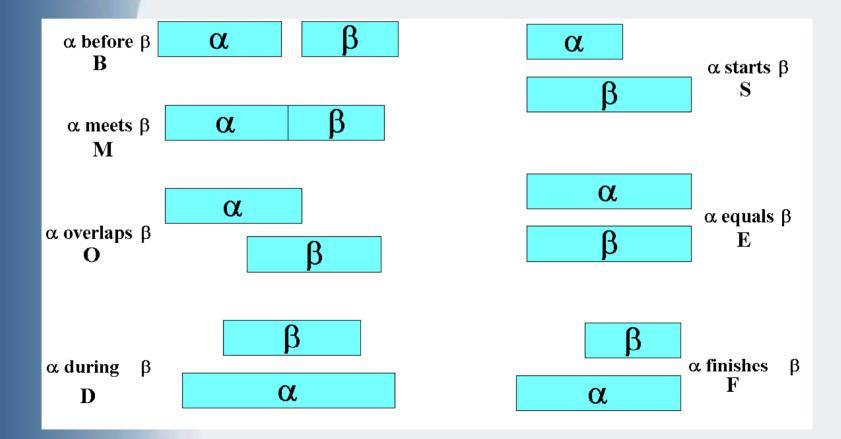
- Camera motion
  - Solution: Mosaic images
- Temporal information not preserved
  - Solution: Aggregate duration specification
    - Limited control on speed information

## **Spatial Semantic-based Search**



#### **Spatial semantics: Arrow formation**

## Binary Spatio/Temporal Relations



## Example of Spatial Meta-Knowledge

