

# Temporal Aggregation for Large-Scale Query-by-Image Video Retrieval

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## Query-by-Image Video Retrieval

Image query



Retrieval System

Database of video clips



- News videos: search event footage using photos
- Online education: search lectures using slides
- Brand monitoring: search YouTube using product images

### Challenges → Our contributions

- Temporal redundancy → Shot aggregation
- Large database (scalability) → Scene aggregation
- Query-database asymmetry → Asymmetric comparisons

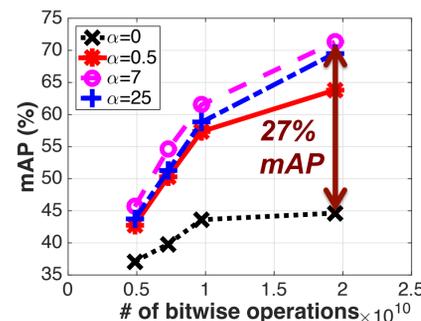
**Result:** 10X faster retrieval with similar mAP compared to state-of-the-art baseline

## Experiments

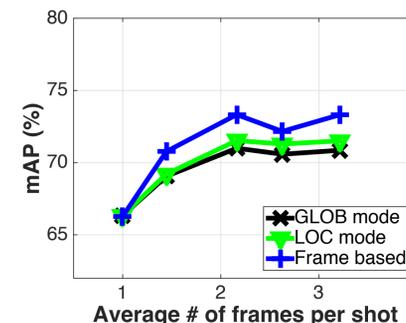
- SIFT local features + SCFV global descriptors
- Stanford I2V dataset
  - Light version: 78 queries and 1,035h of video in database
  - Full version: 229 queries and 3,801h of video in database

### Small-scale experiments (light dataset)

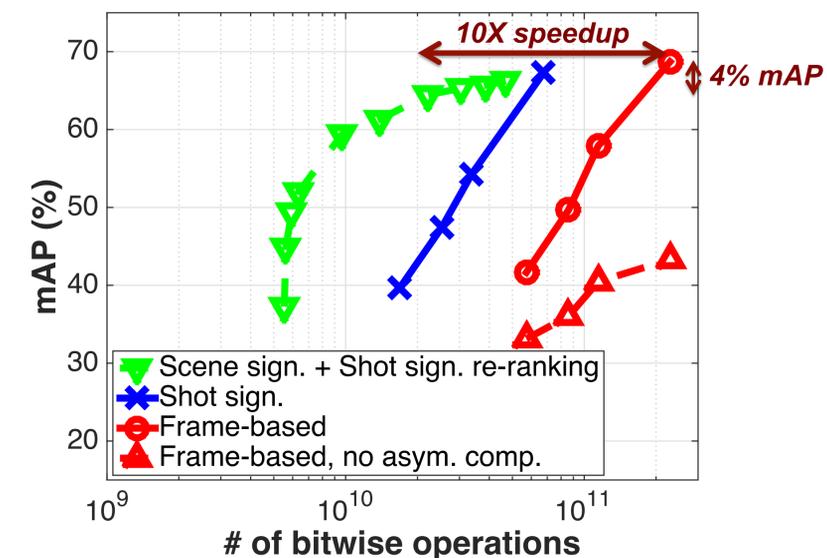
Asymmetric comparisons  
(shot signatures w/ LOC mode)



Shot aggregation modes



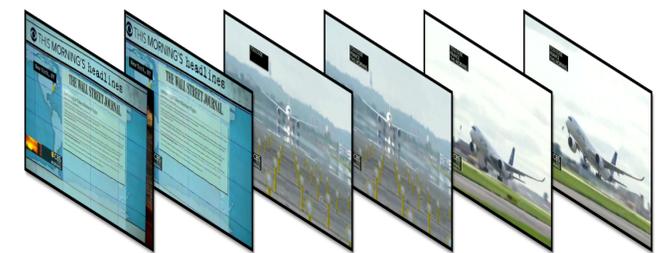
### Large-scale experiments (full dataset)



## Temporal Aggregation

Temporal fragments

Frames  
1 fps



Shots  
Similar frames  
3.4 sec on average

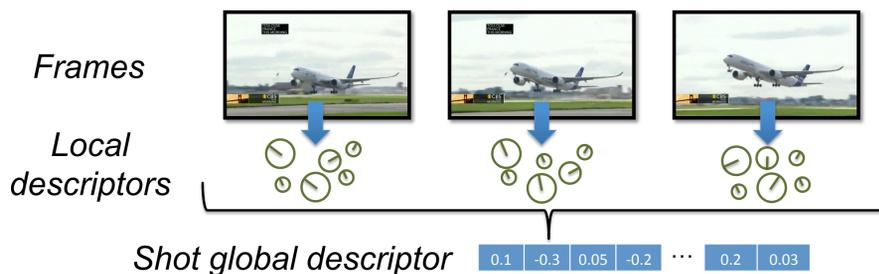


Scenes (news stories)  
Diverse shots  
2.7 min on average

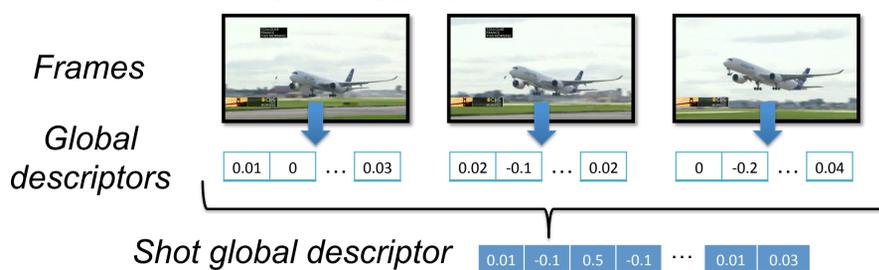


Shot/Scene aggregation modes

- Local descriptor aggregation (LOC)



- Global descriptor aggregation (GLOB)



- Other modes also described in the paper

## Asymmetric Comparisons

Examples: query images and database frames



- Asymmetry even more pronounced when using temporally-aggregated signatures in database

Solution for Fisher vector-like signatures

$d$  Dimensionality of local descriptors after PCA

$\mathcal{G}_i$  Query FV's  $d$ -dimensional residual for Gaussian  $i$

Rule: Ignore the  $d$  components of  $\mathcal{G}_i$  in score computation if:

$$\|\mathcal{G}_i\|_1 \leq \alpha$$

↑  
threshold