

# **Adaptive Encoding of Zoomable Video Streams based on User Access Pattern**

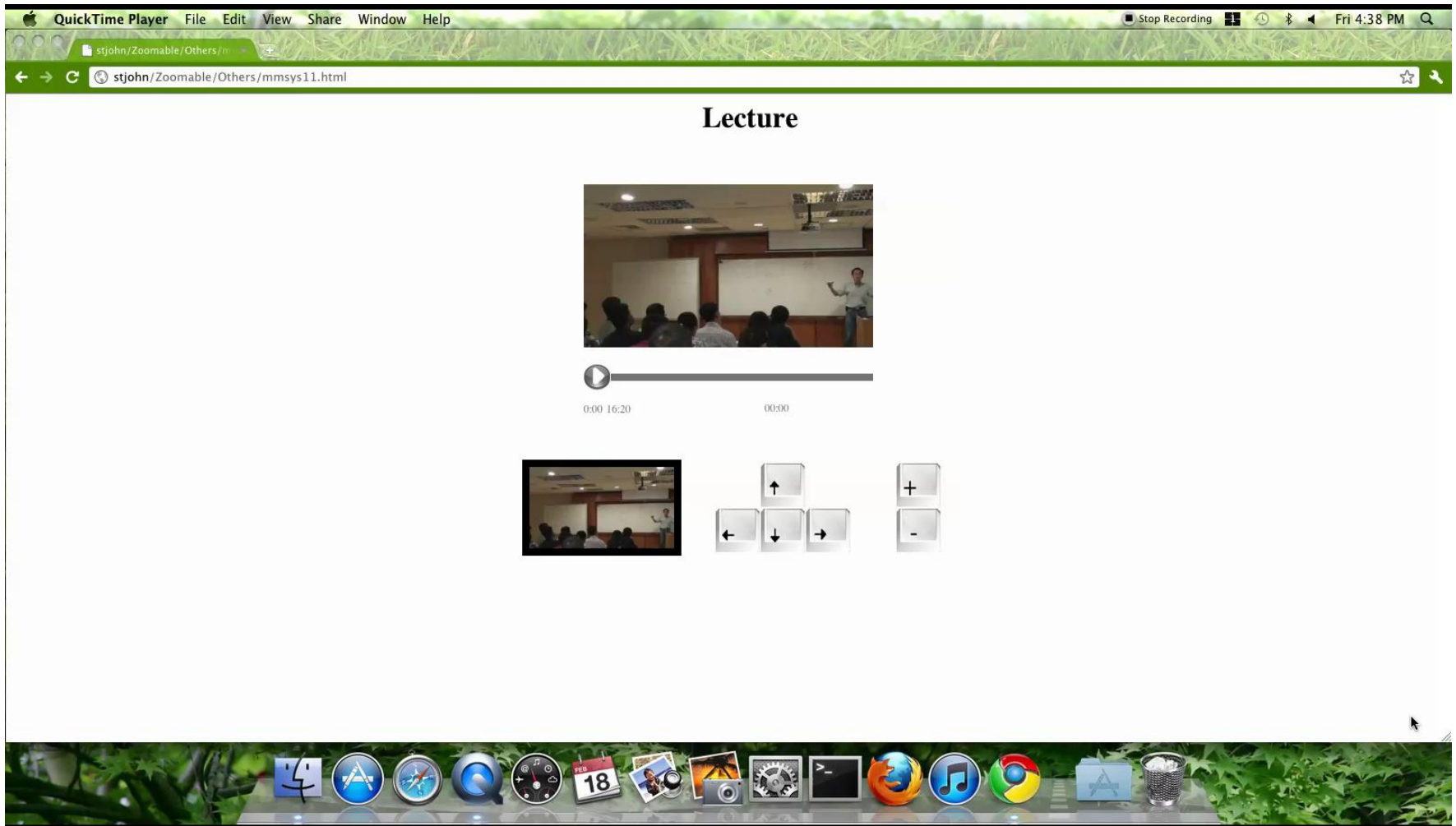
Ngo Quang Minh Khiem

Guntur Ravindra

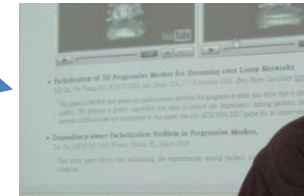
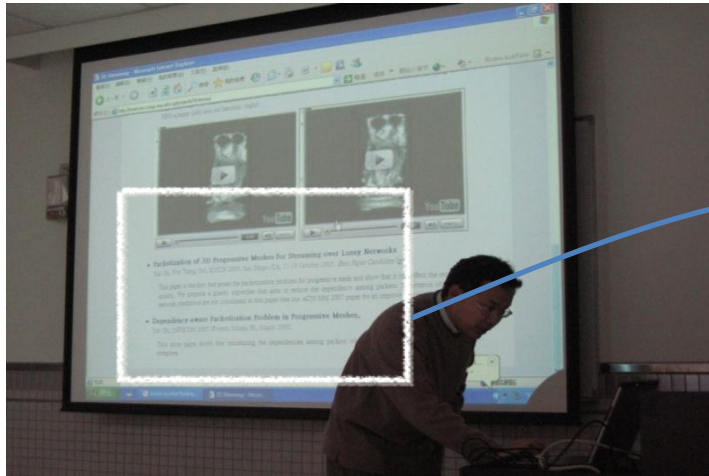
Wei Tsang Ooi

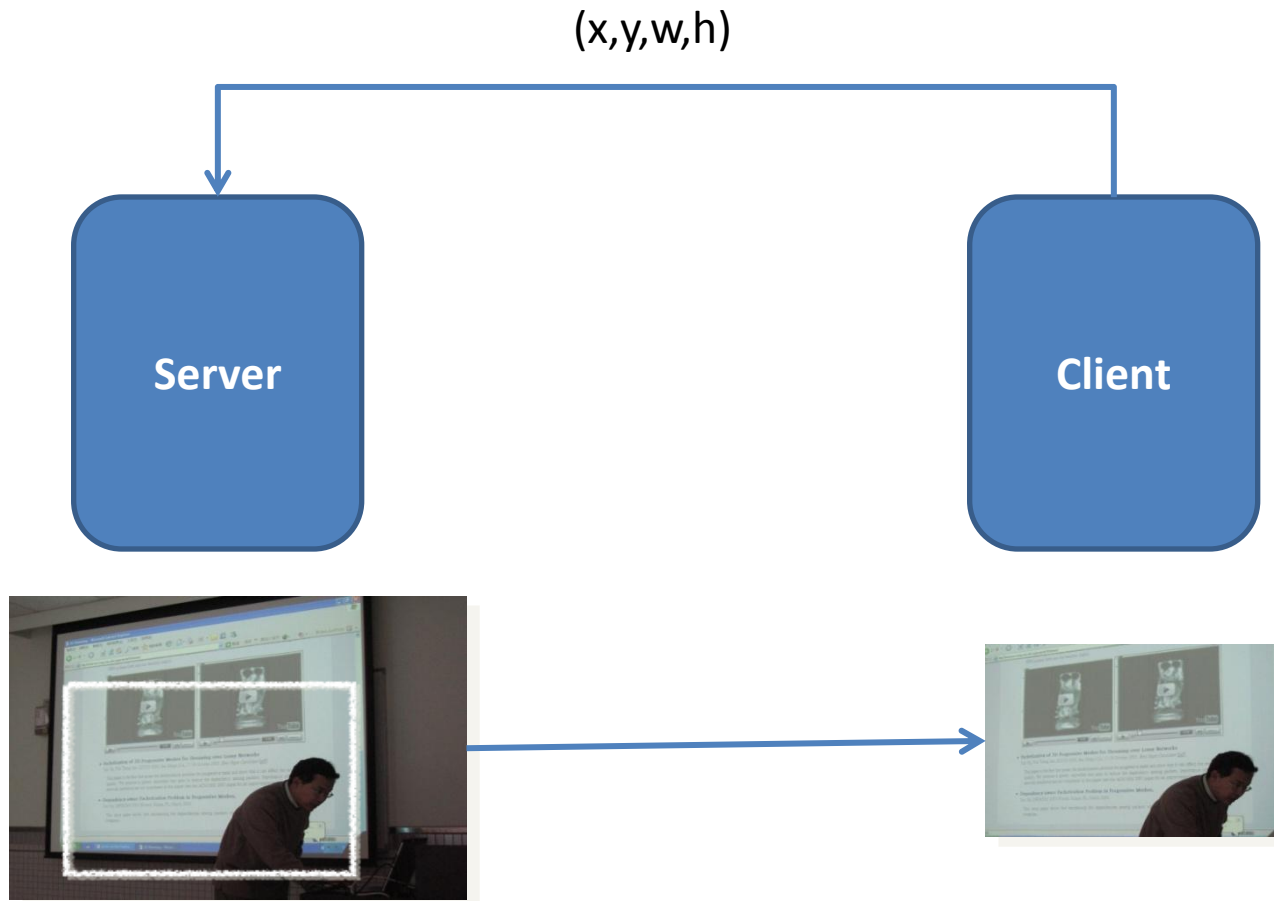
National University of Singapore

# Zoomable Video



# Zoomable Video with Bitstream Switching

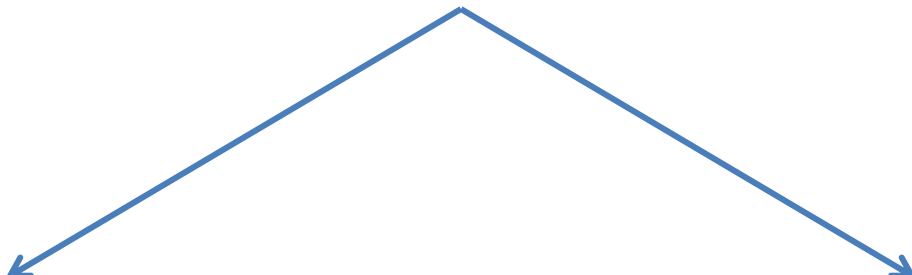




**GOAL: Minimize bandwidth  
to transmit Rols**

# Dynamic Cropping of ROI

**Encode video once  
Support any ROI cropping**



**Tiled Streaming  
(TS)**

**Monolithic Streaming  
(MS)**



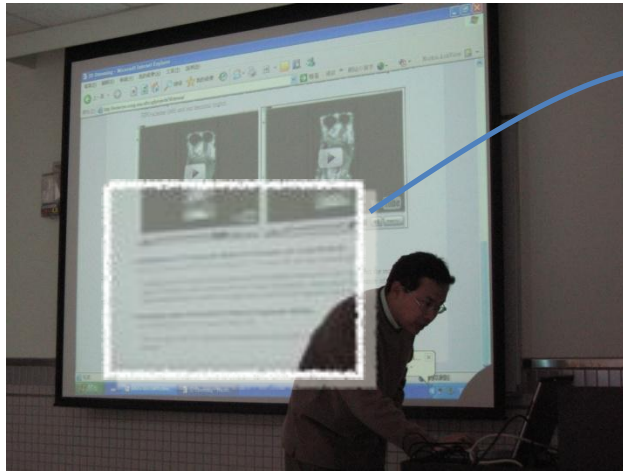
One tile =  $k \times k$  macroblocks

Encode each  
tile as independantly  
decodable video streams



Tiles overlapping with  
the RoI are  
transmitted

## Tiled Streaming



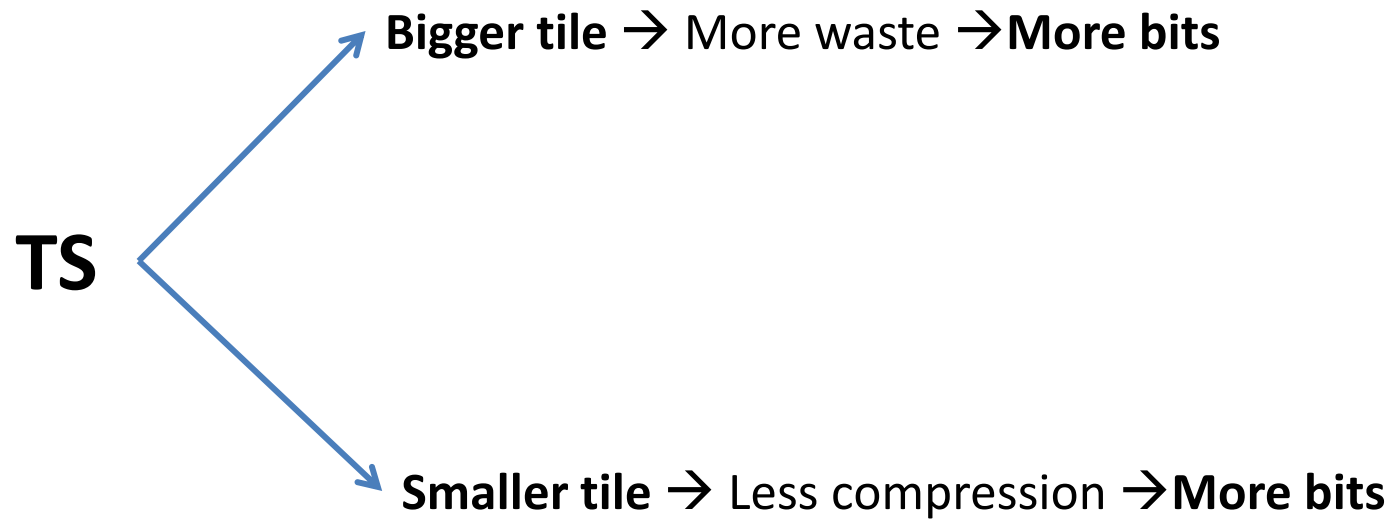
Single monolithic video



Data outside RoI  
need for decoding RoI

## Monolithic Streaming

# Trade-offs with TS and MS



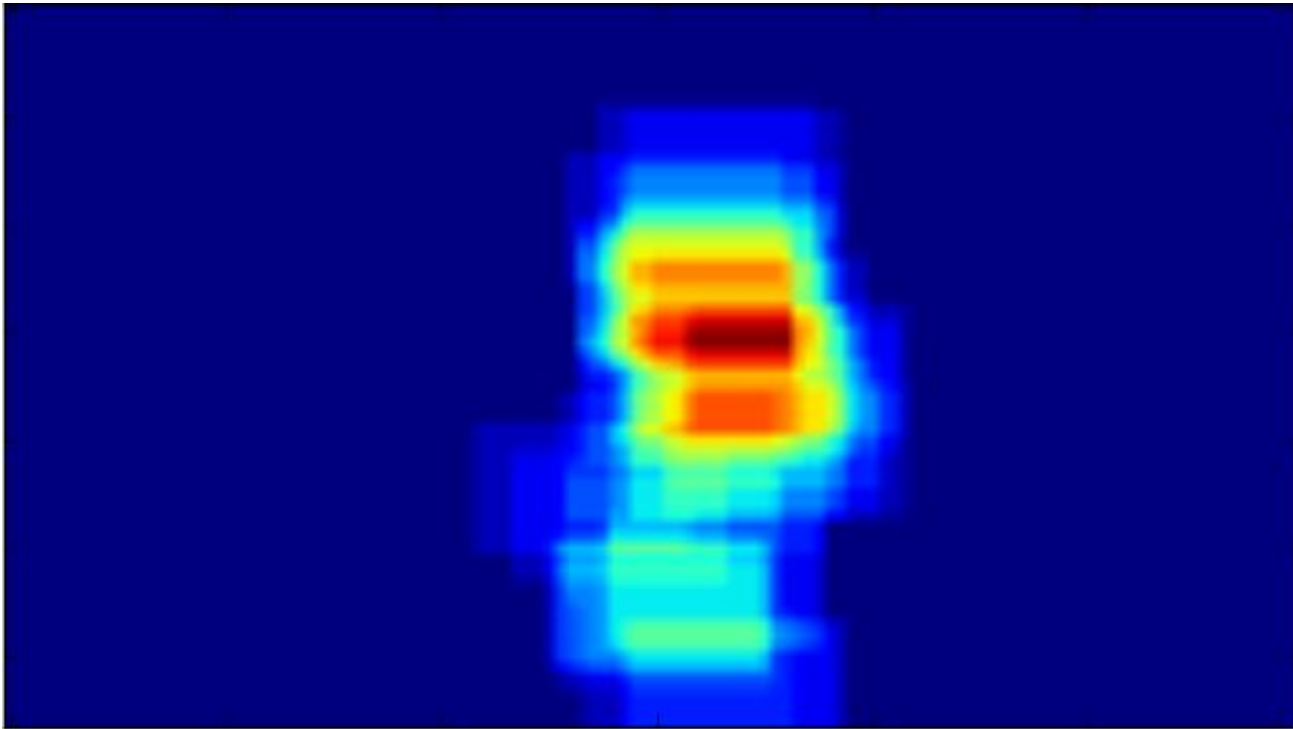


**MS**

**Longer MV → More dependency → More bits**

**Shorter MV → Less compression → More bits**

# Roi Access Pattern



**Reduce bandwidth further, given Roi access statistics?**

# Questions in this paper

- Tiled Streaming
  - Different tile size in the same frame?
- Monolithic Streaming
  - Different motion search range?
- How?

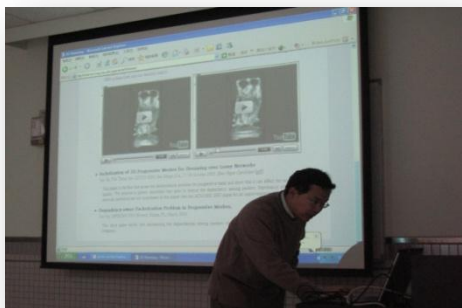
# Adaptive Encoding

Given Rol access statistics, adapt the encoding parameters such that the *expected bandwidth*  $E$  needed to transmit a Rol is minimized

$$E = \sum_{r \in R} c(r) p(r)$$

$c(r)$ : compressed size of Rol  $r$

$p(r)$ : access probability of Rol  $r$



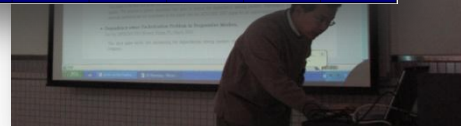
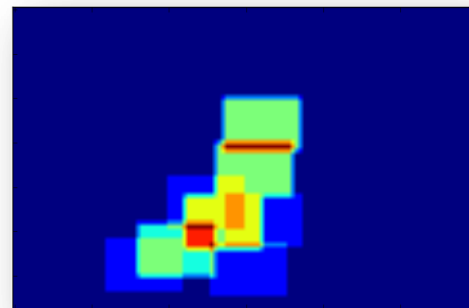
Encoded Video

*Log user selection of RoI*

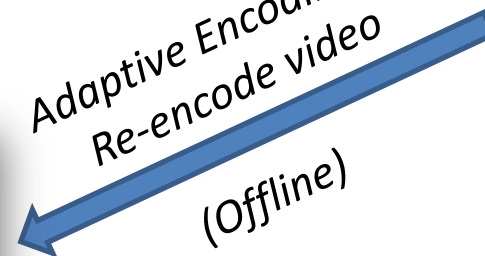


*(Online)*

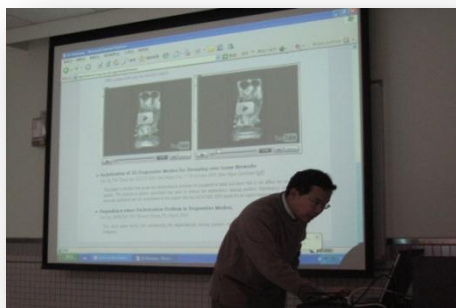
*RoI Access Pattern*



*Adaptive Encoding &  
Re-encode video*

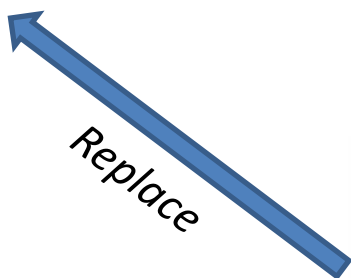


*(Offline)*

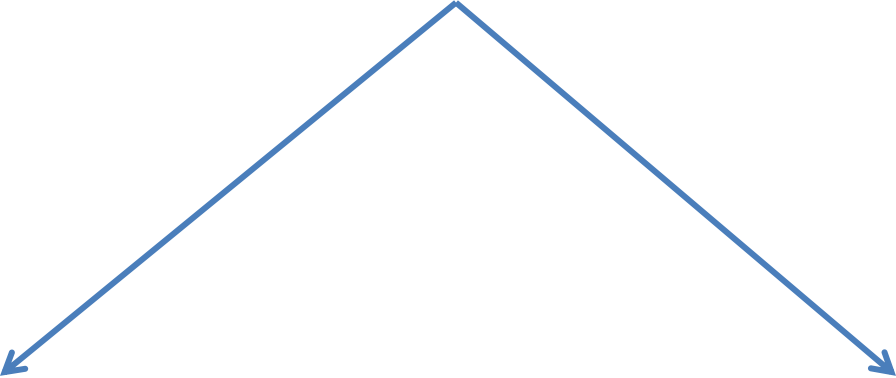


Adaptive  
Encoded Video

*Replace*



# **Adaptive Encoding**



```
graph TD; A[Adaptive Encoding] --> B[Adaptive Tiling (AT)]; A --> C[Monolithic Streaming with Rol-aware Coding (MS-PB)];
```

**Adaptive Tiling  
(AT)**

**Monolithic Streaming  
with Rol-aware Coding  
(MS-PB)**

# Adaptive Tiling

Given RoI access pattern, tile the video  
such that  $E$  is minimized

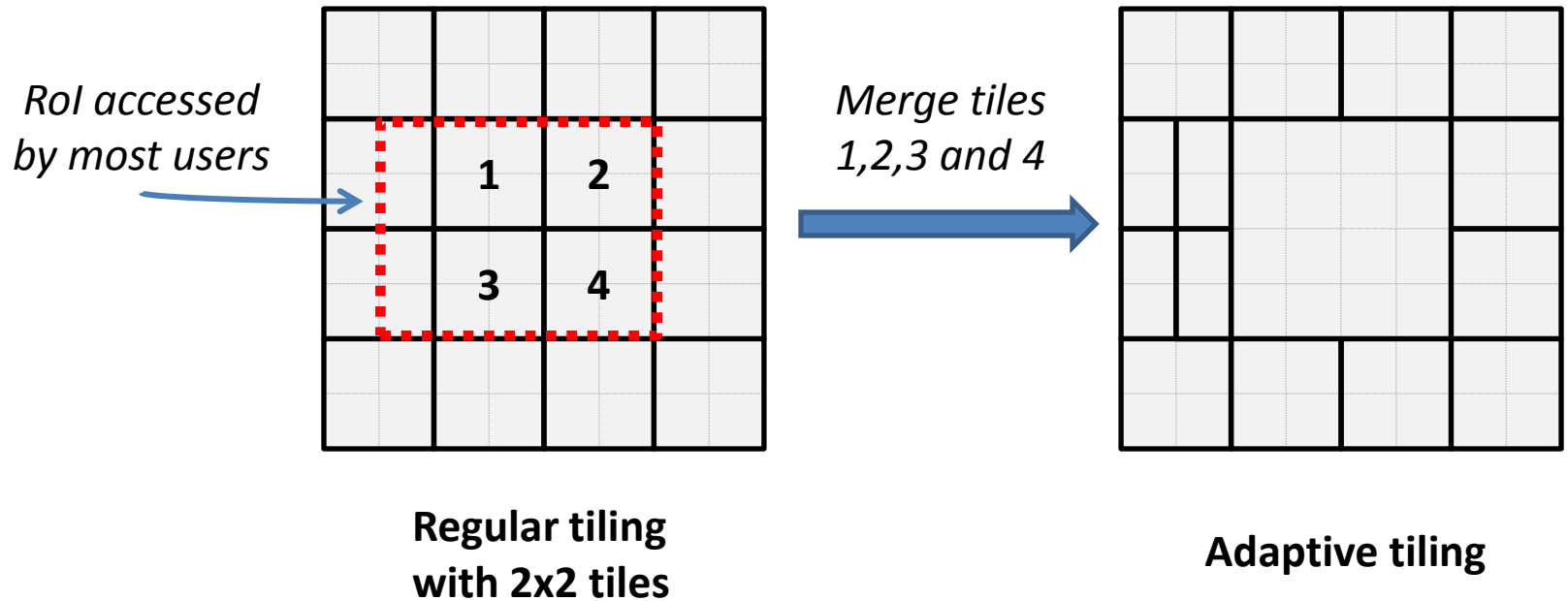
$$E = \sum_{t \in T} c(t) p(t)$$

$c(t)$ : compressed size of tile  $t$

$p(t)$ : access probability of tile  $t$

# Intuition

Allowing tiles of different sizes can reduce bandwidth





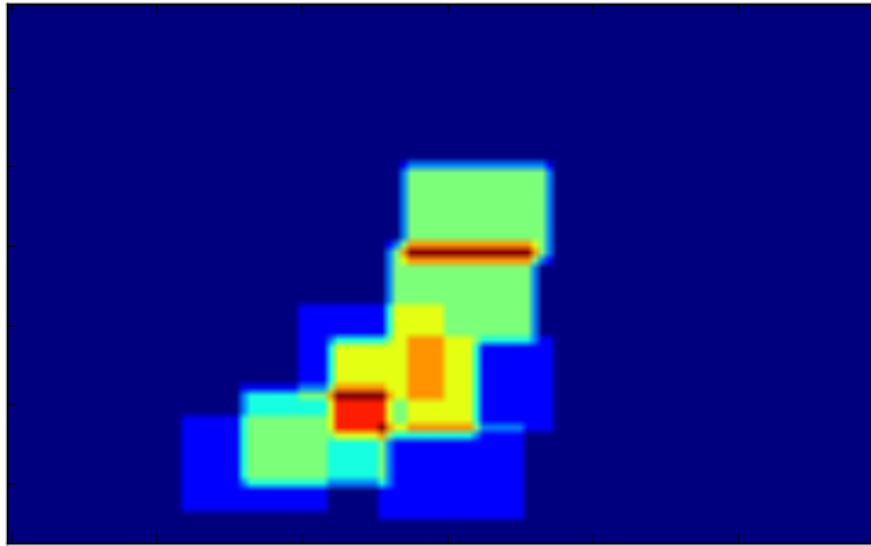
# Greedy Heuristic Tiling

- Start with regular 1x1 tiles
- Merge a tile with its neighbors if expected bandwidth is reduced
- Merge newly-formed tile with its neighbors if bandwidth is reduced

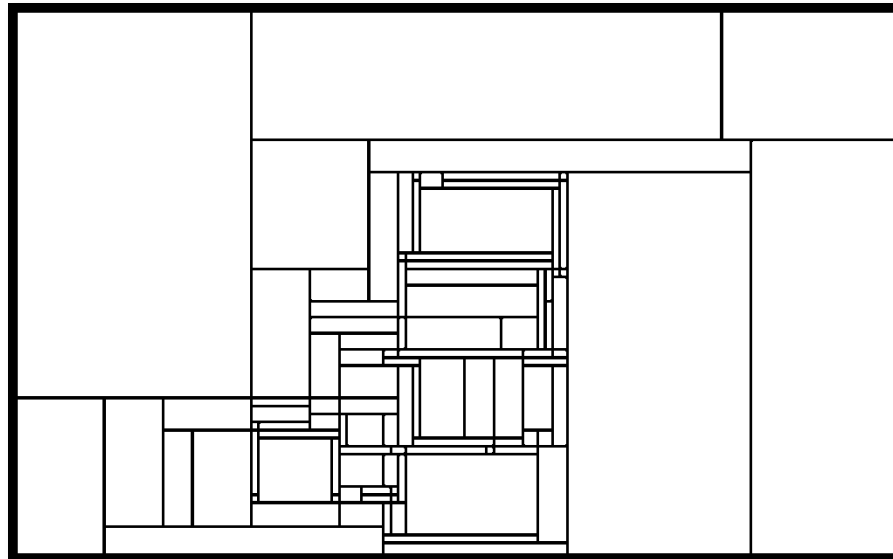
		$t_1$				$t_2$	
		$c(t_1) = 9$				$c(t_2) = 6$	
		$p(t_1) = 0.8$				$p(t_2) = 0.8$	

			$t_{12}$				
			$c(t_{12}) = 11$				
			$p(t_{12}) = 1$				

$$p(t_1)c(t_1) + p(t_2)c(t_2) \geq p(t_{12})c(t_{12})$$



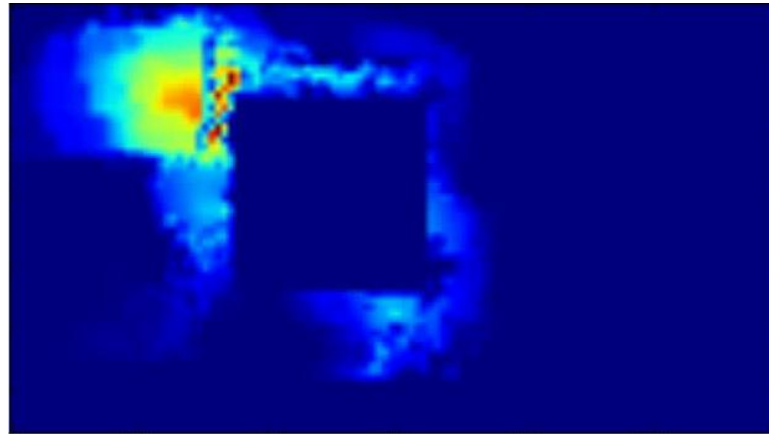
**RoI Access Pattern**



**Resulting tile map**

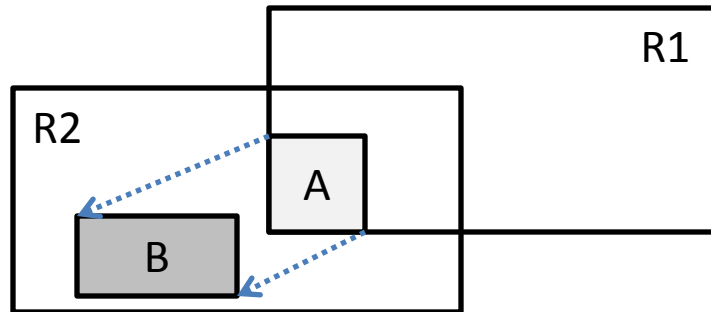
# Monolithic Streaming with Rol-aware Coding

- Referenced MBs form large region outside Rol



- Short motion vector: less bandwidth efficient
- Probabilistic boxing motion vector (MS-PB)

# Intuition

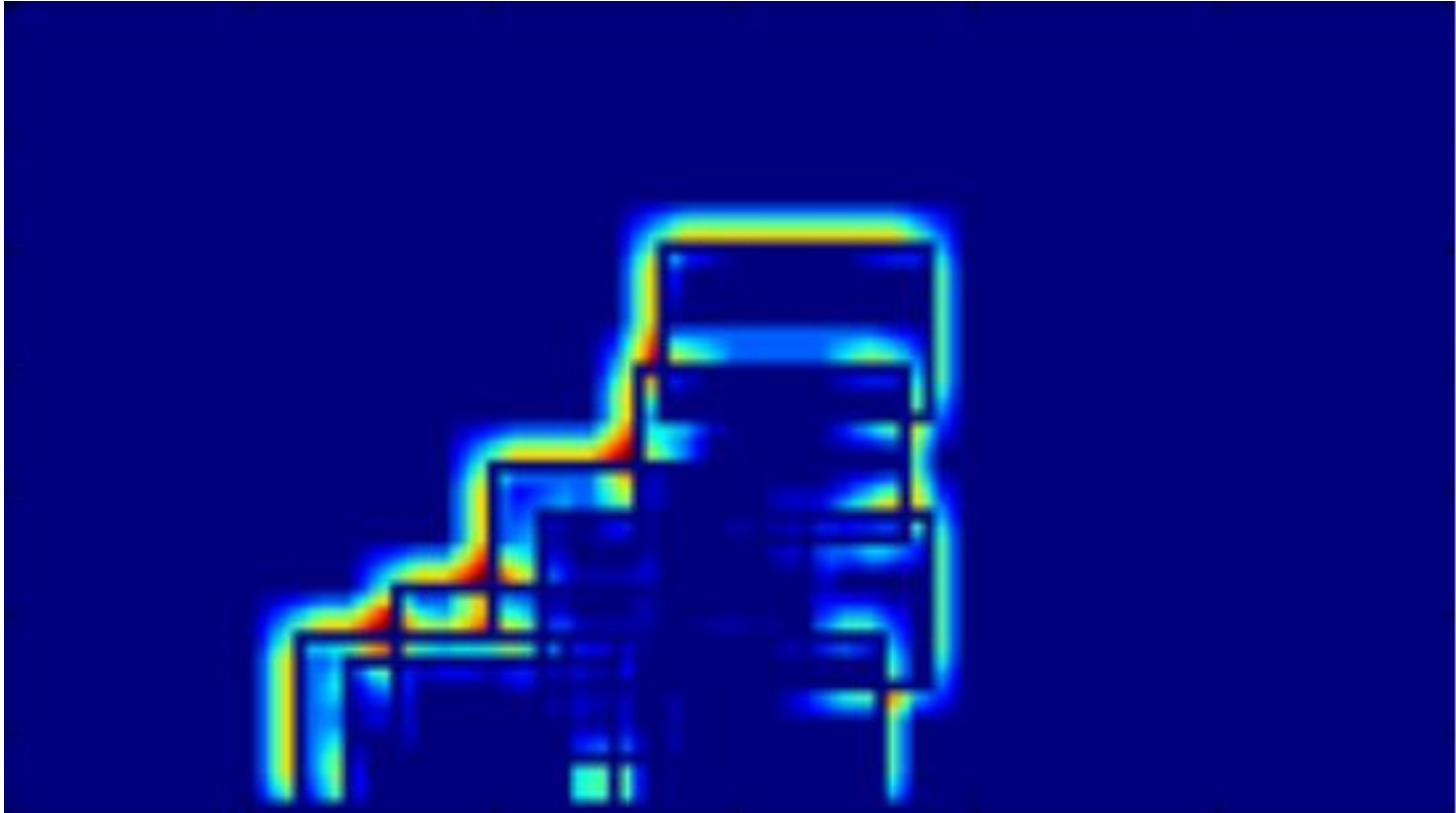


$P(A), P(B)$ : sending A, B

$P(AB)$  : A and B in same RoI

$P(A) - P(AB)$ : sending A independent of B

- $P(A) - P(AB) > P(B)$ 
  - Increase in size of A when sending R2 is marginal
- $P(A) - P(AB) < P(B)$ 
  - Increase in size of A when sending R2 is higher
- $[P(A) - P(AB)] \overline{S(A)} > P(B) S(B)$



**Motion Vector Spread after MS-PB**

# Evaluation

- Evaluate AT and MS-PB in terms of
  - Bandwidth efficiency
  - Compression efficiency
- Benchmark methods
  - Per-Rol
  - Tiled Streaming
  - Monolithic Streaming

# Video Sequences



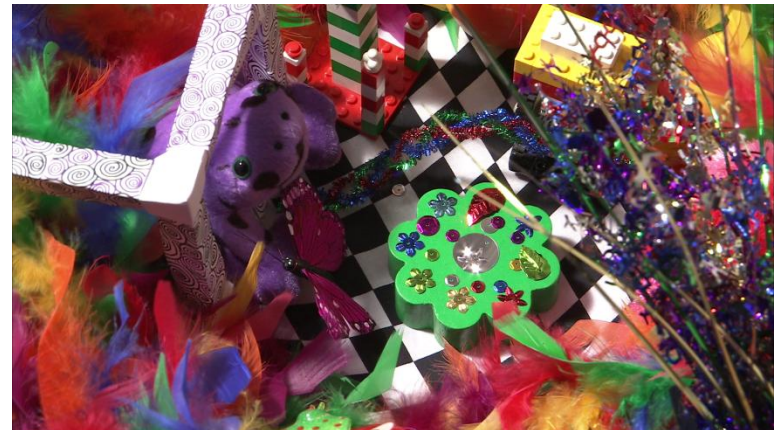
**Rush-Hour (500 frames)**



**Tractor (688 frames)**



**Bball (200 frames)**



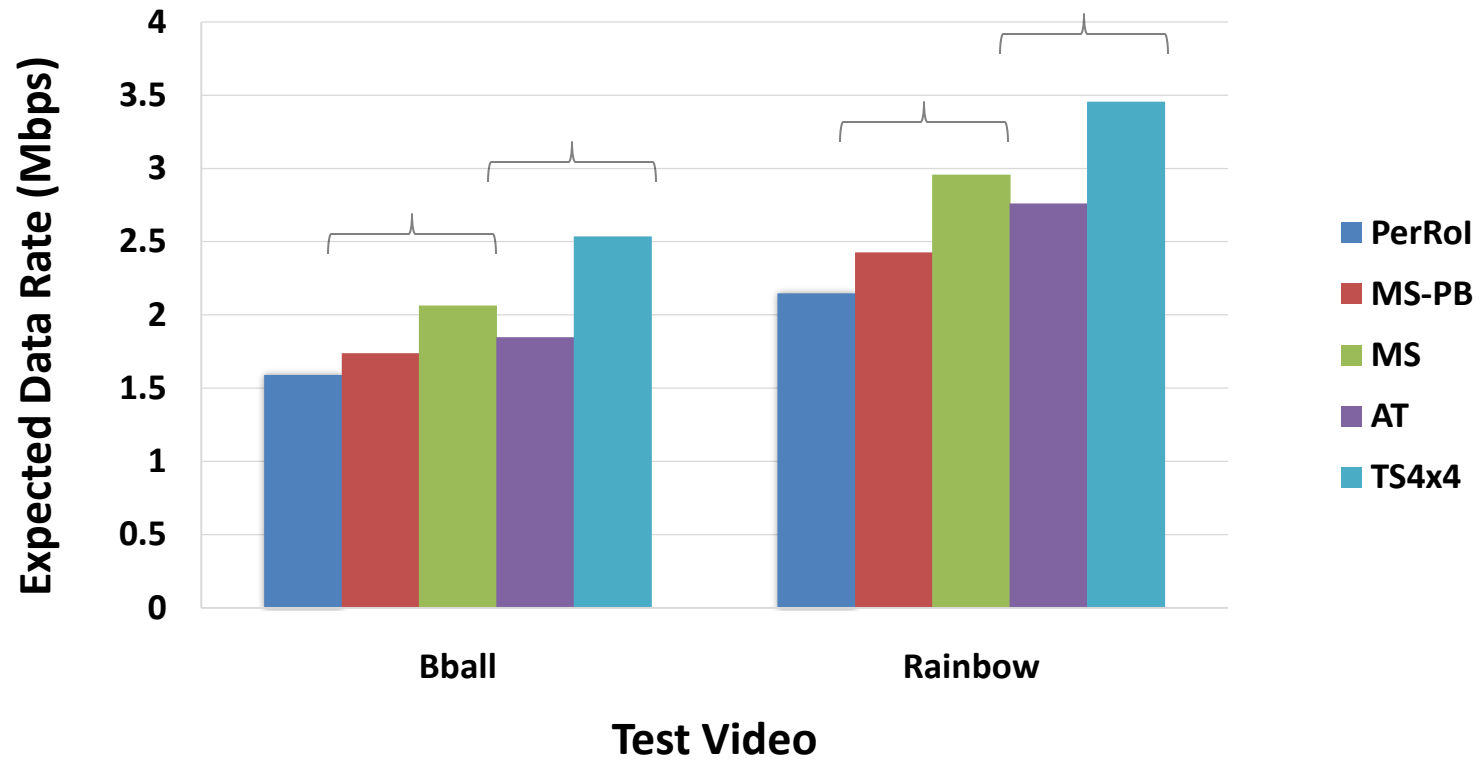
**Rainbow (350 frames)**



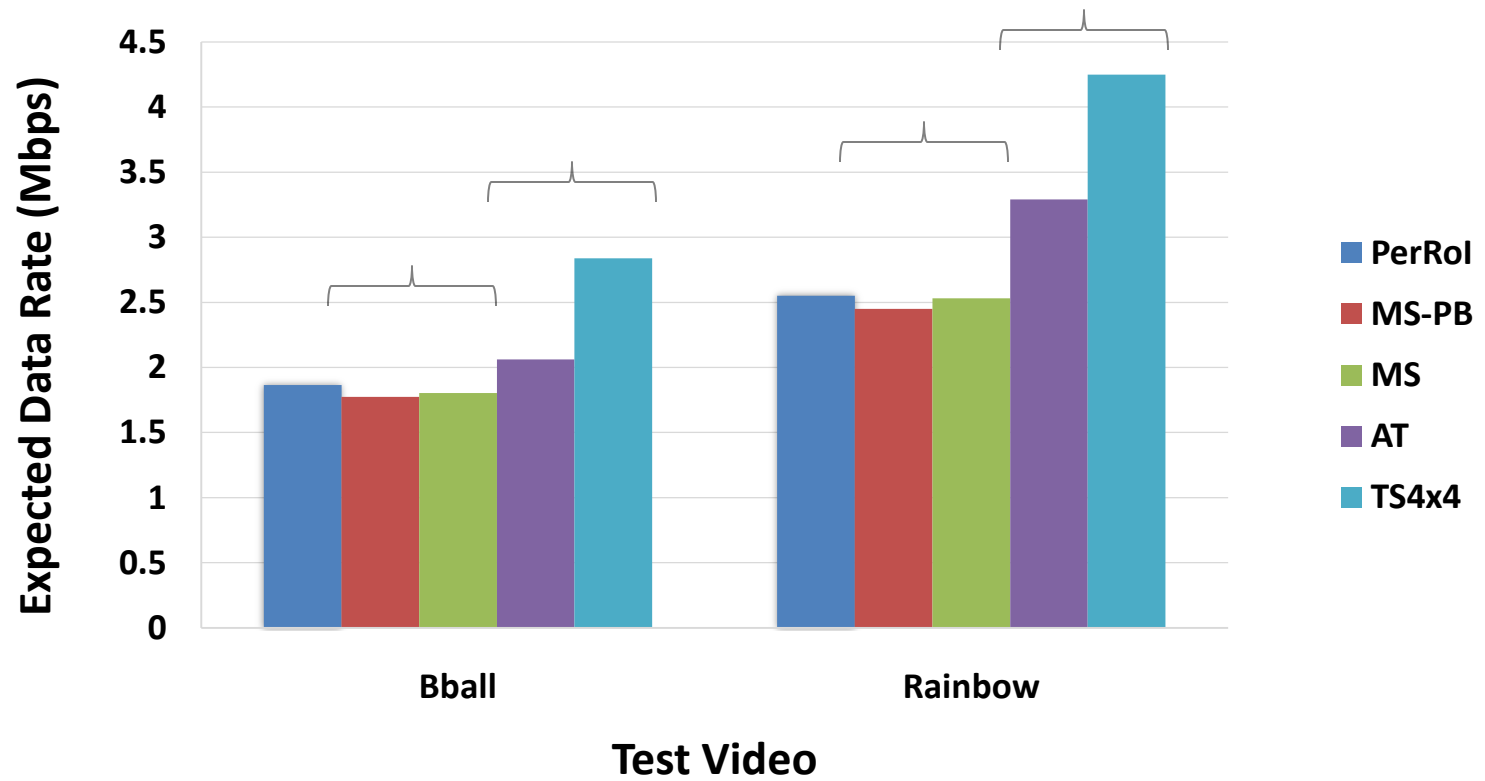
# Experiment Setup

- RoI size: 320x192 pel
- Video resolution 1920x1080 pel
- Evaluation is conducted by a training-testing framework
  - Training and test sets have the same distribution
- One training and test set for each GoP

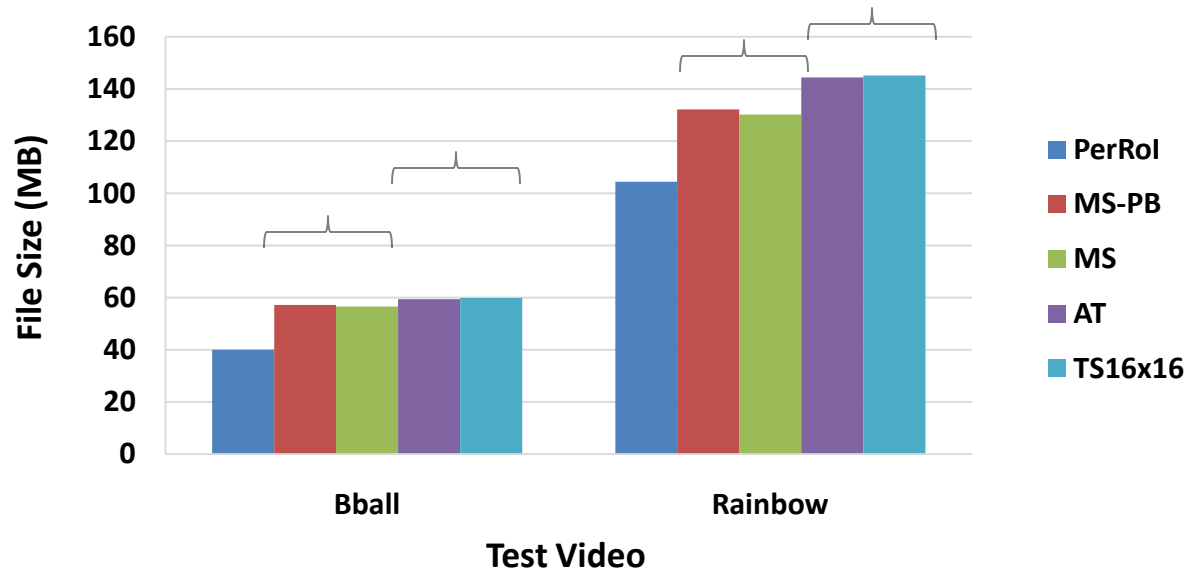
## Expected Data Rate for Different Videos without B-Frames



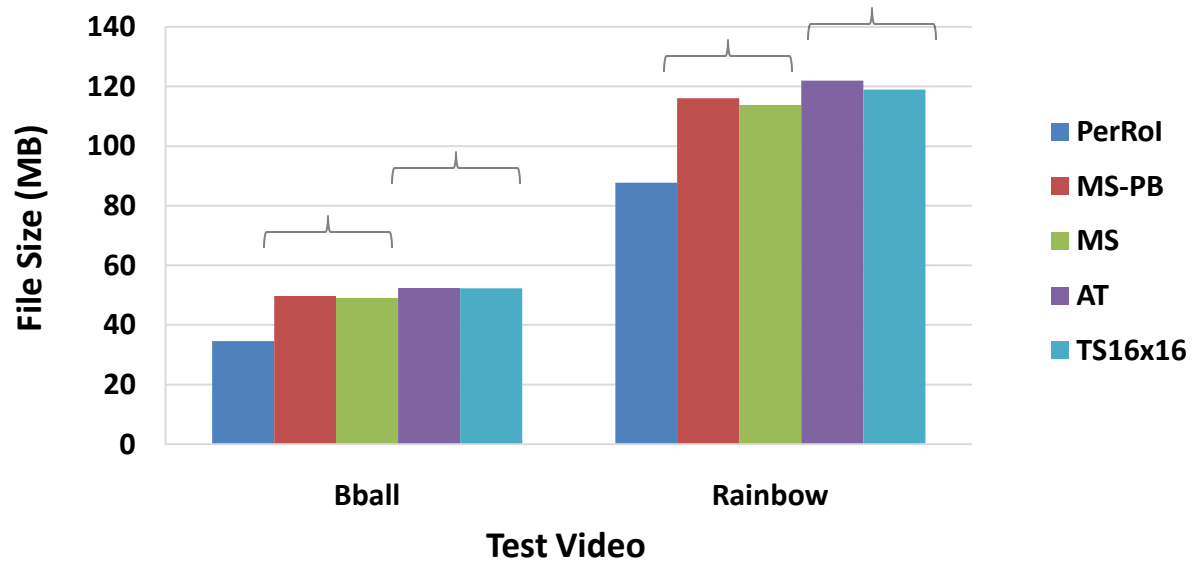
## Expected Data Rate for Different Videos with 2 B-Frames



### Compressed Video File Size with 2 B-Frames

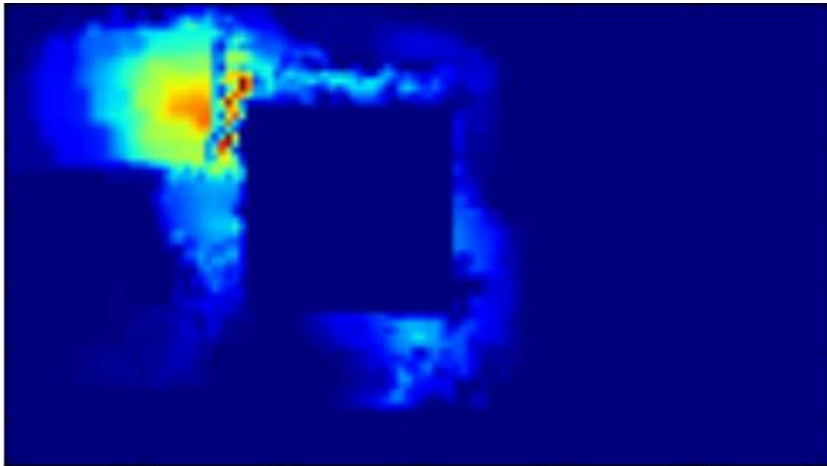


### Compressed Video File Size without B-Frames



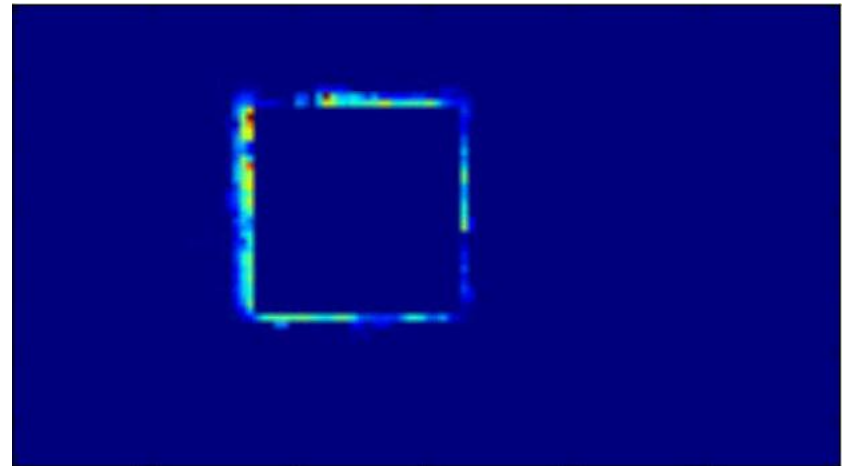
# Presence of B-frame

Without B-frame  
 $MS-PB < MS$



**Motion Vector Spread  
without B-frame**

With B-frame  
 $MS-PB \approx MS$



**Motion Vector Spread  
with 2 B-frame**

# Conclusion & Future Work

- Propose an adaptive encoding approach based on user access patterns
- Reduce bandwidth by 21% (MS-PB) and 27% (AT)
- Limiting motion vector is beneficial to zoomable video with wide spread of dependency
- Future work:
  - Computational complexity
  - Diverse user interest of RoI
  - Frequency of Adaptation

# Thank you

- Questions?
- Feedback/Suggestion?