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School of Interactive Computing

# Computational Photography

Study the basics of computation and its impact on the entire workflow of photography, from capturing, manipulating and collaborating on, and sharing photographs.





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# Video Textures: (Part 1 of 2) How to Make a Video Texture?

How can we find similar  
frames in a Video  
Volume to generate  
longer Videos?

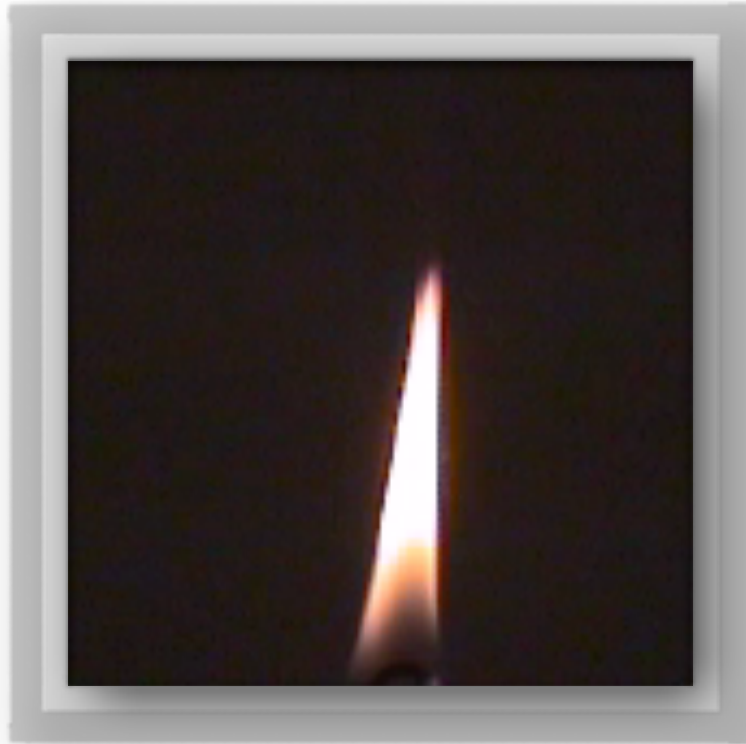
# Lesson Objectives

- ★ Explain in your own words the concept of a Video Texture.
- ★ Describe in your own words the two (2) methods used to compute similarity between frames.
- ★ Describe in your own words how similar frames are used to find transitions to generate Video Textures.



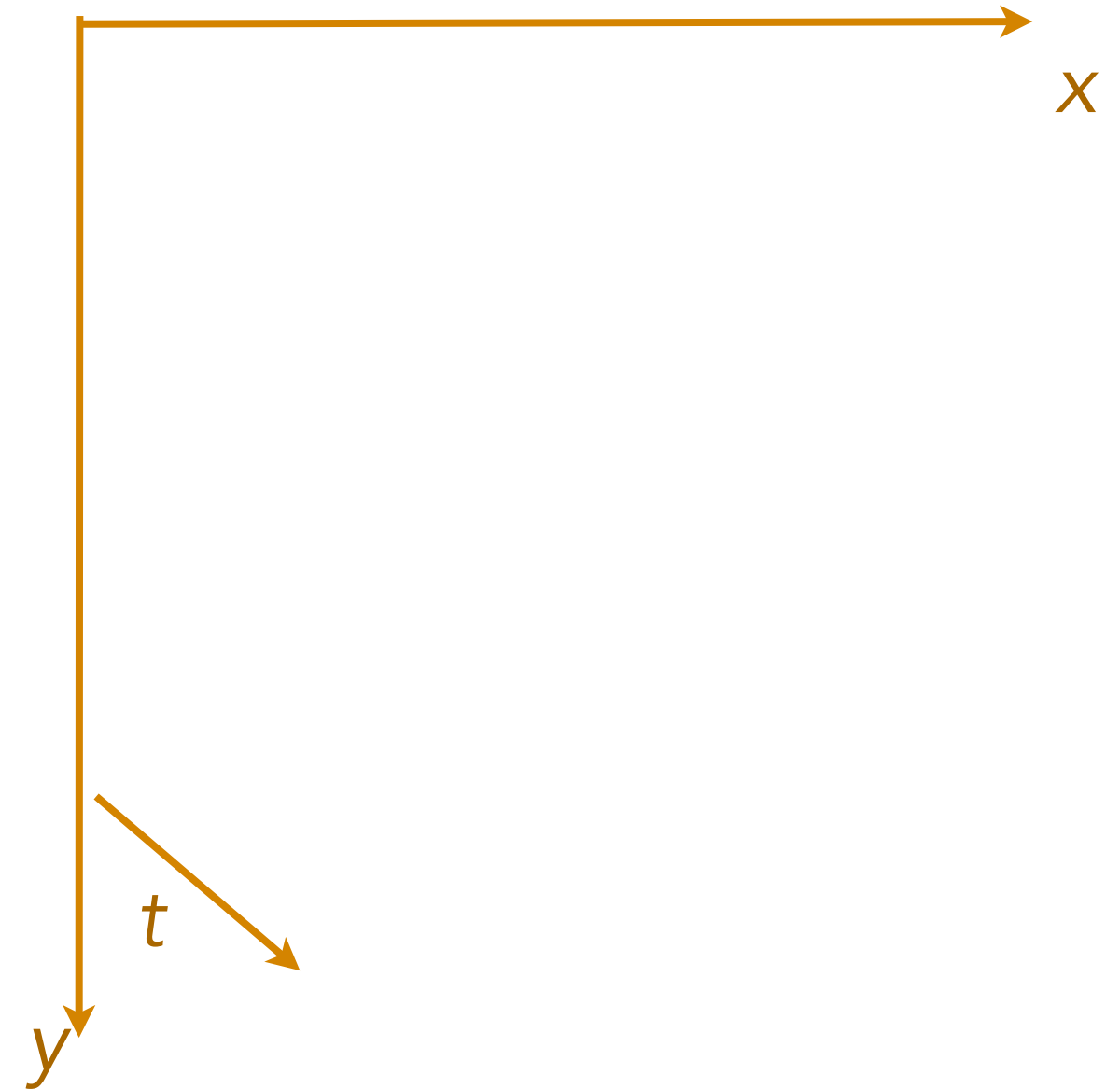


# Review: VIDEO



## ★ “Digital” Video:

- numeric representation in two-dimensions ( $x$  and  $y$ ), stacked in time,  $t$
- referred to as  $I(x,y,t)$  in continuous function form,  $I(i,j,t)$  in discrete

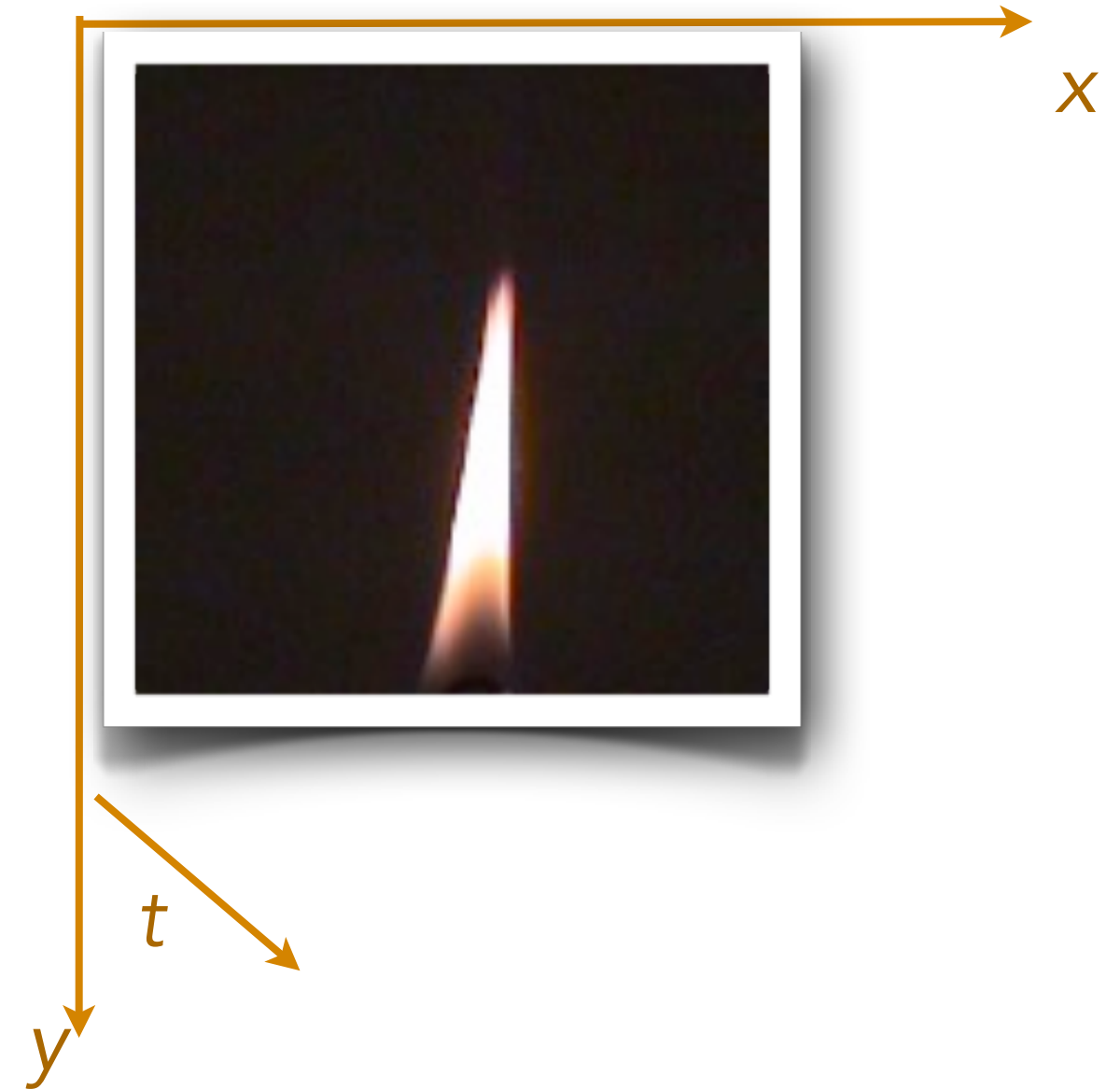


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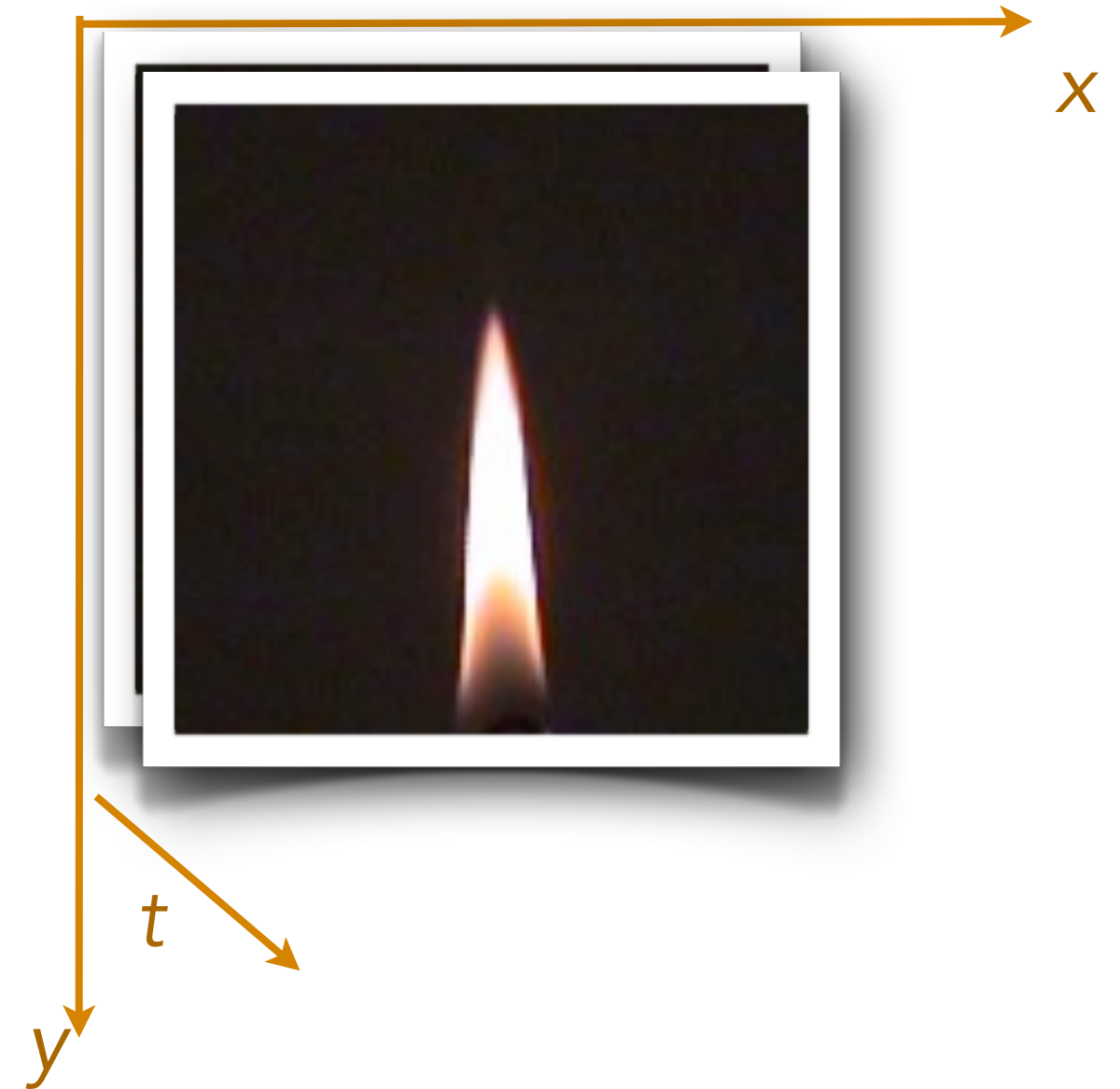


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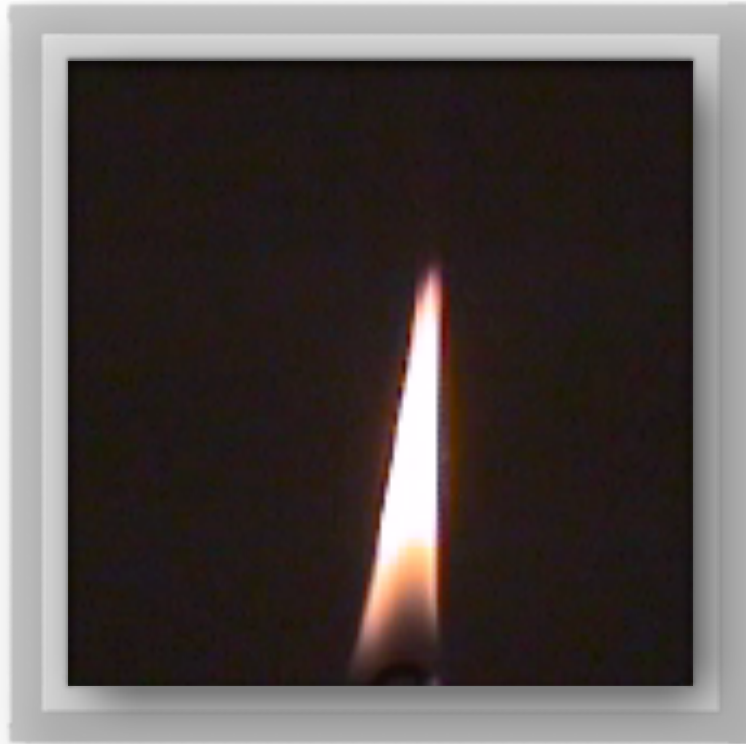


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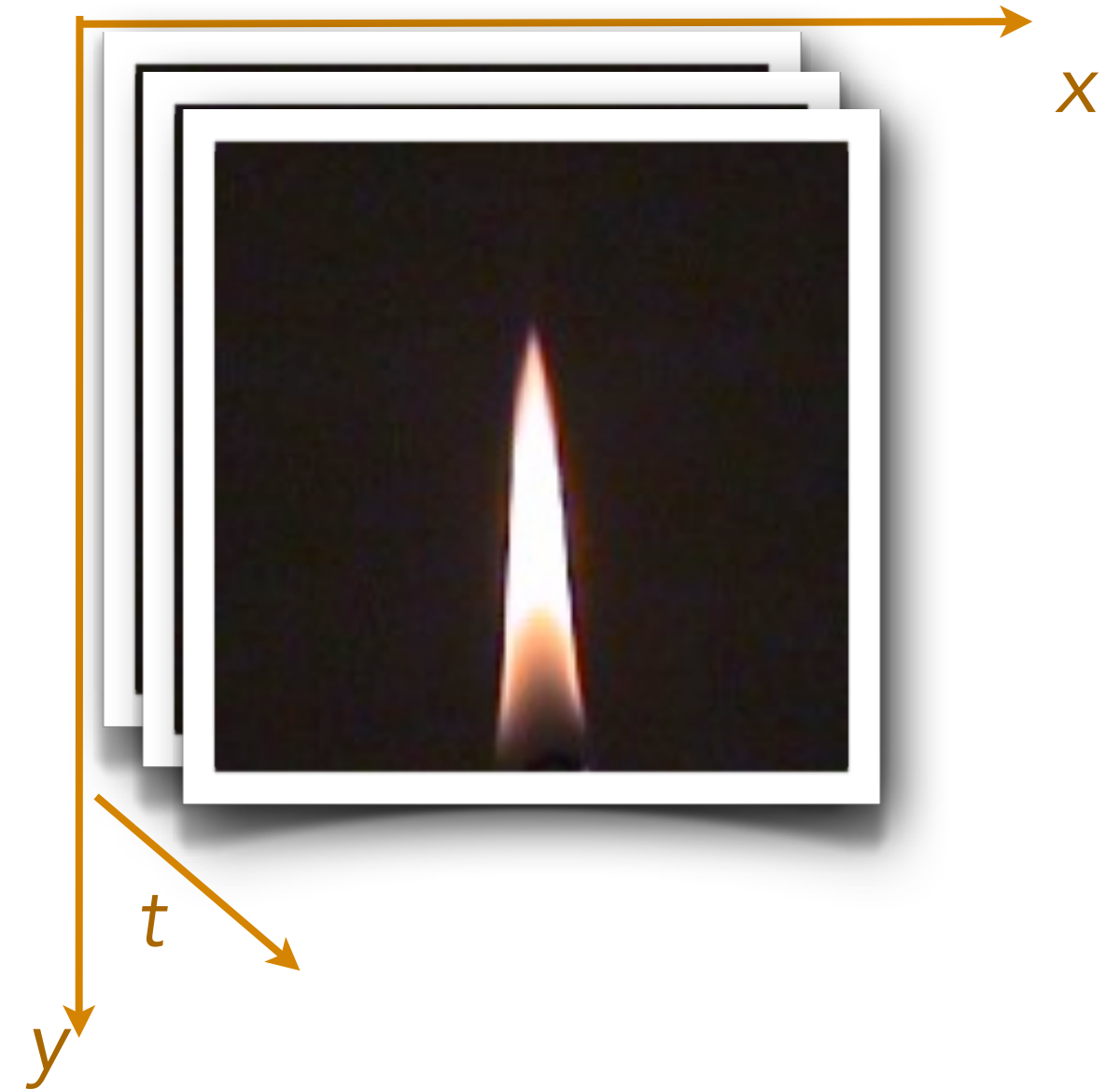


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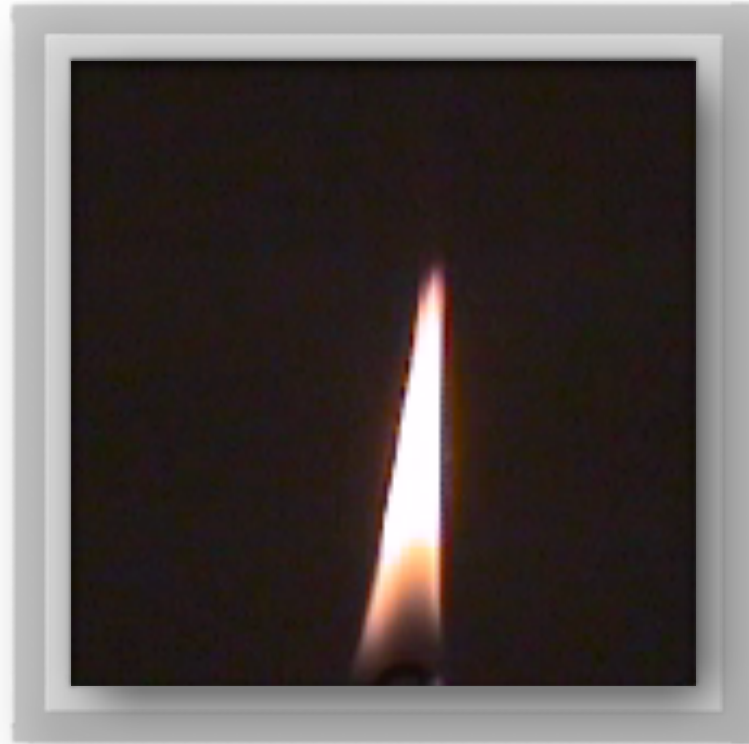


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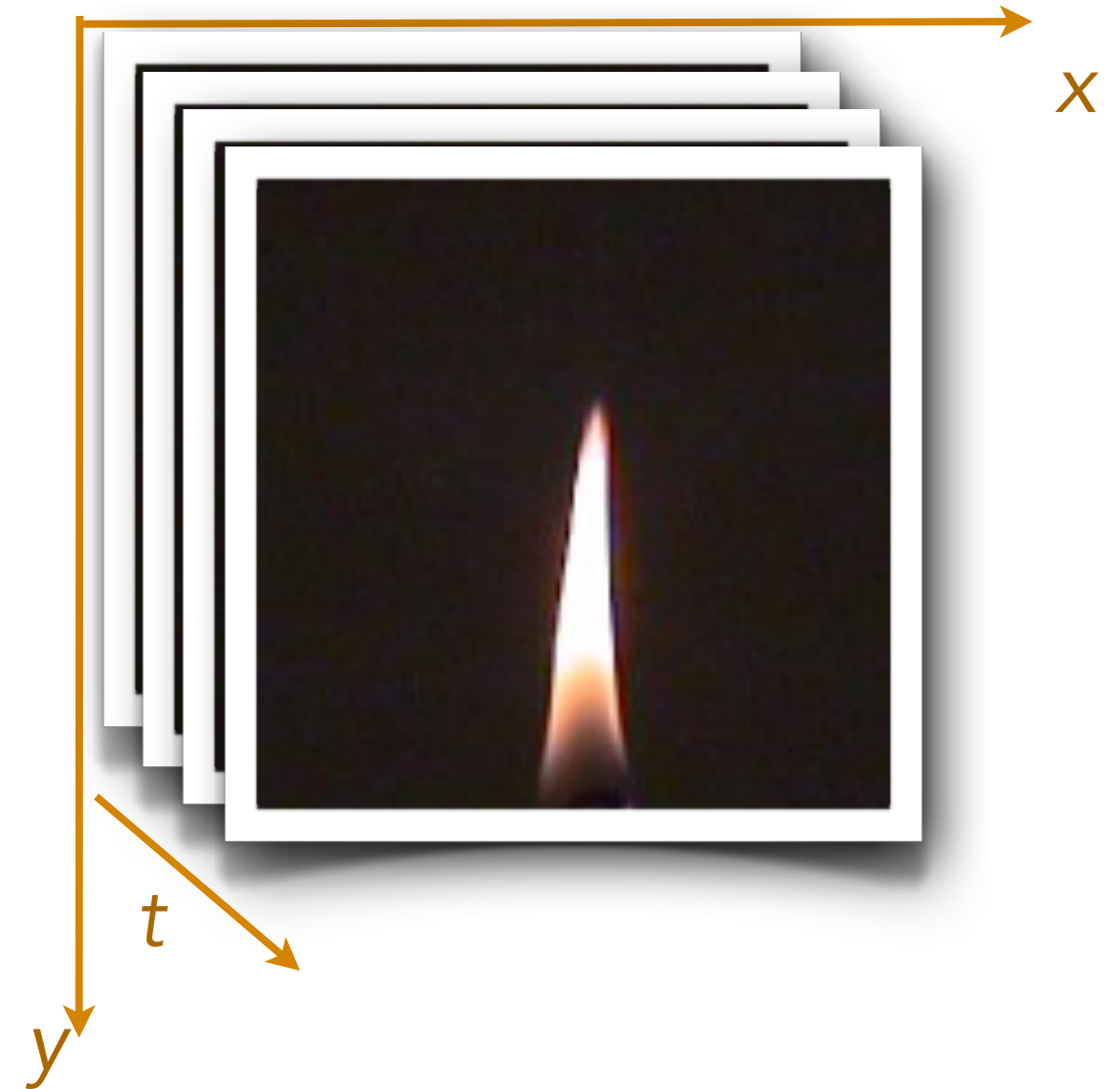


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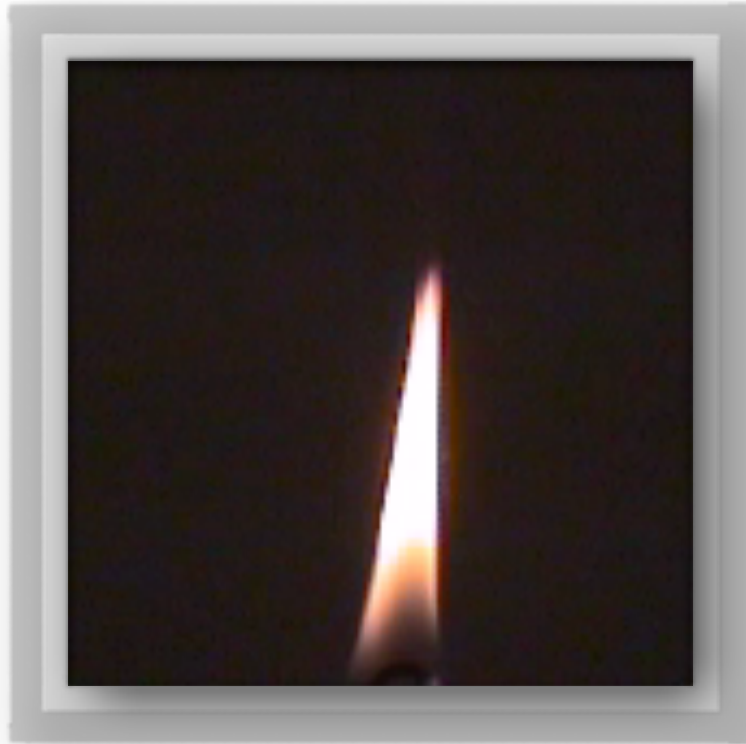
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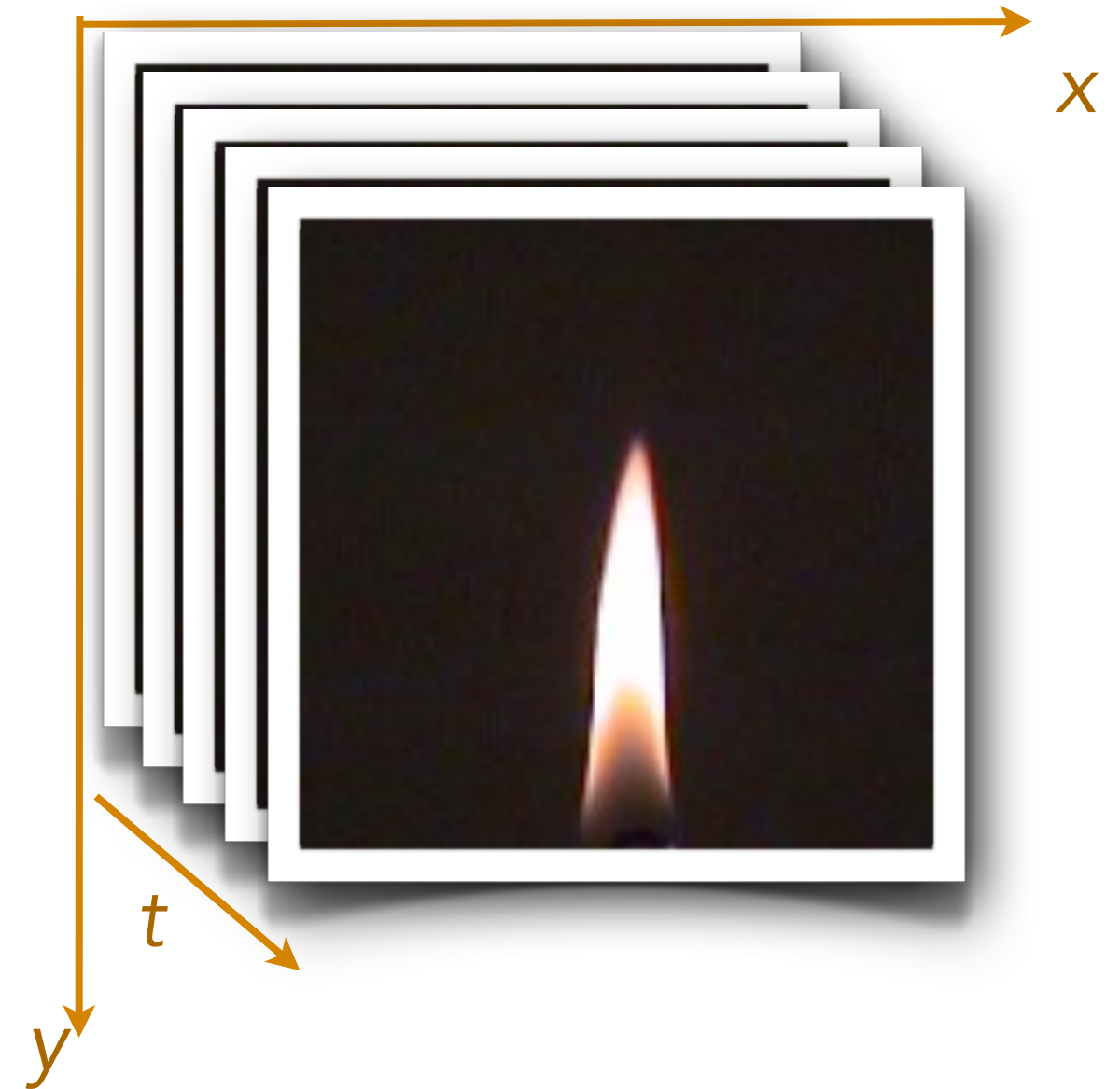


# Review: VIDEO

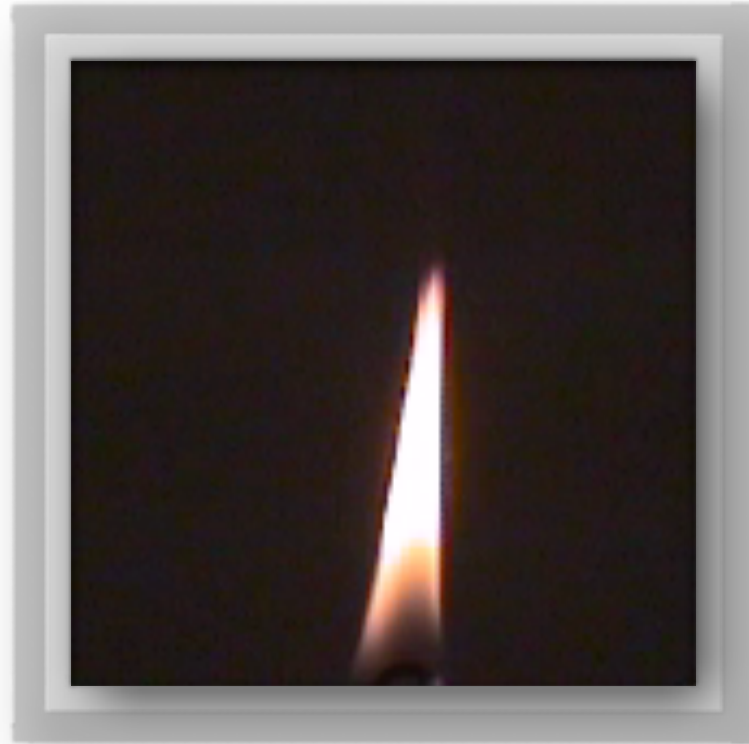


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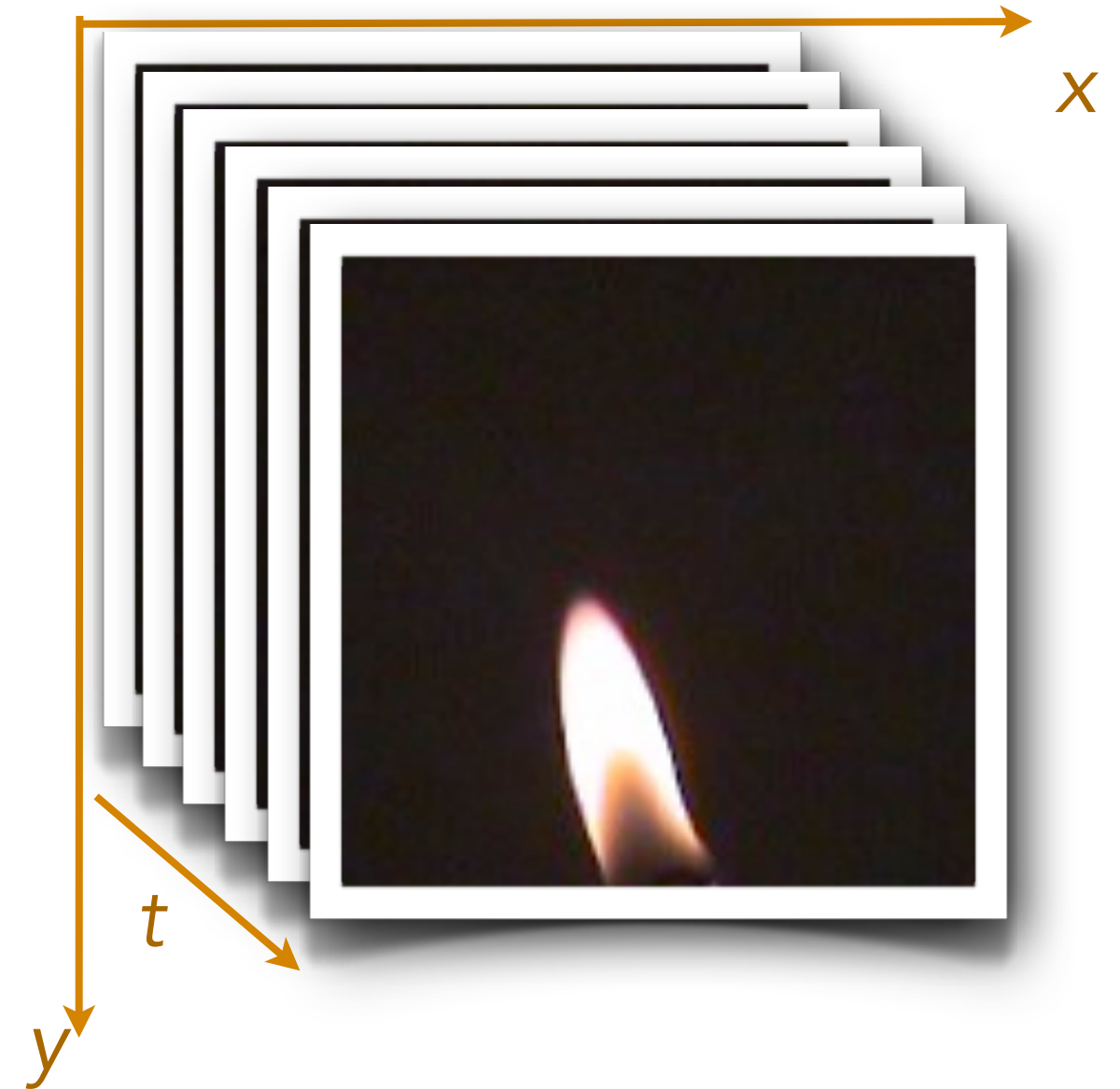


# Review: VIDEO



## ★ “Digital” Video:

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# Video Textures

## Still Pictures



## Video Textures



## Looping Video



## Video Textures

## Video Textures



# Video Textures

Schödl, Szeliski, Salesin, and Essa (2000)

Video Clip

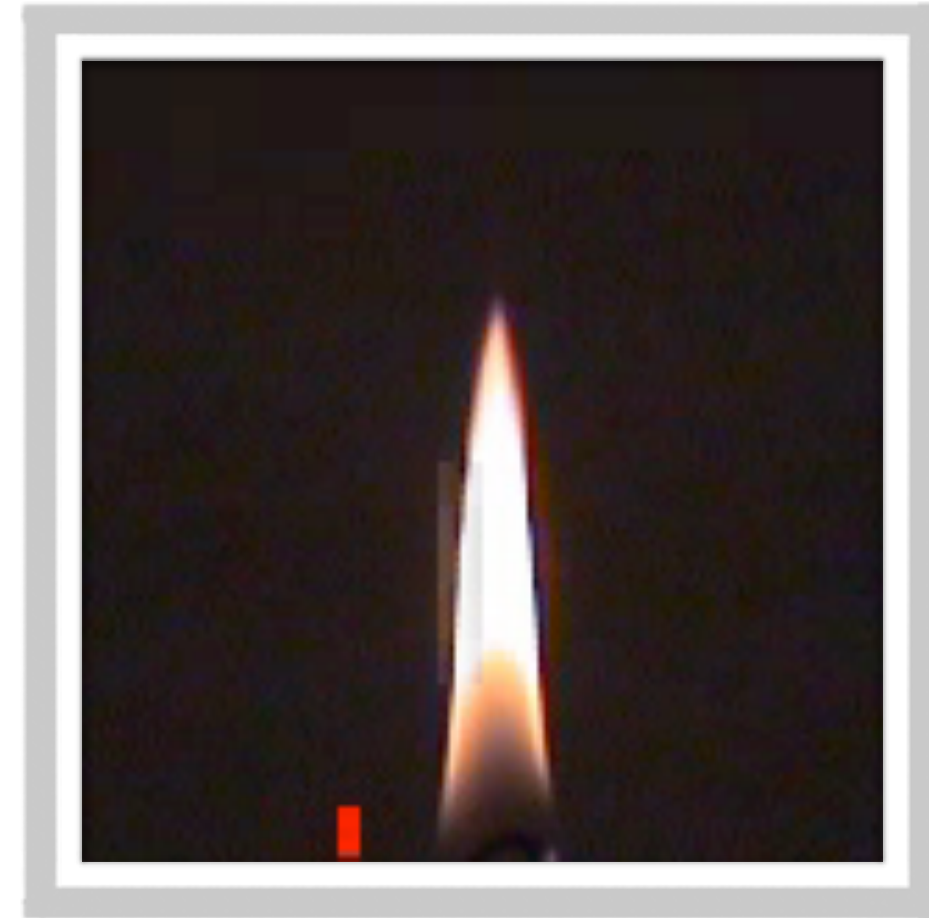
Video Texture

# Video Clip to Video Textures

Video Clip



Video Texture



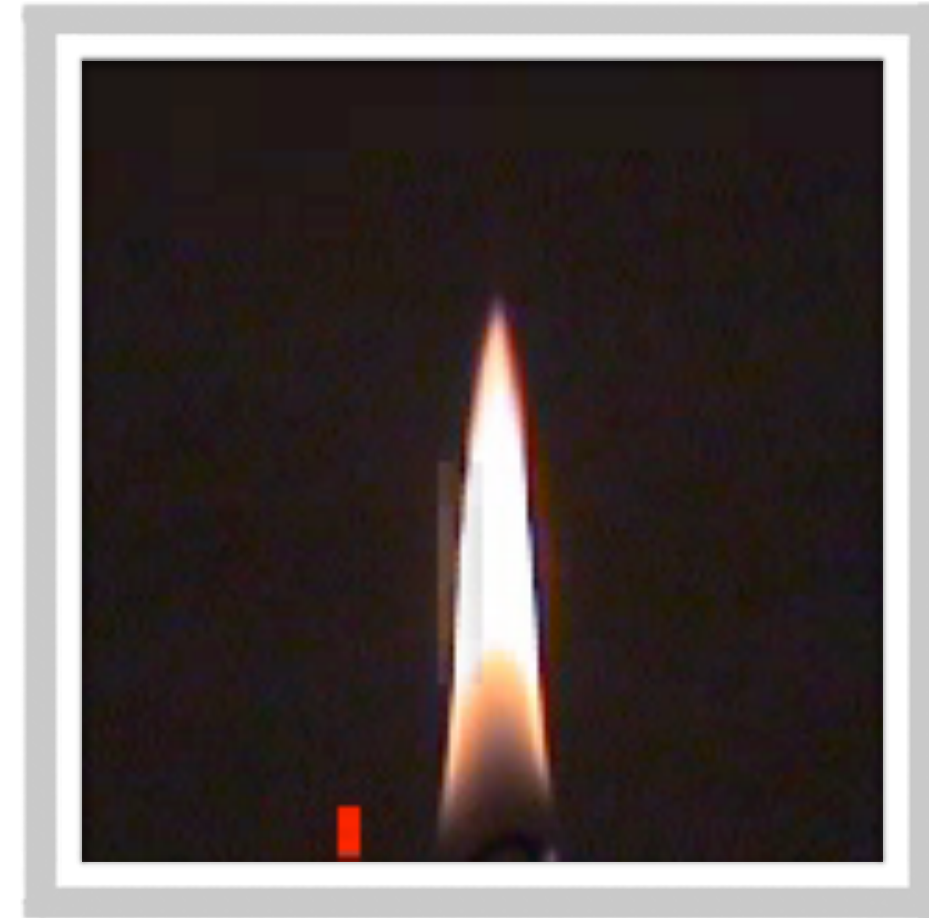
# Video Clip to Video Textures



Video Clip

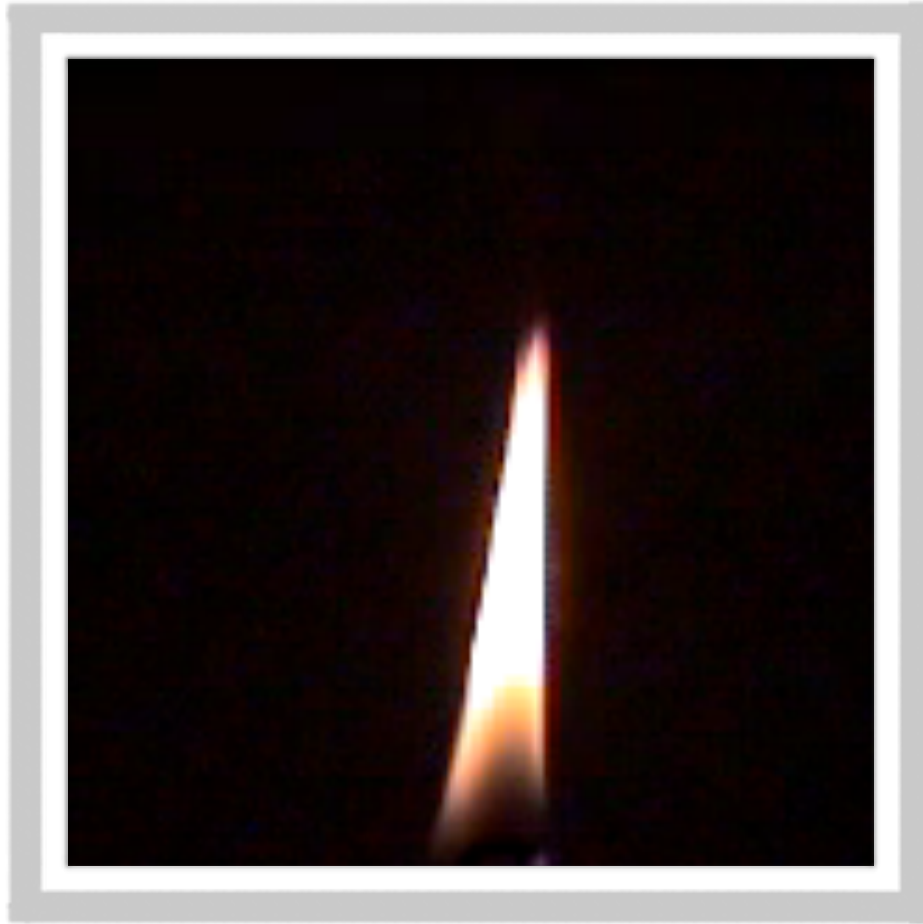


Video Texture

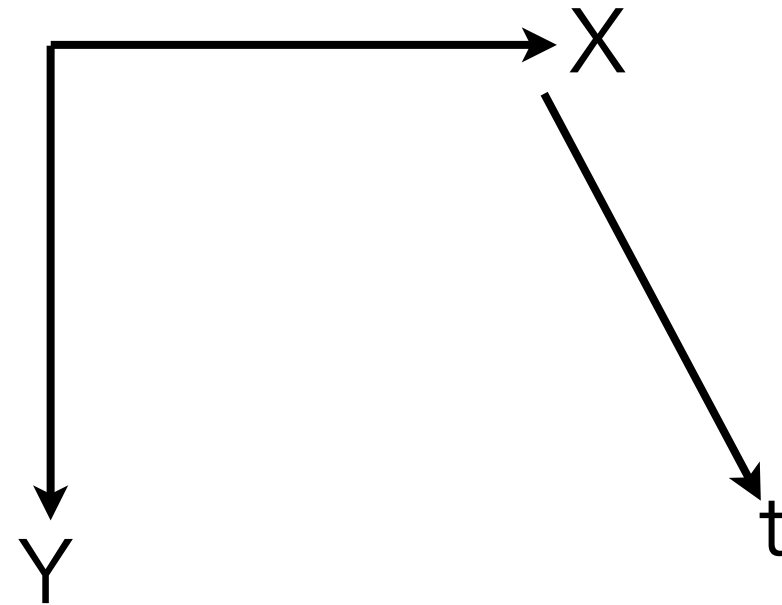


# Video Clip to Video Textures

## Video Clip



90 frames



90 frames:  $f_1, f_2, f_3, \dots, f_{90}$

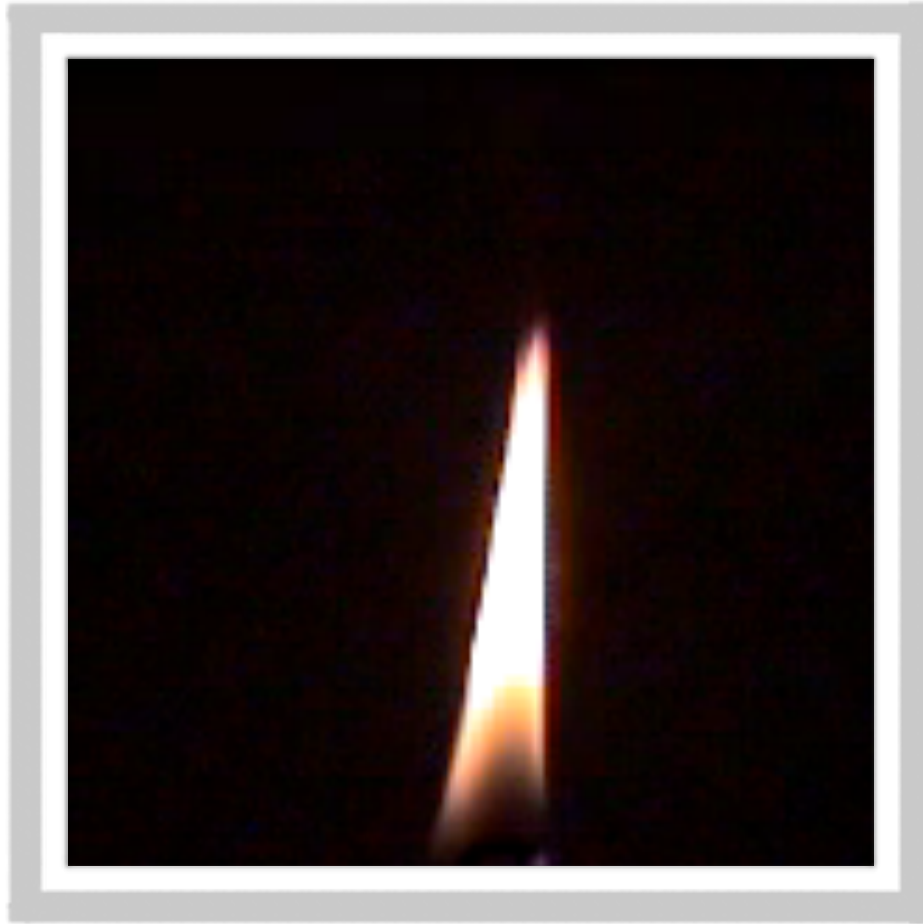


$f_1$

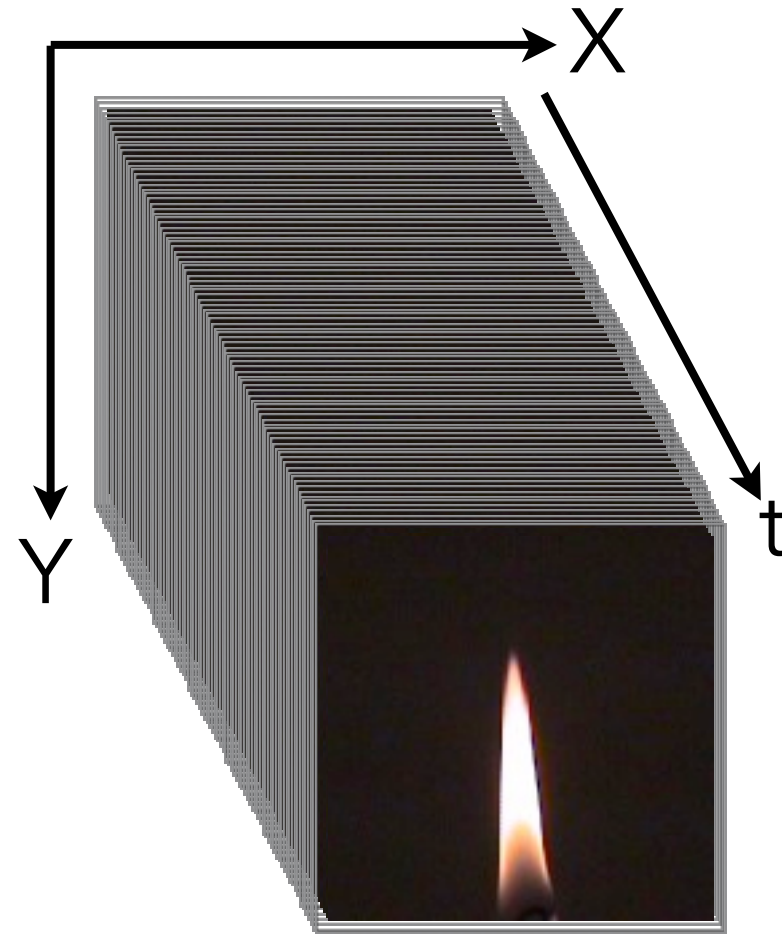
Compute how similar  $f_1$  is to  
all frames:  $f_1, f_2, f_3, \dots, f_{90}$   
Do this for all  $f_1, f_2, f_3, \dots, f_{90}$

# Video Clip to Video Textures

## Video Clip



90 frames



90 frames:  $f_1, f_2, f_3, \dots, f_{90}$



$f_1$

Compute how similar  $f_1$  is to  
all frames:  $f_1, f_2, f_3, \dots, f_{90}$   
Do this for all  $f_1, f_2, f_3, \dots, f_{90}$

# Video Clip to Video Textures



$f_1$

$f_2$

$f_3$

$f_4$

$f_5$

$f_6$

## Similarity Metric (1)

- ★ One method to compute similarity is to compute the Euclidean Distance between two Frames.
- ★ Consider two frames,  $p = \{p_1, p_2, \dots, p_N\}$  and  $q = \{q_1, q_2, \dots, q_N\}$

$$d_2(p, q) = \sqrt{(p_1 - q_1)^2 + (p_2 - q_2)^2 + \dots + (p_n - q_n)^2}$$

$$d_2(p, q) = \sqrt{\sum_{i=1}^N (p_i - q_i)^2}$$

This distance metric is referred to as  $L^2$  norm





$f_1$

$f_2$

$f_3$

$f_4$

$f_5$

$f_6$

## Similarity Metric (2)

- ★ Another method to compute similarity is to compute the Manhattan Distance between two Frames.
- ★ Consider two frames,  $p = \{p_1, p_2, \dots p_N\}$  and  $q = \{q_1, q_2, \dots q_N\}$

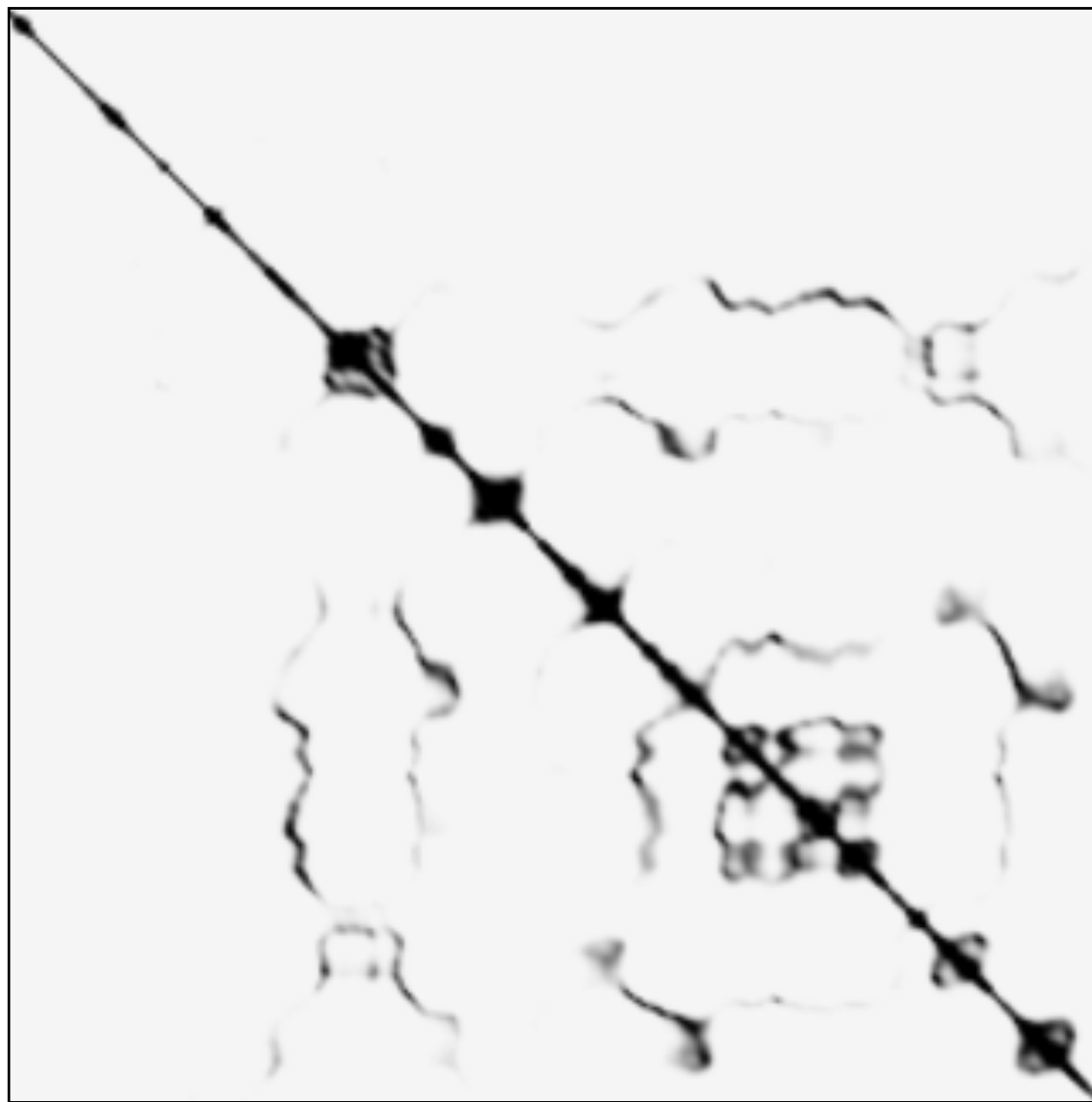
$$d_1(p, q) = (p_1 - q_1) + (p_2 - q_2) + \dots + (p_n - q_n)$$

$$d_1(p, q) = \sum_{i=1}^N |p_i - q_i|$$

This distance metric is referred to as L<sup>1</sup> norm.  
(| .. | implies Absolute)

# Finding Similar Frames

vs.  $\longrightarrow$  Frame  $i$

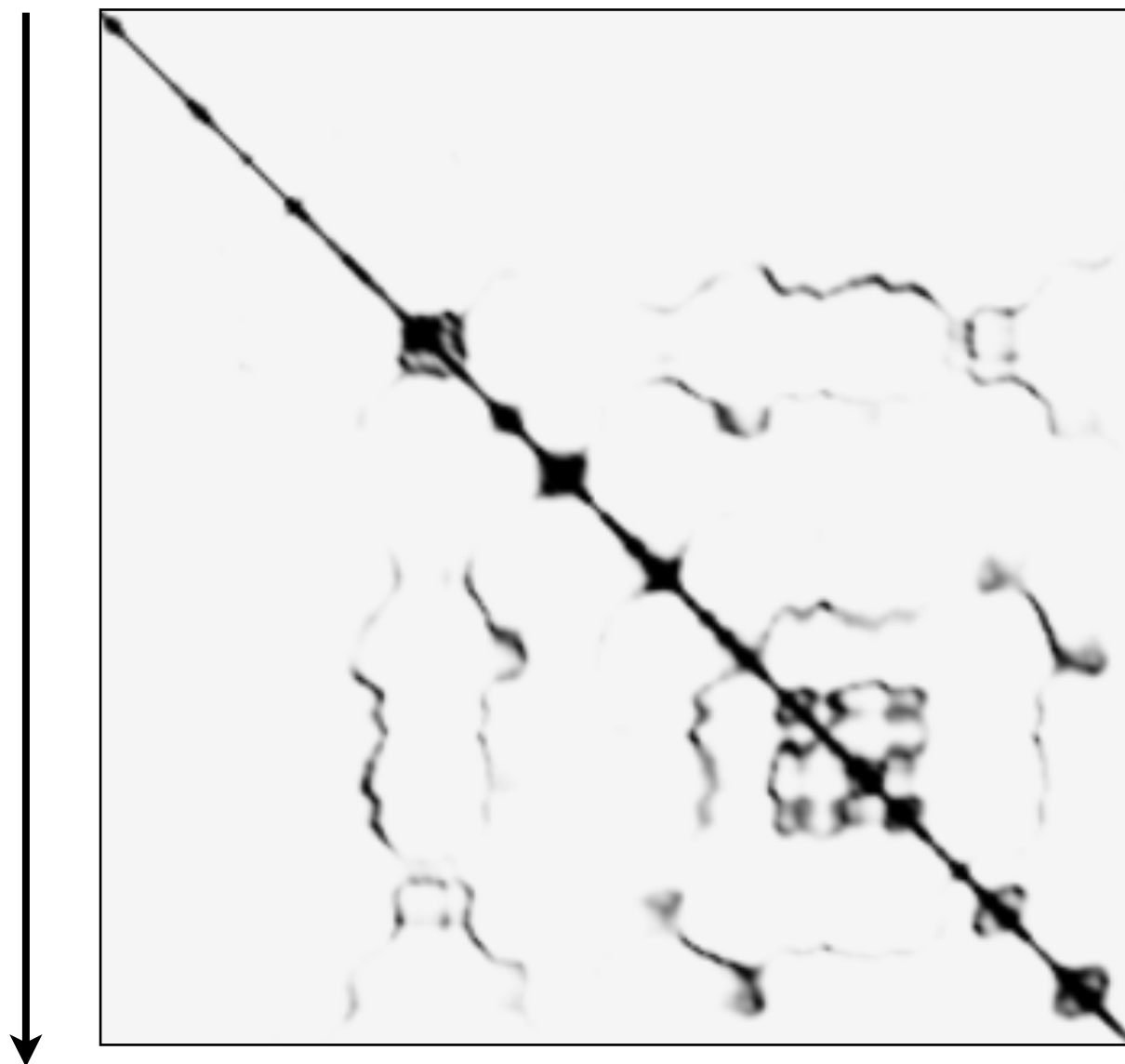


Frame  $j$

# Finding Similar Frames

- ★ Compute Euclidean Distance  $d_{ij}$  between all  $N$  Frames

vs.  Frame  $i$

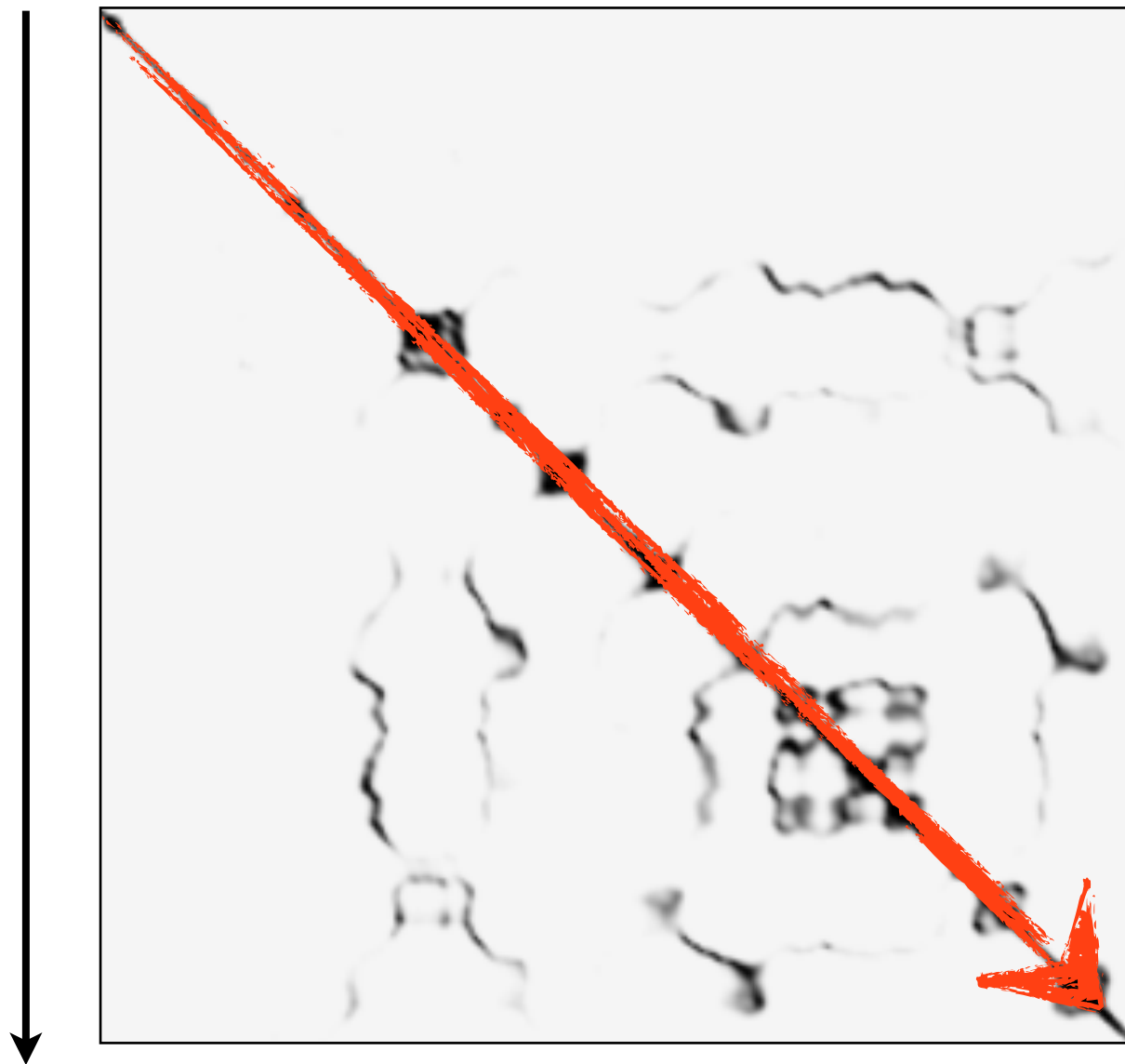


Frame  $j$

# Finding Similar Frames

- ★ Compute Euclidean Distance  $d_{ij}$  between all  $N$  Frames

vs.  Frame  $i$



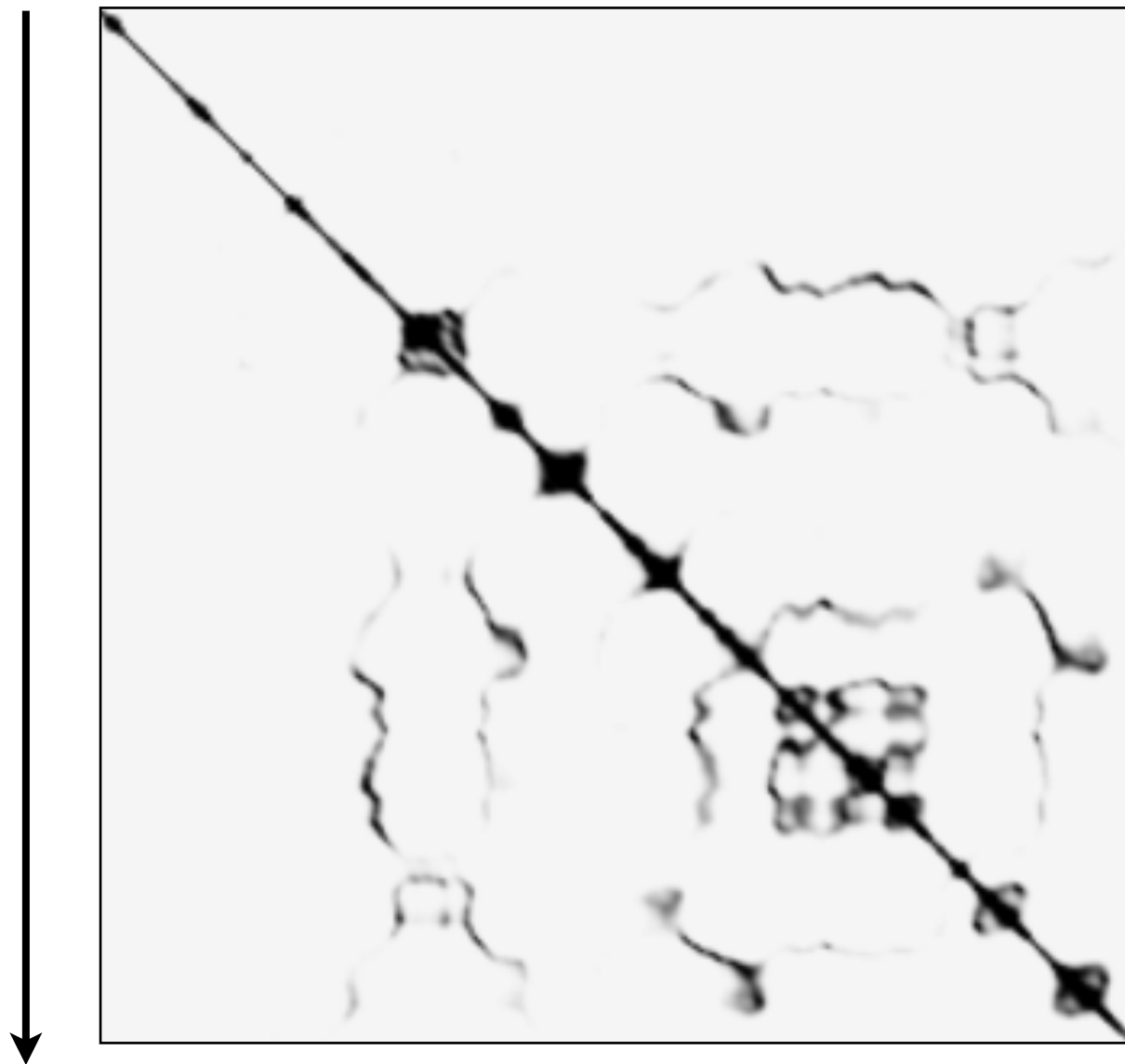
Frame  $j$



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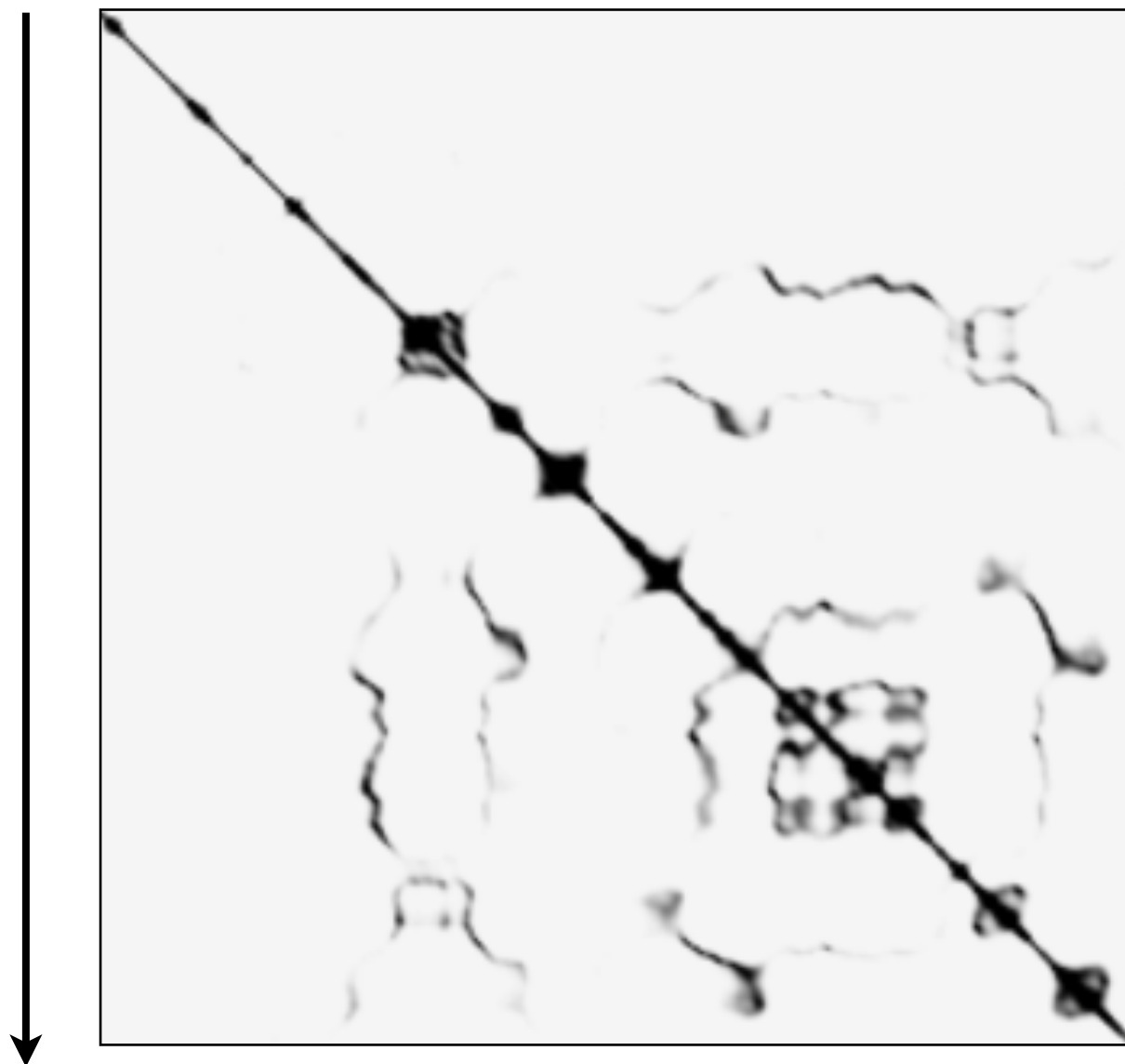


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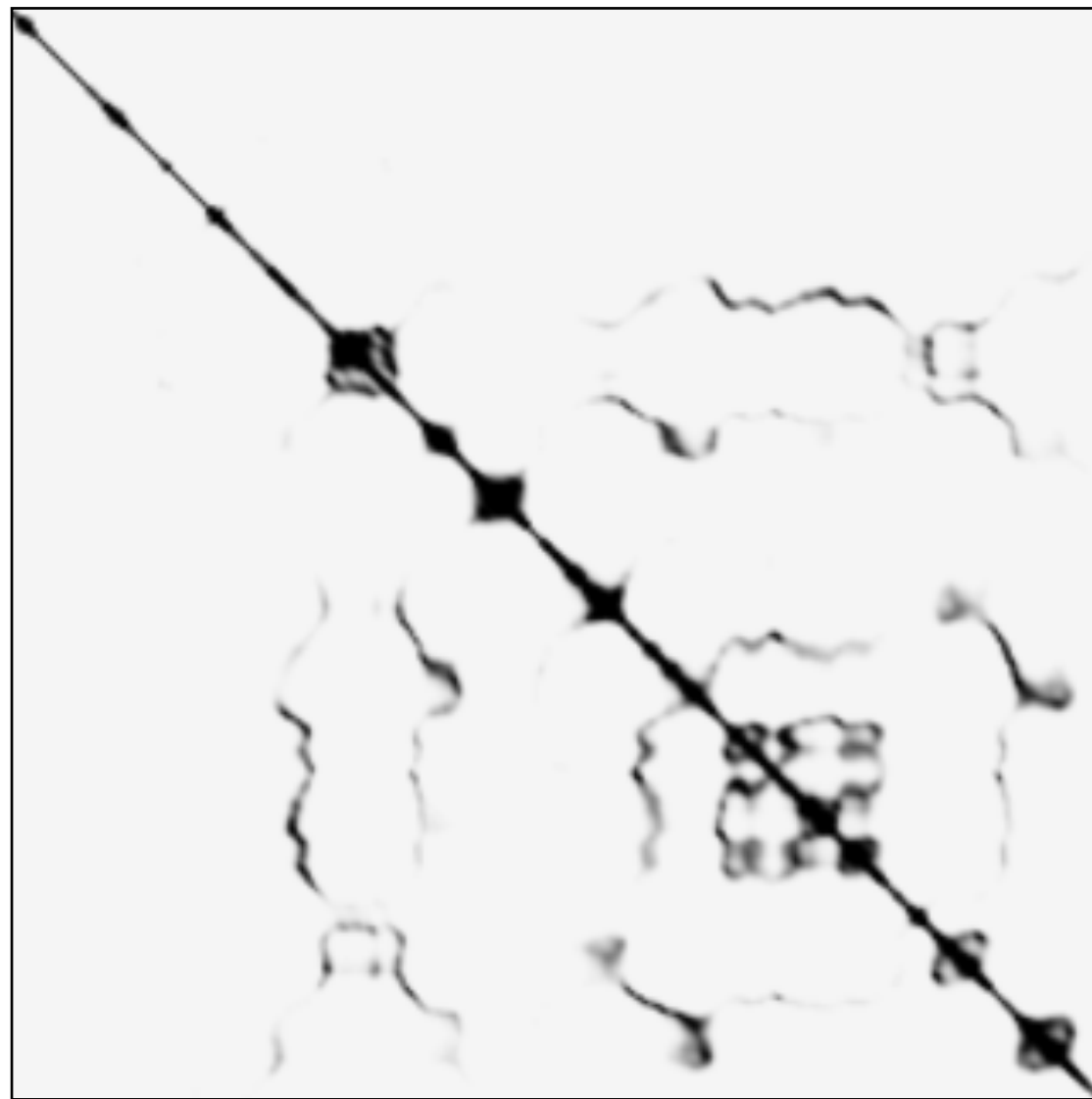
vs.  Frame  $i$



Black: Similar Frames  
White: Dissimilar Frames

# Finding Similar Frames

vs.  Frame  $i$



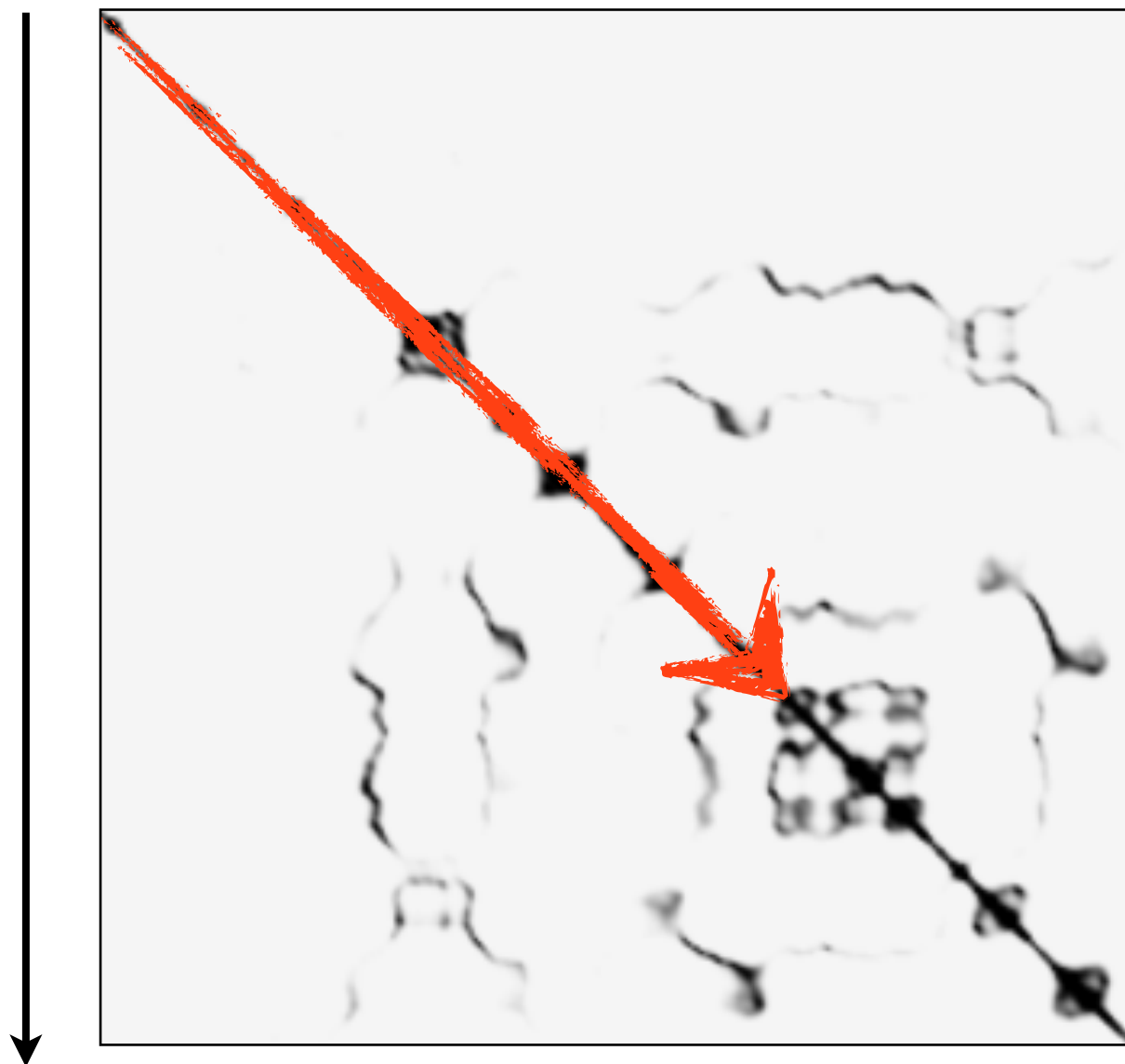
Black: Similar Frames  
White: Dissimilar Frames

- ★ Compute Euclidean Distance  $d_{ij}$  between all  $N$  Frames
- ★ Similar frames are the ones that would be best to Jump to

Frame  $j$

# Finding Similar Frames

vs.  $\longrightarrow$  Frame  $i$



Black: Similar Frames  
White: Dissimilar Frames

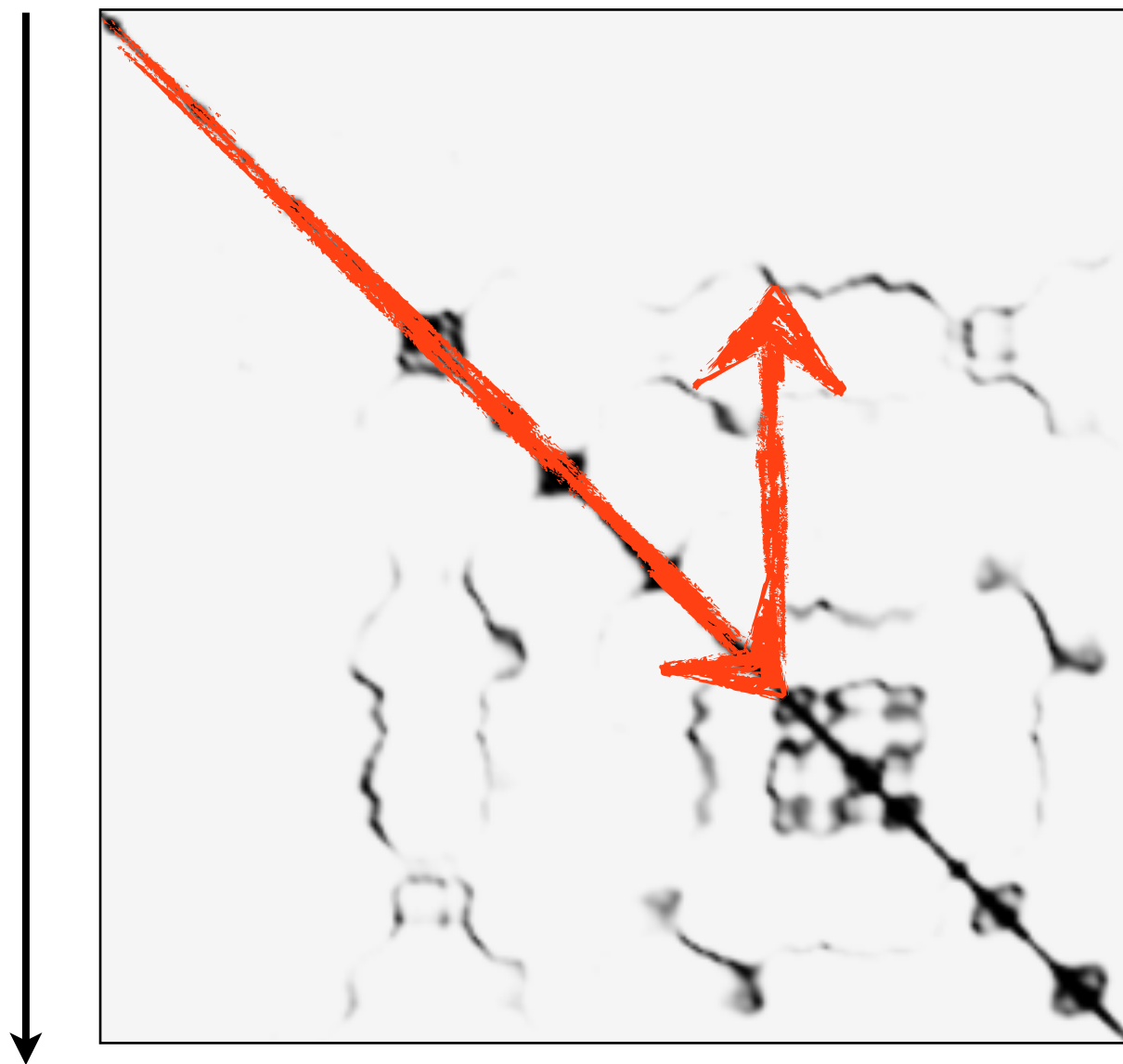
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vs.  $\longrightarrow$  Frame  $i$

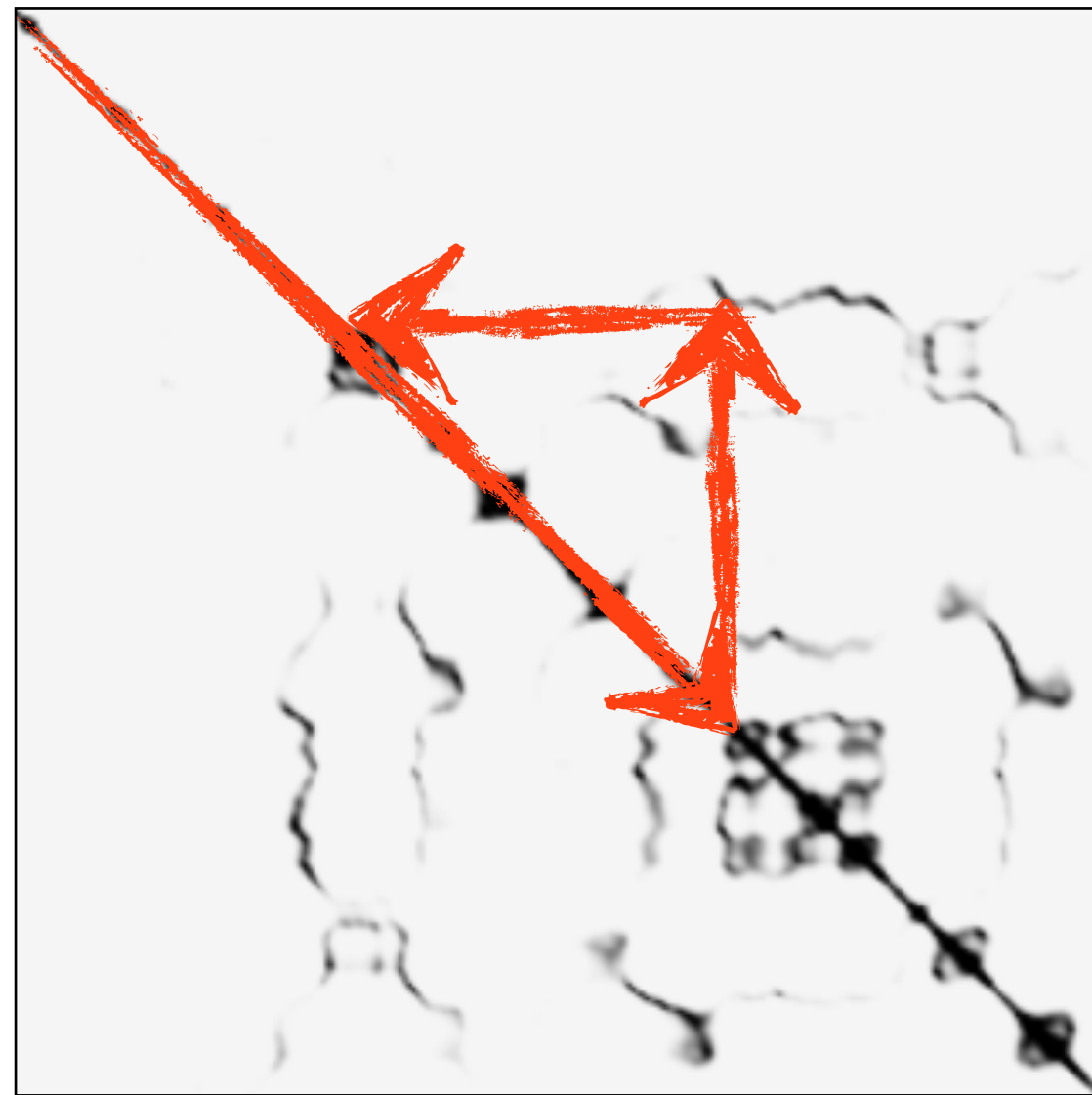


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# Infinitely long Video Texture



# Infinitely long Video Texture



# Summary

- ★ Introduced the concept of a Video Texture.
- ★ Discussed the two (2) methods used to compute similarity between frames.
- ★ Showcased the use of similar frames to generate Video Textures by finding similar points to transition to.



<https://commons.wikimedia.org>

# Further Information

- ★ Schödl, Szeliski, Salesin, and Essa (2000), "Video textures," in SIGGRAPH 2000 [Website].
- ★ Kwatra, Schödl, Essa, Turk, Bobick (2003), "Graphcut textures: image and video synthesis using graph cuts" in SIGGRAPH 2003, (DOI, PDF, Video, Website).



[commons.wikimedia.org/](https://commons.wikimedia.org/)

# Next Class

- ★ More on Video Textures:  
Types, Control, Blending, and  
Applications.



# Credits

- ★ For more information, see
  - Richard Szeliski (2010) Computer Vision: Algorithms and Applications, Springer.
- ★ Some videos retrieved from
  - YouTube Creative Commons.
  - From Professors Essa's Lab.
  - List will be available on website.



[www.flickr.com/photos/neneonline/231886965/](http://www.flickr.com/photos/neneonline/231886965/)





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