



# Recovery of Heavily Fragmented<sup>^</sup> JPEG Files

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<sup>^</sup> Files with  $\geq 3$  fragments

# Agenda



Motivation

Problem

Descriptions

Limitations of existing methods

Our improved solution

Experiments and

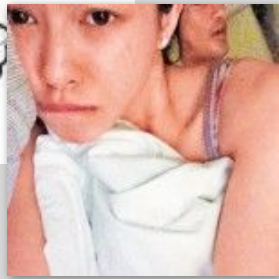
conclusions



More crime cases involve JPG files

## Motivation

e.g. A suspect forced a girl to take some dirty pictures



Later, he was caught, but before that, he deleted the evidence (jpg file) already!

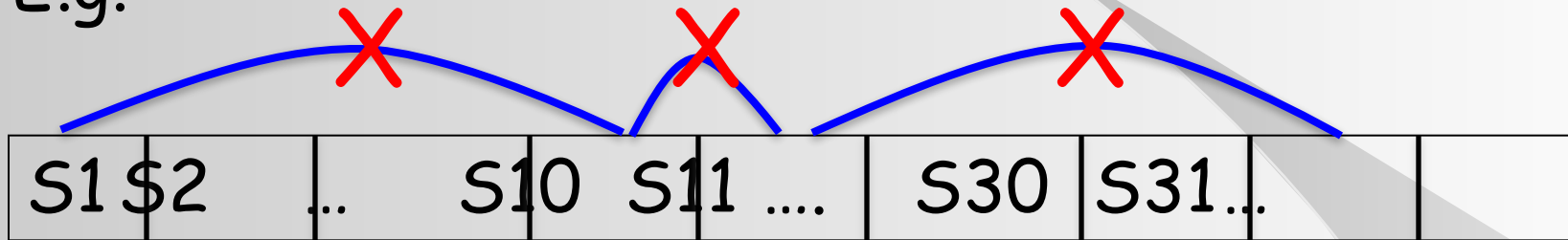
**Q: How we can reconstruct the file from the deleted fragments from the storage media?**

[Remark: of course, there are other applications]

# Background

The same file may be put in the hard disk in parts (it happens for large files)

E.g.

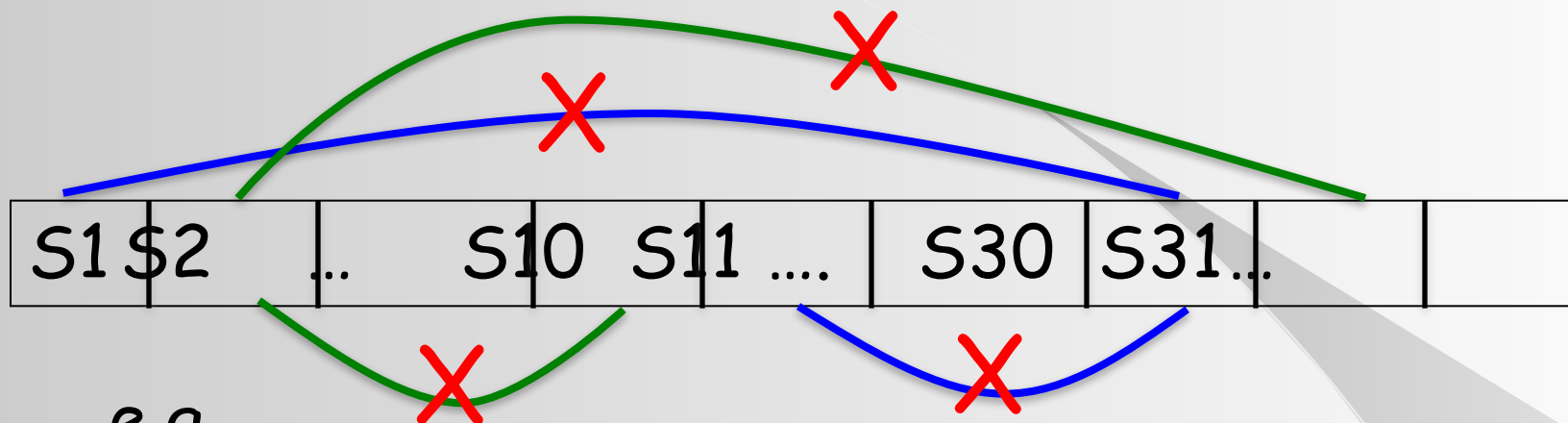


- Hard disk is divided into sectors (e.g. 1024 bit each)
- Where a file is stored is marked in a directory  
e.g. File 1: S1 -> S10 -> S11 -> S31

However, once a file is deleted, **this chain information is deleted from the directory!!**

=> Given one sector, not easy to tell what file it was belonging to.

Note that the sectors belonging to the same file may not be consecutive in the hard disk



e.g.

File 1: S1 -> S30 -> S11

File 2: S31 -> S2 -> S10

Think about it: if all these linkages are lost, can you still reconstruct the files?

I.e. Given S1, S2, S10, S11, S30, S31 and no other information, what we can do?

Another workflow for undeleted files/directory info still exists



Suspect's hard disk/storage media

Isolate sectors that belong to "deleted files"

There are existing tools (e.g. Oscar) doing this

Classify each sector into different file types

Word

Text

jpg

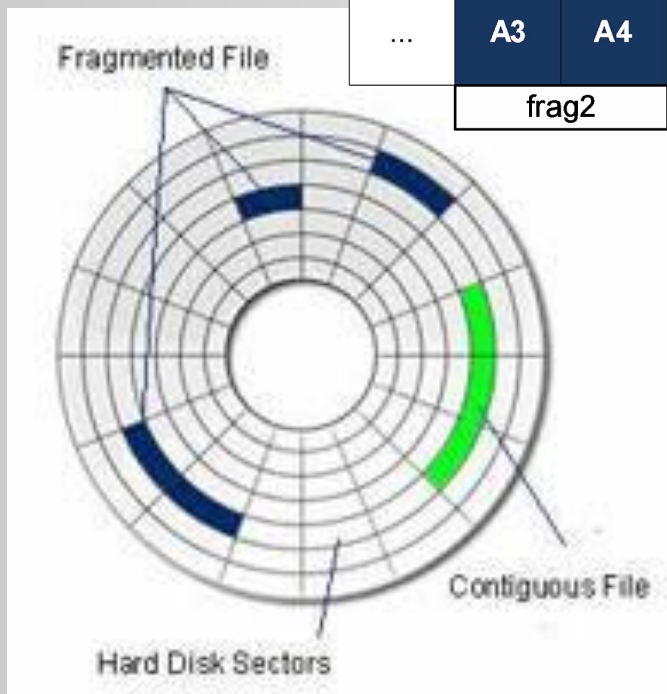
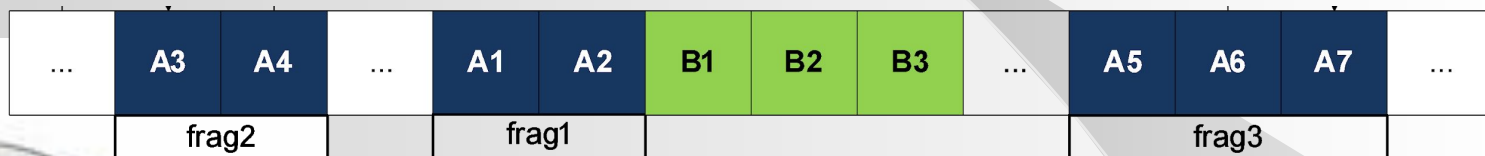
ppt

Note: sectors of same type may belong to multiple files

File carving / reconstruction

# Problem

Assuming that we identified some sectors from the harddisk that belong to jpg files (**but the ordering is unknown**),



Can we reconstruct (**reorder the sectors**) the jpg picture?

In this work, we assume: (1) all sectors still exist (not overwritten yet)\*; (2) the directory info is gone.

\* Header of a file can be found easily



# Limitations of existing methods

A naive solution: brute-force approach

- Checking all permutations of the sectors
- Look at each permuted file

N sectors (N can be thousands)  $\Rightarrow$   $N!$  cases to consider: **Too slow and not practical**

One of the best existing solutions: Adroit Photo Forensics (APF) 2013



How it works?

<http://digital-assembly.com/products/adroit-photo-forensics/downloads/>

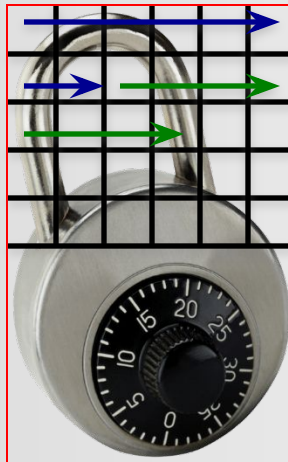


# Background

- jpg file is a compressed file
- The decompression starts from the 1<sup>st</sup> sector up to the end
- Each sector is decoding consecutive pixels

1<sup>st</sup> sector

2<sup>nd</sup> sector



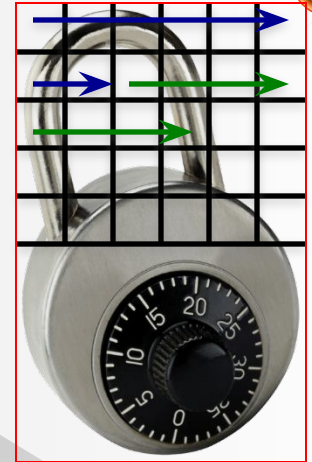
**\*\* Consecutive sectors should have pixels that are adjacent to each other!! \*\***

1<sup>st</sup> sector

2<sup>nd</sup> sector

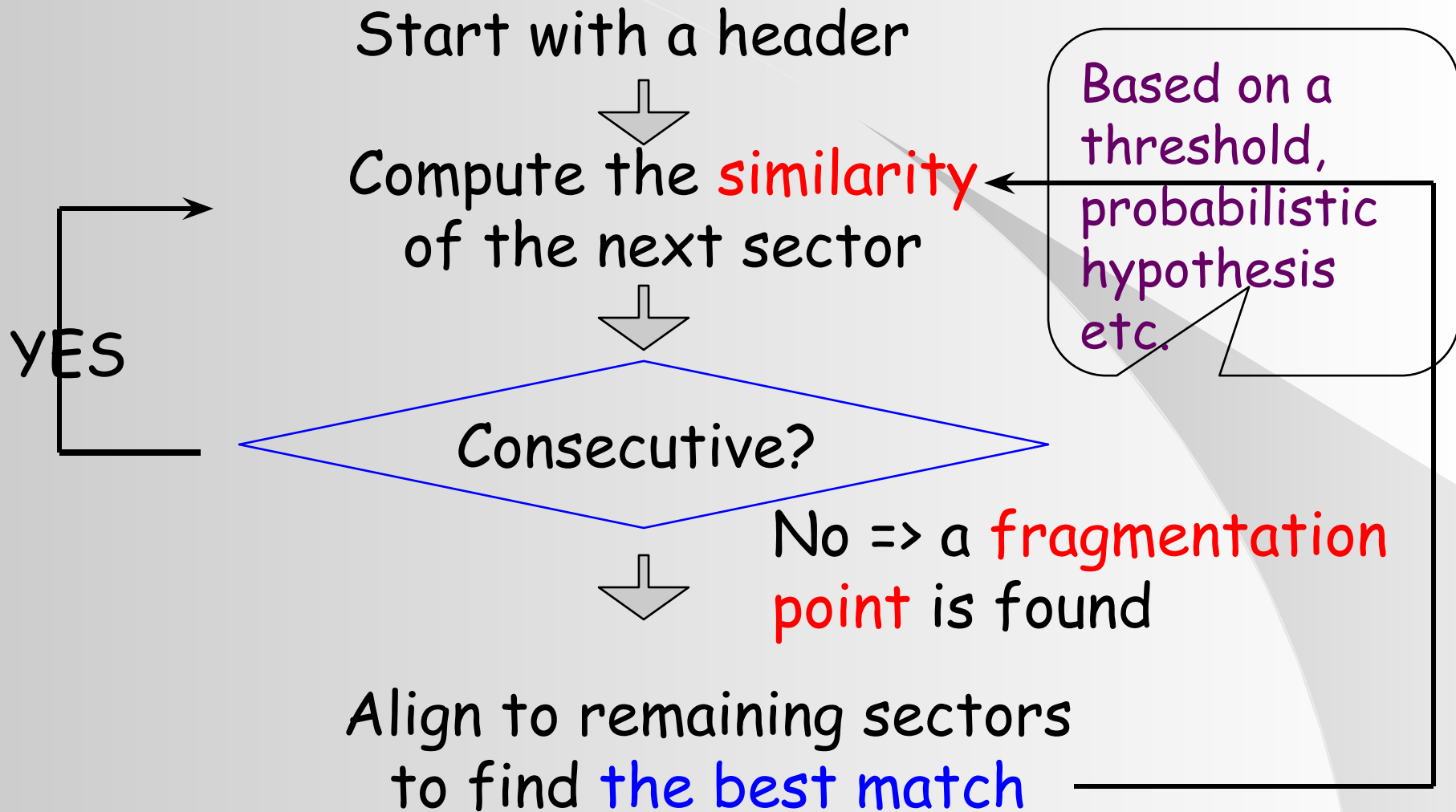
### Key observation:

It two sectors are consecutive, the pixels along the connecting boundary are similar in values (color etc).

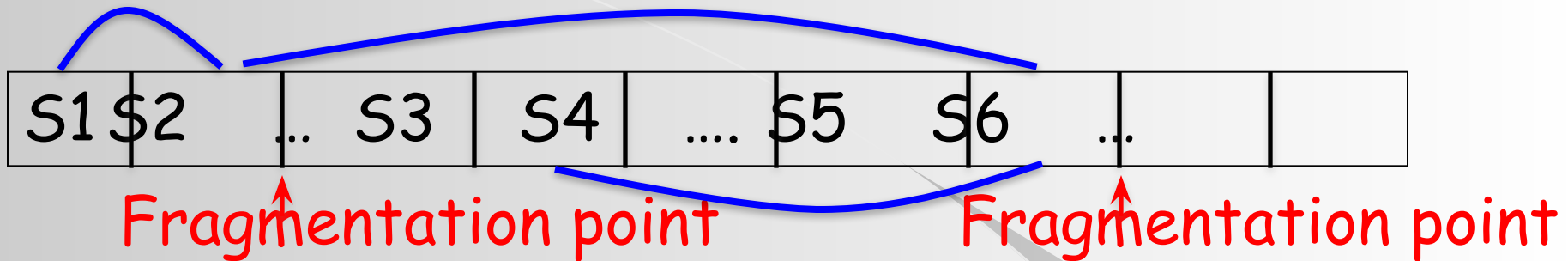


### High level idea:

- (1) Come up with a similarity measure to determine if two sectors are consecutive or not.
- (2) Start from the header (easy to find by a signature string pattern), then use a heuristics to identify the next sector among the remaining sectors



An example: assuming S1 is the header:



(1) Decompress S1, then S2, check the similarity between S1 and S2: Assume  $>$  threshold, then connect S1, S2.

(2) Since the next one is not consecutive, we found a fragmentation point. Now, try to decompress S3, S4, S5, S6, compute similarity between (S2, S3) (S2, S4) (S2, S5) (S2, S6). Pick the highest score (say (S2, S5)), then connect them.

(3) Check similarity between S5 and S6, but assume it is smaller than the threshold  $\Rightarrow$  fragmentation point. Try to decompress S3, S4, compute similarity (S5, S3), (S5, S4), say (S5, S3) is higher, connect them etc.....

We found that their heuristics does not perform well if the no. of fragments is more ( $> 3$ )

**Original JPEG**

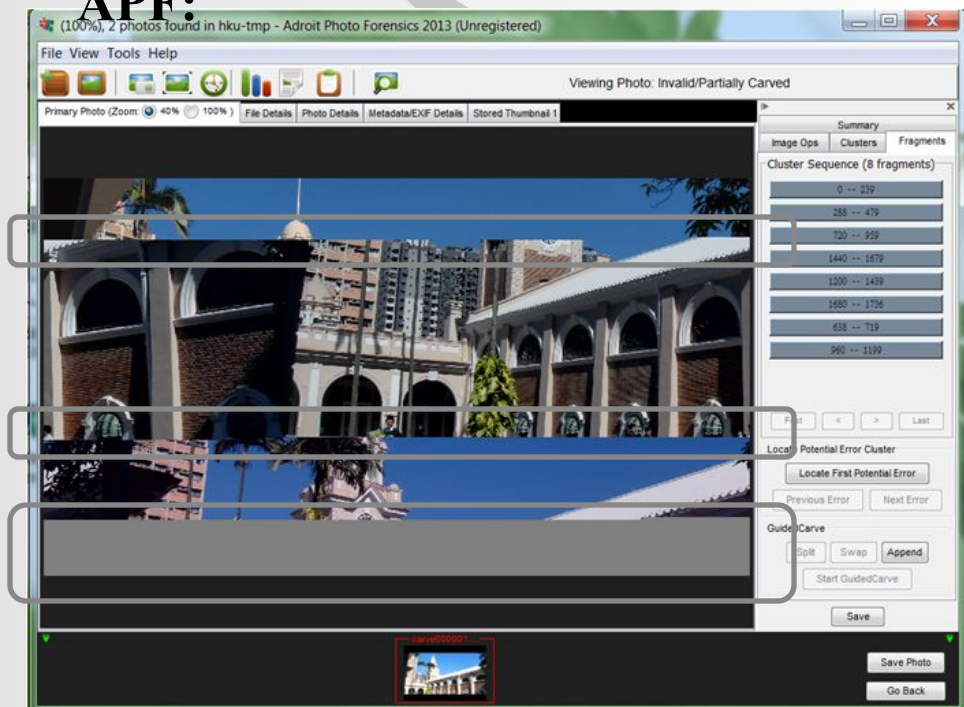
**file:**



**Input:**  
**8 fragments with random order**



**Recovered Result by  
APF:**



# Highlight of their Limitations

## (1) Not so-good similarity measure

	0-255	R 0
R	0.00	
G	0.00	
B	0.00	
	0-255	R 1
R	30.00	
G	30.00	
B	30.00	
	0-255	R 2
R	0.00	
G	0.00	
B	90.00	

SoD (Sum of Difference)

$$S = \sum_{i=1}^n |x_i - y_i|$$

$$\text{SoD}_{R0R1} = |30| + |30| + |30| = 90$$

$$\text{SoD}_{R0R2} = |0| + |0| + |90| = 90$$

RGB values:

R0 (0,0,0); R1 (30,30,30); R2(0,0,90)

Note: it is quite obvious that R0 is more similar to R1, then R2, but SoD cannot distinguish them!!



Another commonly used measure:  
**Euclidean Distance (ED)**

$$ED = 1/n \sqrt{(x_i - y_i)^2}$$

We will also show that this measure is not always good.

## (2) Fragmentation point detection problem

Using the best match candidate may not always give the correct answer.

Note: we are not saying that both ED and SoD are always bad measures.



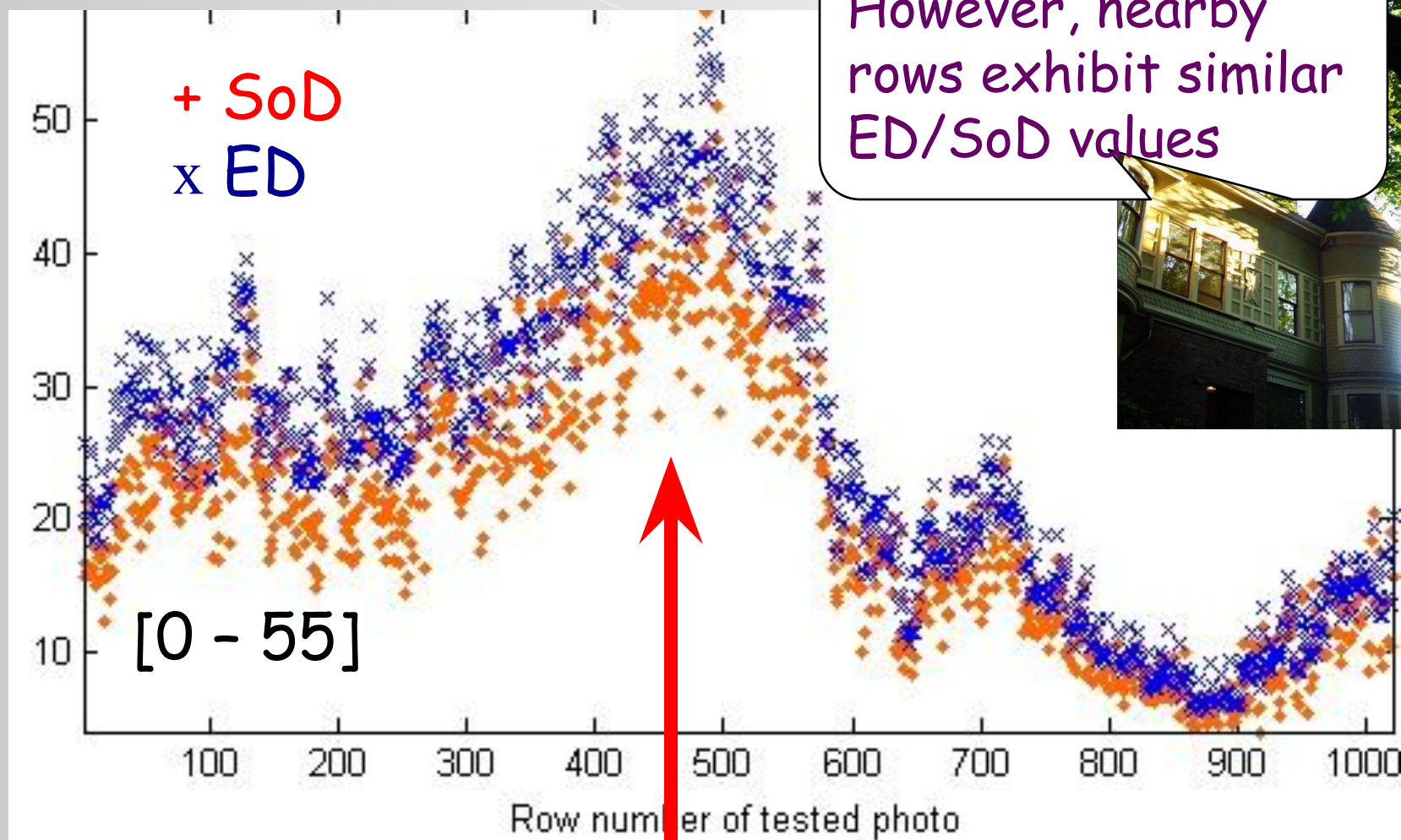
# ♪ Our improved solution

Both SoD and ED focus on the **absolute differences** between the boundary pixels.

For regions with varying colors such as tree leaves, it may be **falsely identified** as fragmentation points



Contribution 1: We propose a variation of measure to tackle this issue.

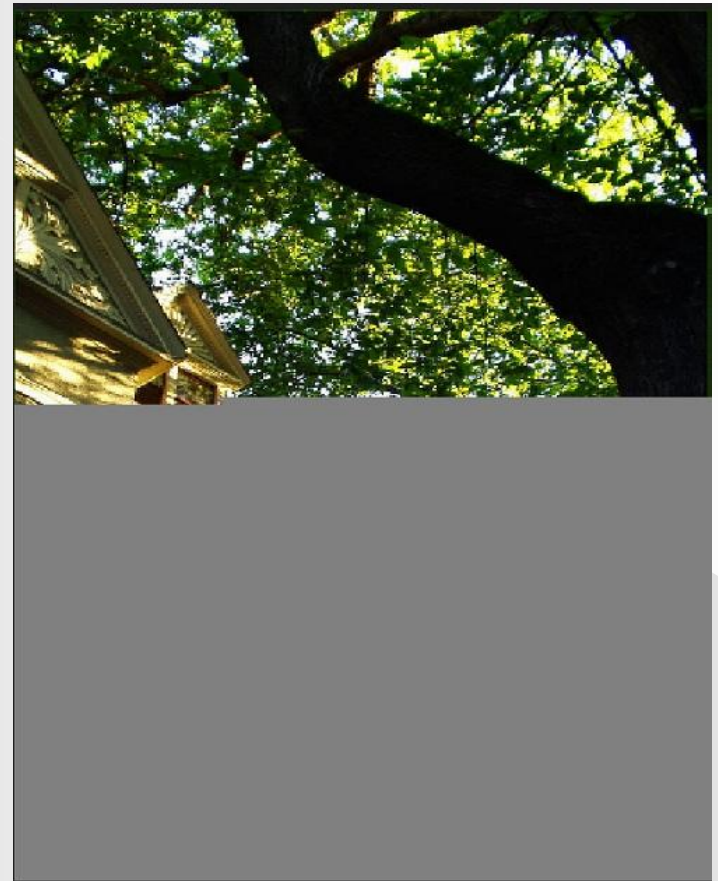
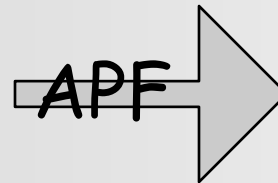


However, nearby rows exhibit similar ED/SoD values



If fragmentation occurs here, likely not able to connect the sectors!

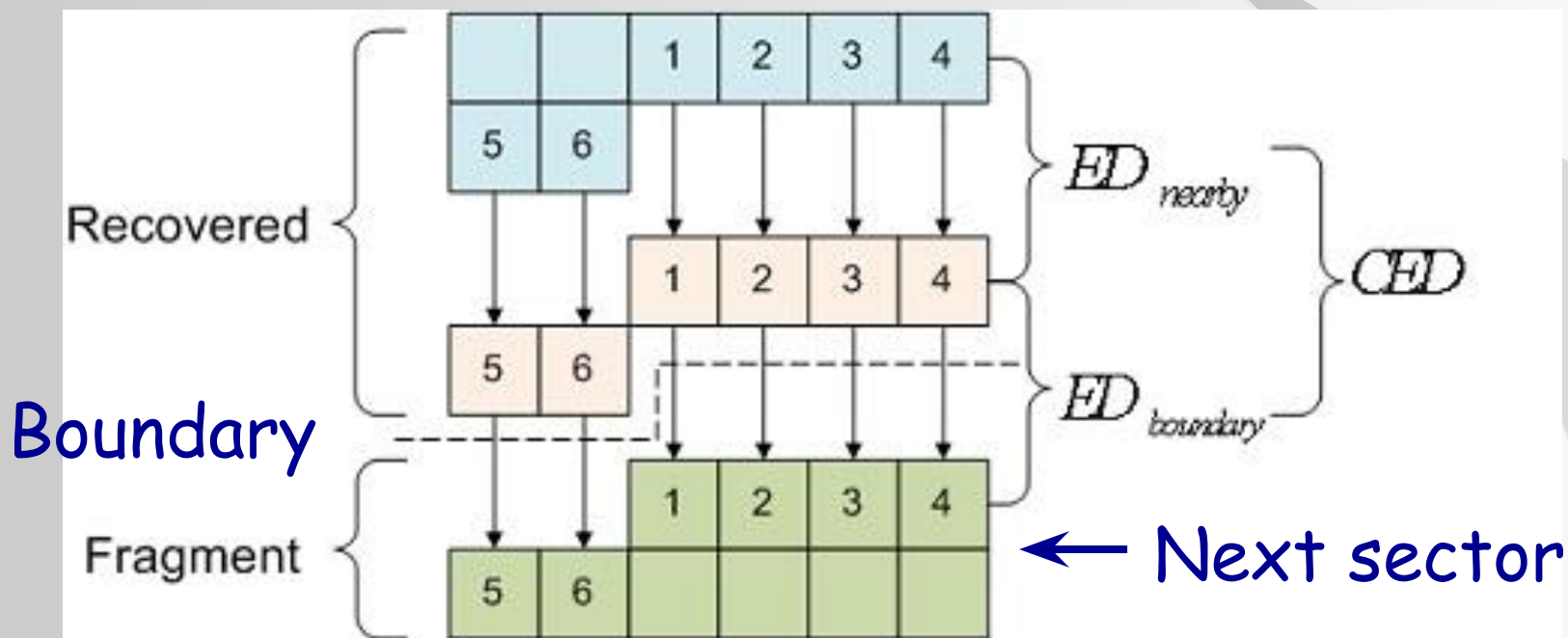


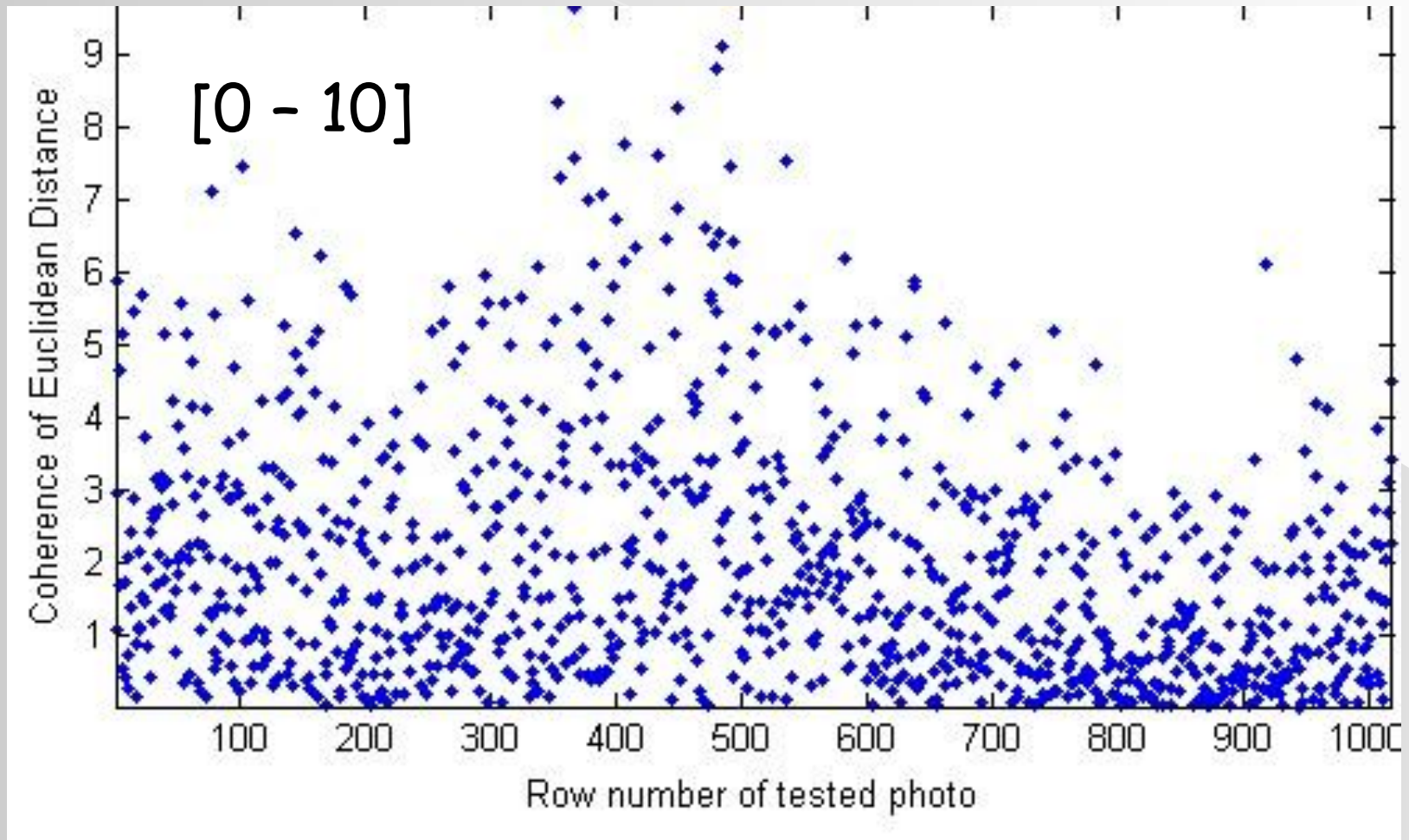


Cut this into 4 fragments

# Coherence of Euclidean Distance (CED)

$$CED = |ED_{\text{boundary}} - ED_{\text{nearby}}|$$





[Contribution 2: We also extend their candidate finding heuristics]

Instead of finding the "next" best candidate only, we keep  $m$  best next candidate, for each of these  $m$  candidate, we locate the next one, then use this look ahead step to re-confirm which of these  $m$  is the correct one.



A rough example: assuming S1 is the header:



Fragmentation point

- (1) Decompress S1, then S2, check the similarity (**we use CED**) between S1 and S2: Assume  $>$  threshold, connect S1, S2.
- (2) Then, we found a fragmentation point. Now, try to decompress S3, S4, S5, S6, compute similarity between (S2, S3) (S2, S4) (S2, S5) (S2, S6). Pick the highest score (say (S2, S5), **we do not connect them yet, but consider highest m scores. Say  $m = 2$  (may be S5, S3)**
- (3) Consider the next sector of S5 and S3, say (S2, S5, S6) vs (S2, S3, S4): **the overall score of (S2, S3, S4) is higher, then connect S2 with S3.**





# Experiments

## (1) CED vs SoD and ED

- Images are downloaded/taken from digital camera.
- CED, SoD, ED were used to connect adjacent rows.
- A false match (FM) = if two adjacent rows do not have the highest similarity measure.

100 (3648x2048) images

	CED	ED	SoD
# FM	1,829	115,142	128,805
FM rate	0.89%	56.22%	62.89%
# files w FM	59	100	100

## (2) Carving performance

187 (87 sequential + 100 fragmented) pictures were randomly generated by digital camera

	# of files		Ours	APF
Sequential	87	87	87	
2 fragments	79	78	65	
3 fragments	18	17	11	
4 fragments	2	1	2	
6 fragments	1	1	0	

For fragmented files, our method recover 97 files while APF can recover 78 files.

We analyzed three failure cases: 2 is due to a small fragment (not large enough for CED), 1 due to the dramatic change in color in picture.



## Conclusions

- \* We proposed a new jpg file carving algorithm
- \* The key ideas include a new similarity measure (CED) and top m best matches for fragmentation point matching.
- \* The performance of our method is shown to be better than APF in our experiments

## \* Unsolved problems

(a) 1000 low resolution (1024x768) images

	CED	ED	SoD
# FM	132,529	381,112	491,775
FM rate	17.26%	49.62%	64.03%
# files w FM	954	1000	1000

(b) Still cannot handle some "difficult" cases such as the ones with very varying colors/very similar colors

(c) How about some sectors overwritten....  
[From the forensic point of view, we may need to get the whole picture, as long as the part of pictures can show evidence for the crime.]

(d) How about voice/videos (e.g. CCTV)...

< Thank you >