

# AUTOMATIC COMPARISON OF PHOTO RESPONSE NON UNIFORMITY (PRNU) ON YOUTUBE

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# INTRODUCTION

## PRNU as camera signature

- PRNU Patterns can be extracted using filters
- PRNU pattern unique for each camera
- Result from sensor manufacturing imperfections



Figure: PRNU pattern

# INTRODUCTION

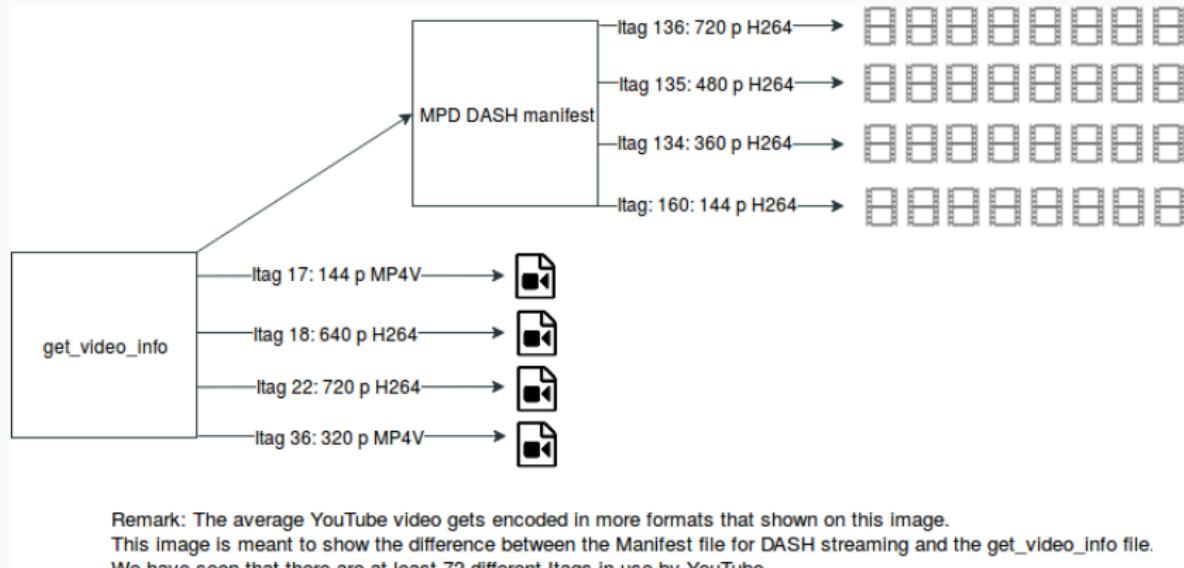
## Research questions

- To which extent is it still possible to match camera signature of videos uploaded to YouTube?
- What are the methods and formats that give the optimal performance and most accurate results?
- How feasible is it to automate and scale the process of extracting the PRNU?

# INTRODUCTION

## YouTube Streaming

- Streaming vs. Downloading
- Video formats on YouTube



# PRNUCOMPARE SOFTWARE

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- Provided by the Netherlands Forensic Institute (NFI)
- Extracts PRNU from videos and images
- Compares between PRNU patterns
- Proprietary software, closed source

# PRNUCOMPARE SOFTWARE

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## Extraction methods

- 2nd order (FSTV) extraction filter
- 4th order extraction filter
- Wavelet Coiflet
- Wavelet Daubechies

## Correlation calculations

- Normalized cross correlation
- Peak to correlation energy

# EXPERIMENTS

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We have conducted the following three experiments:

- Testing different methods and formats.
- Testing the PRNU extraction with a large set of videos.
- Testing the distributed process.

# EXPERIMENT ENVIRONMENT

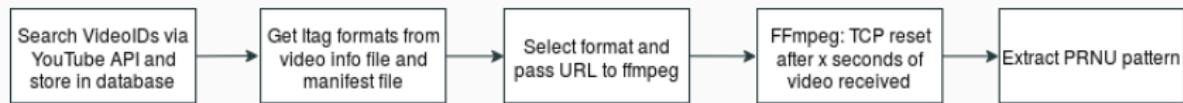


Figure: workflow on one machine

# EXPERIMENT ENVIRONMENT

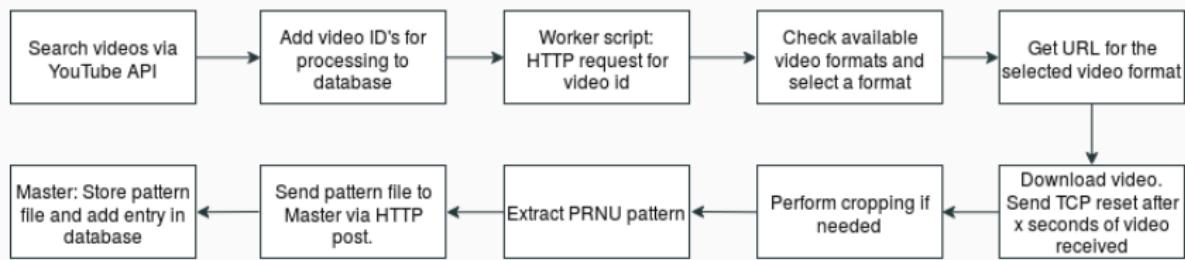


Figure: workflow required for distribution

# EXPERIMENT ENVIRONMENT

**PRNUTube**

[Home](#) - [Manual add](#) - [Show queue \(35\)](#) - [Processed \(964\)](#)

Search Term:  Max Results:  Show video formats available

thumbnail	title	video id	add to queue <input type="checkbox"/> Select all
	15 Hidden Secrets & Best Places in Amsterdam	Xnp2IkoOppY	PRNU extracted
	Amsterdam Travel Guide	kfe471jBCpA	PRNU extracted
	Amsterdam	cd8gLq6iZg4	PRNU extracted
	Riblja corba-Amsterdam	aYX1skG1juc	Item in queue

Figure: Search interface

# EXPERIMENT ENVIRONMENT

Mobile devices' cameras used in the experiments:

Camera	Model	Recorded resolution	Frame rate
1	Apple Iphone 5	1920 x 1080	30
2	Microsoft Lumia 950	1920 x 1080	25
3	Apple Iphone 5	1920 x 1080	30
4	Huawei Y530	1280 x 720	30
5	Samsung S5	1920 x 1080	30
6	Apple Iphone 6	1920 x 1080	30
7	Apple Iphone 6s	1920 x 1080	30
8	Apple Iphone 5s	1920 x 1080	30
9	Samsung GTI9301I	1920 x 1080	30
10	Samsung SM-G531F	1920 x 1080	30
11	Samsung Galaxy Note 2	1920 x 1080	30
12	Huawei P8 Lite	1920 x 1080	30

Table: Mobile devices and the corresponding cameras' specifications

# CONDUCTED EXPERIMENTS (1)

Experiment 1:

## Testing different methods and formats

The different methods and formats we have tested in this experiment are the following:

Format	Method
17 (Resolution: 176 x 144)	2nd Order
18 (Resolution: 640 x 360)	4th Order
22 (Resolution: 1280 x 720)	Wavelet Coiflet
36 (Resolution: 320 x 180)	Wavelet Daubechies

# CONDUCTED EXPERIMENTS (1)

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Testing different methods and formats

- Collecting videos (flatfield and natural videos).

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- Download natural videos in four different formats.

# CONDUCTED EXPERIMENTS (1)

## Testing different methods and formats

- Collecting videos (flatfield and natural videos).
- Upload natural videos to YouTube.(Uploading the flatfield videos appear to give less accurate results).
- Download natural videos in four different formats.
- Feed the downloaded videos to PRNUCompare software in four different methods (averaging 200 frames).

# CONDUCTED EXPERIMENTS (1)

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- Re-encode the flatfield videos in four different formats.(with least possible compression)

# CONDUCTED EXPERIMENTS (1)

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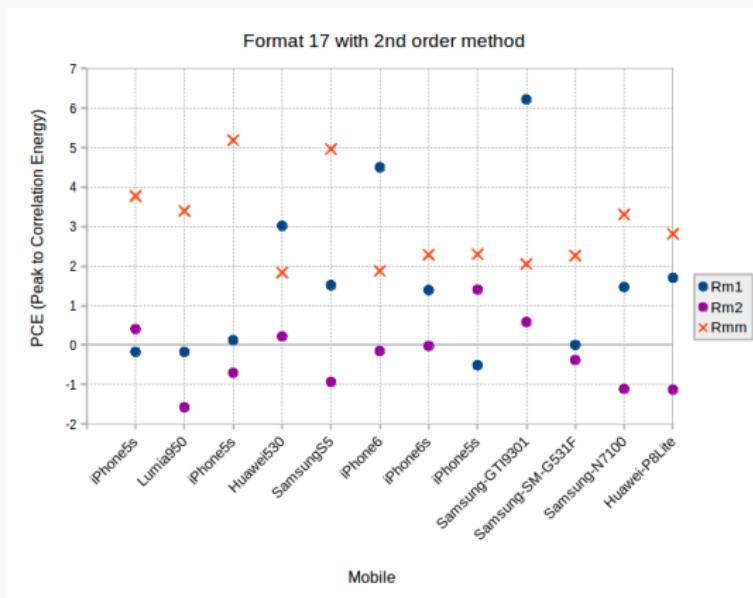
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- Upload natural videos to YouTube.(Uploading the flatfield videos appear to give less accurate results).
- Download natural videos in four different formats.
- Feed the downloaded videos to PRNUCompare software in four different methods (averaging 200 frames).
- Re-encode the flatfield videos in four different formats.(with least possible compression)
- Feed the re-encoded videos to PRNUCompare software in four different methods.

# RESULTS (1)

## Testing different methods and formats

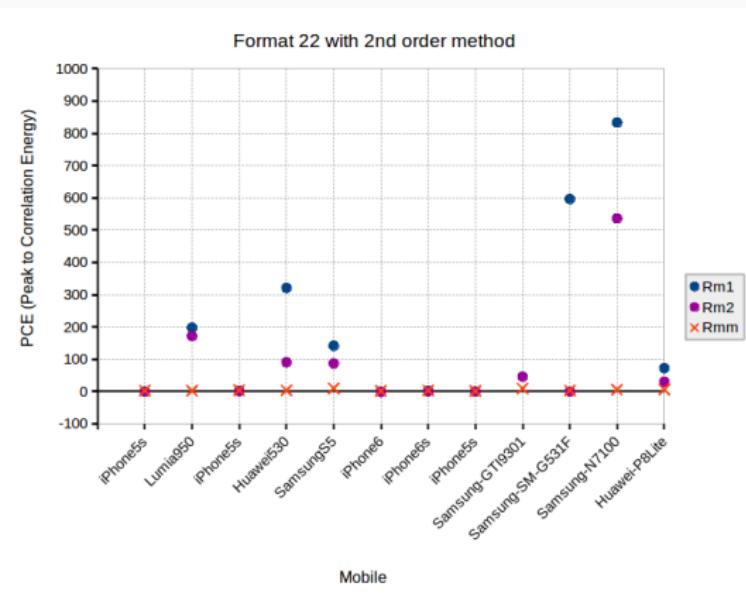
- Looking at the results from 12 mobiles' cameras in 4 different formats processed with 4 different methods.
- Low resolution videos gave much less accurate results.
- We excluded low resolution videos.



# RESULTS (1)

## Testing different methods and formats

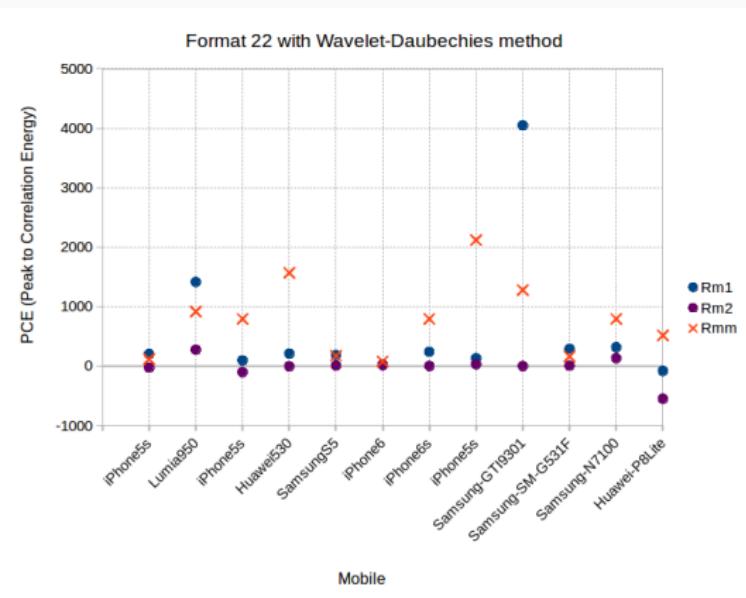
- 2nd Order method implemented in PRNUCompare software gave the most accurate results.
- Not all the tested cameras gave optimal results in our experiment settings. (i.e. iPhone mobiles' cameras)



# RESULTS (1)

## Testing different methods and formats

- 4th Order method gave results that are close to the 2nd order method results yet less accurate.
- Both Wavelet Daubechies and Wavelet Coiflet which are implemented in the software gave wrong results in our test settings.



# SUMMARY

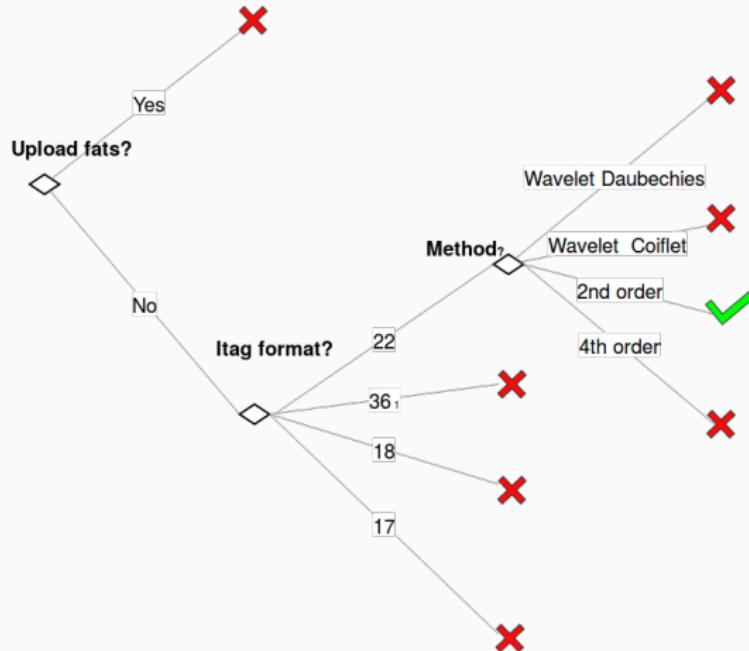


Figure: Flow

## CONDUCTED EXPERIMENTS (2)

Experiment 2:

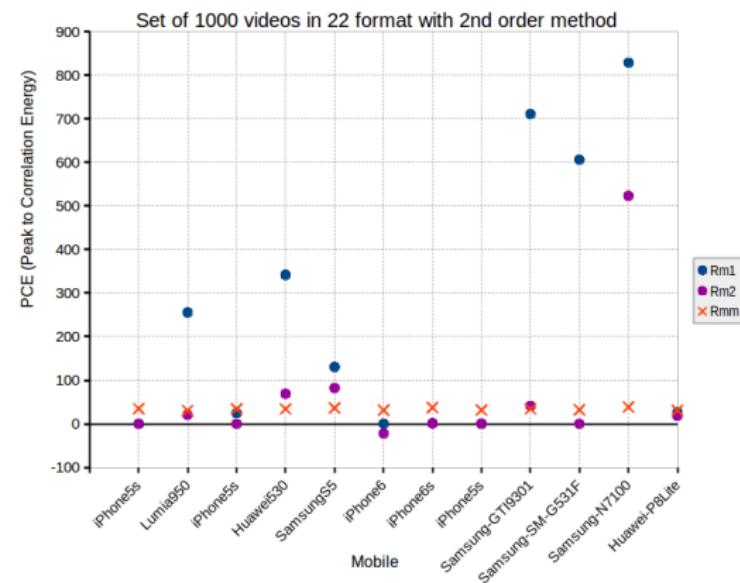
### Testing PRNU extraction with a large set of videos

- Add 1000 YouTube videos to the software queue(including videos used in the experiment).
- Run software.
- Compare a flatfield video with the set.

# RESULTS (2)

## Testing the automated process

- For some cameras it is still possible to match the PRNU of a camera when comparing with a set of 1000 videos.
- Some cameras gave different results than the first experiment when comparing with a set of 1000 videos.



# CONDUCTED EXPERIMENTS (3)

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Experiment 3:

## Testing the distribution process

- Set up the software on 2 machines.
- Add 1000 YouTube videos to the queue.
- Both servers have: Intel(R) Xeon(R) CPU E3-1240L v5 @ 2.10GHz
- Run software.

# RESULTS (3)

## Testing the automated process

We have conducted the second and the third experiments **three times on the same set of videos** and averaged the results:

Measure (Avg.)	1 server	2 servers <sup>1</sup>
Successfully processed videos	974.3	971
Time (minutes)	203.2	97
Avg. Videos/hour	288	601

4.16 GB of data transferred from YouTube

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<sup>1</sup>In the presentation as presented on 6 feb 2017 the results for the two server setup were different with a lower success rate. We re-ran the tests for the two server setup again after the presentation.

# CONCLUSION

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- Higher resolution gives more correct results.
- 2nd order method which is implemented in PRNUCompare software is the method that is giving more accurate results in our setting.
- Extracting PRNU from YouTube is possible but not for all cameras (ie. iPhone Mobile cameras, in our test)
- Depending on the camera and the video, videos from a large set of YouTube videos can be matched to the correct PRNU pattern.
- Distribution implemented in the experiment achieves high speed gain.

QUESTIONS?