

CS4243 TEAM JARD

Separation of Foreground &
Background of Surveillance Video

Ng Li Ying

U087326Y

Jessica Low

U087088E

Zhao Danni

U087070R

Sun Ailin

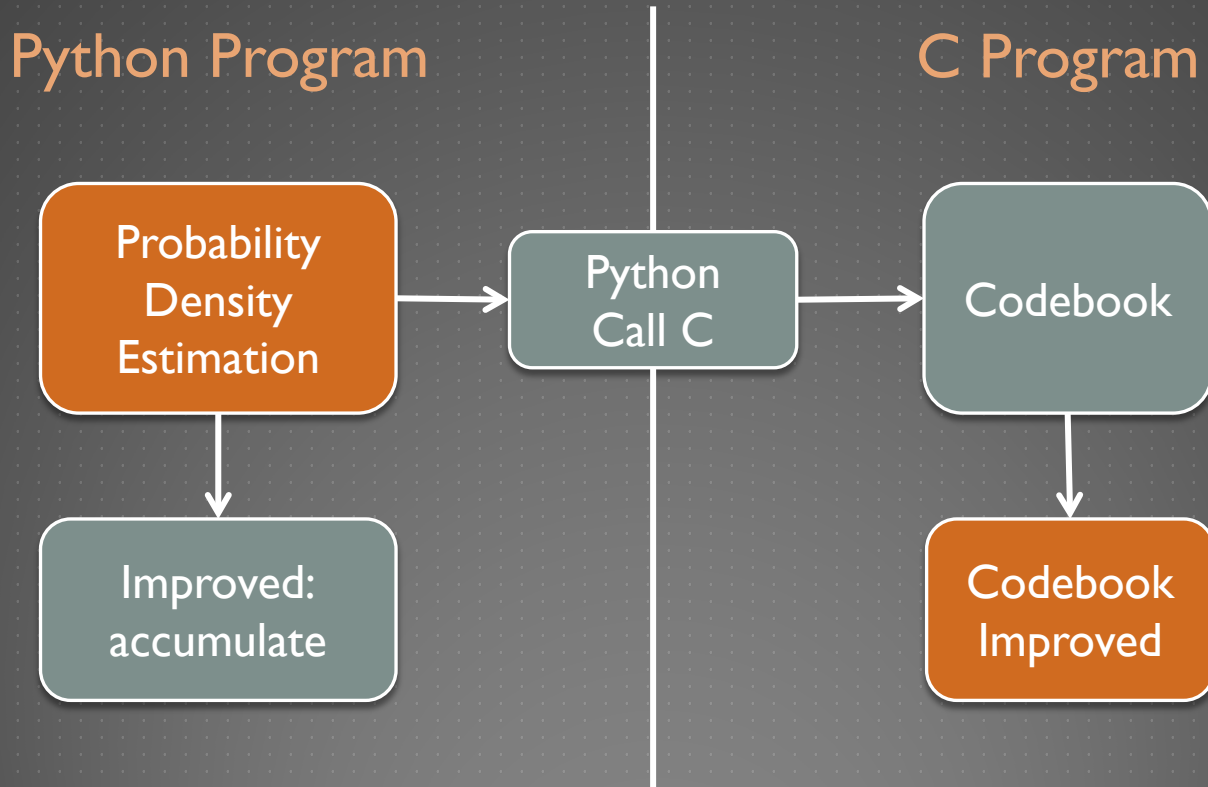
U097051J



Project Objectives

1. To separate a moving foreground from the static background
2. Ultimate difficulty – Real time mode, long duration

Methods overview



Method 1: Python

1. Average mean and covariance of each pixel

n – dimensional Gaussian

$$G(x) = \frac{1}{\sqrt{(2\pi)^n |\Sigma|}} \exp\left(-\frac{1}{2}(x - \mu)^T \Sigma^{-1} (x - \mu)\right)$$

2. Probability Density Estimation



Method 1: Python

Issues

1. Long processing time
2. Ghosting effect on background
3. Offline mode



Method 2: Python Improved

1. Update the mean and covariance matrix
2. Make it faster
3. Condition to stop finding the clean plate



Method 2: Python

I. Update the mean and covariance matrix

Cumulative calculation:

$$(1) \quad \mu_n = E(X)$$

$$(2) \quad \Sigma_n = E[(X - E[X])(X - E[X])^T]$$

$$(3) \quad \mu_{n+1} = f(\mu_n) = \frac{1}{N+1} (\mu_n * N + x_{n+1})$$

$$(4) \quad \Sigma_n = E(XX^T) - \mu_n \mu_n^T$$

$$(5) \quad \Sigma_{n+1} = \frac{1}{N+1} ((\Sigma_n + \mu_n \mu_n^T) * N + x_{n+1} x_{n+1}^T) - \mu_{n+1} \mu_{n+1}^T$$

Method 2: Python

2. Make it faster

Drop frames to make it online



1 second

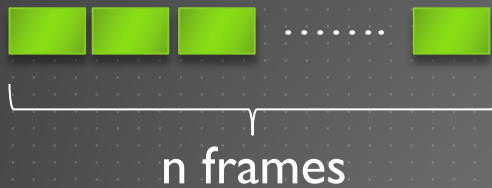
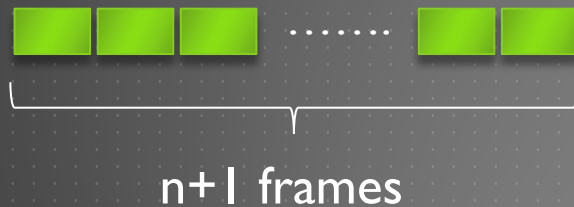


Processed: 5 frames

Method 2: Python

3. Condition to stop finding the clean plate

Is mean stable?

 μ_n  μ_{n+1}

$$\frac{|\mu_{n+1} - \mu_n|}{\mu_n} < 0.005\%$$

Method 2: Python

Result



Method 3: Codebook in C

Why Codebook?

- Allows for lighting changes
- Real time mode

Why YUV?

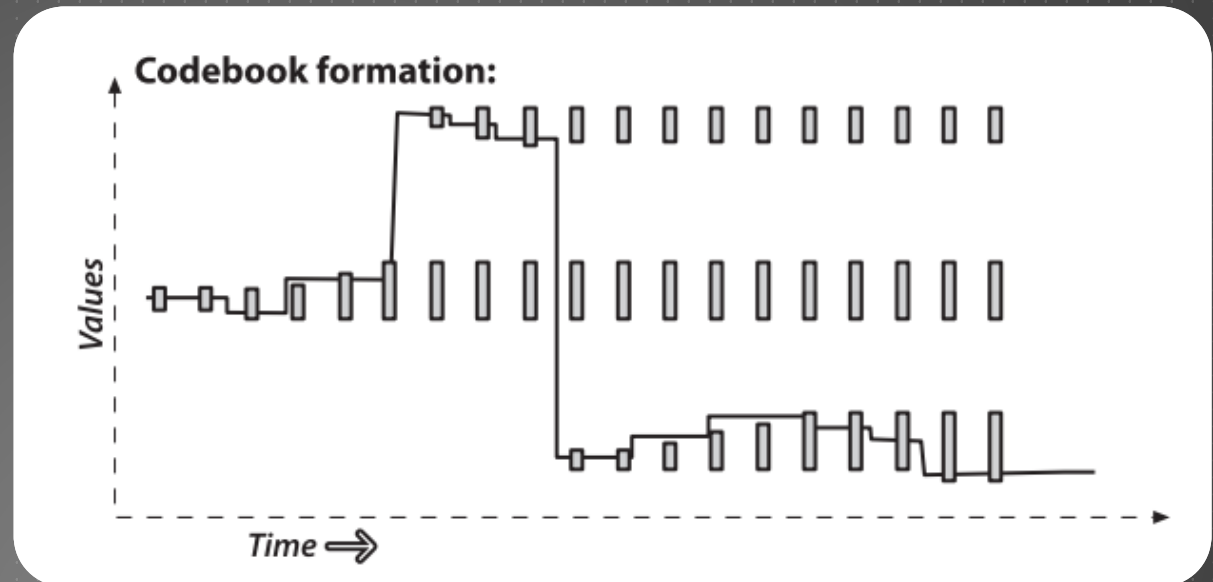
- Variation in background along brightness axis
- YUV is a color space whose axis is aligned with brightness



Method 3: Codebook in C

How does Codebook work?

1. Update codebook
2. Clear stale pixels
3. Segment based on learned codebook



Method 3: Codebook in C

Result

Input Video



Foreground



Method 4: Improved Codebook

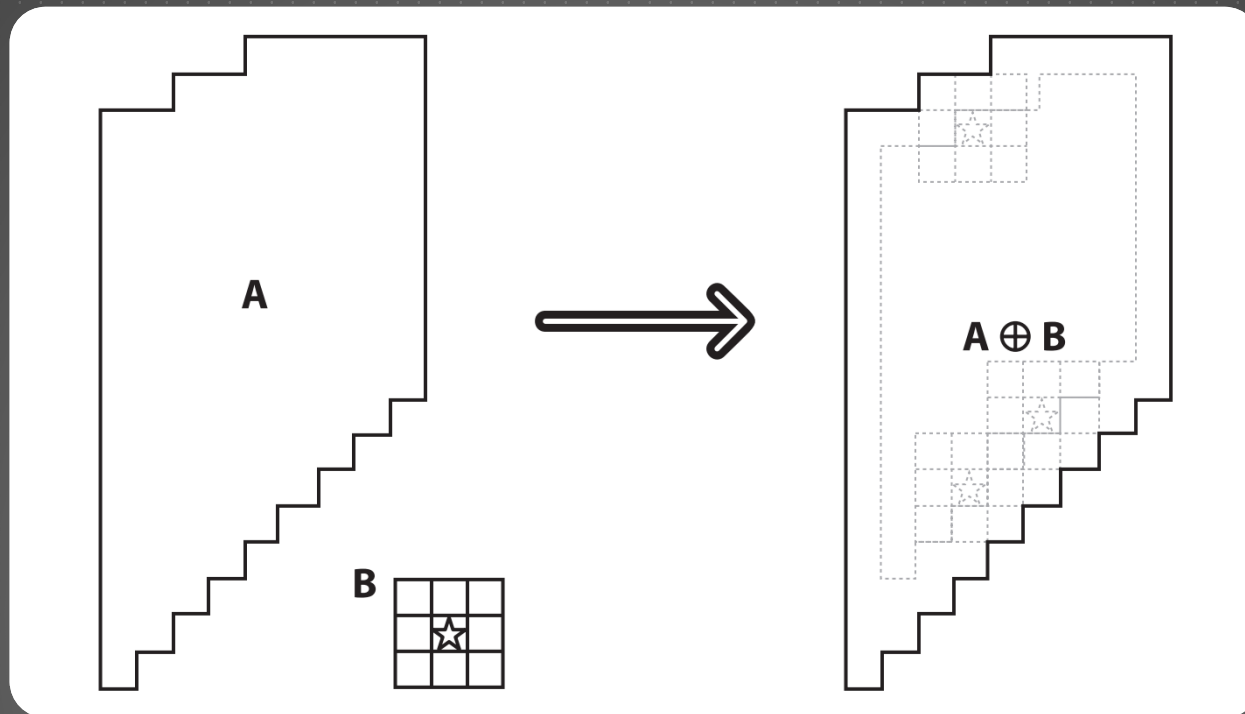
Curing of false negatives

1. Gaussian filtering
2. Differencing
3. Dilate & Erode
4. Threshold



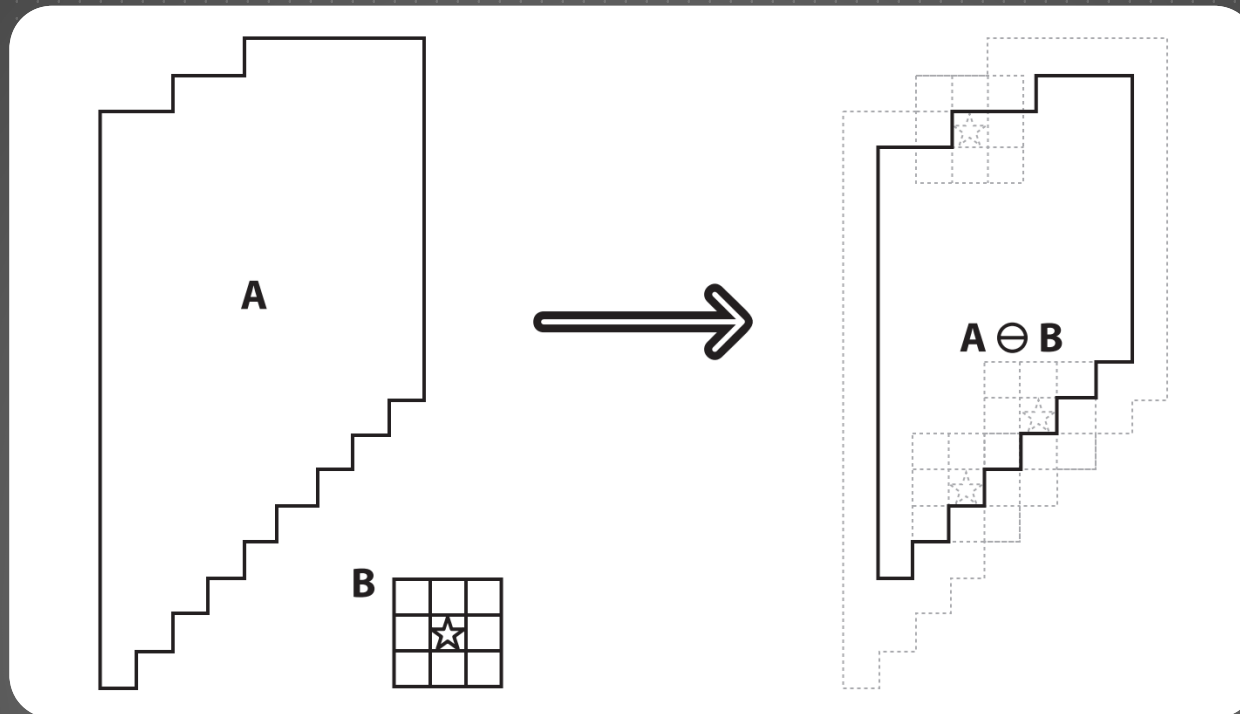
Method 4: Improved Codebook

Dilate



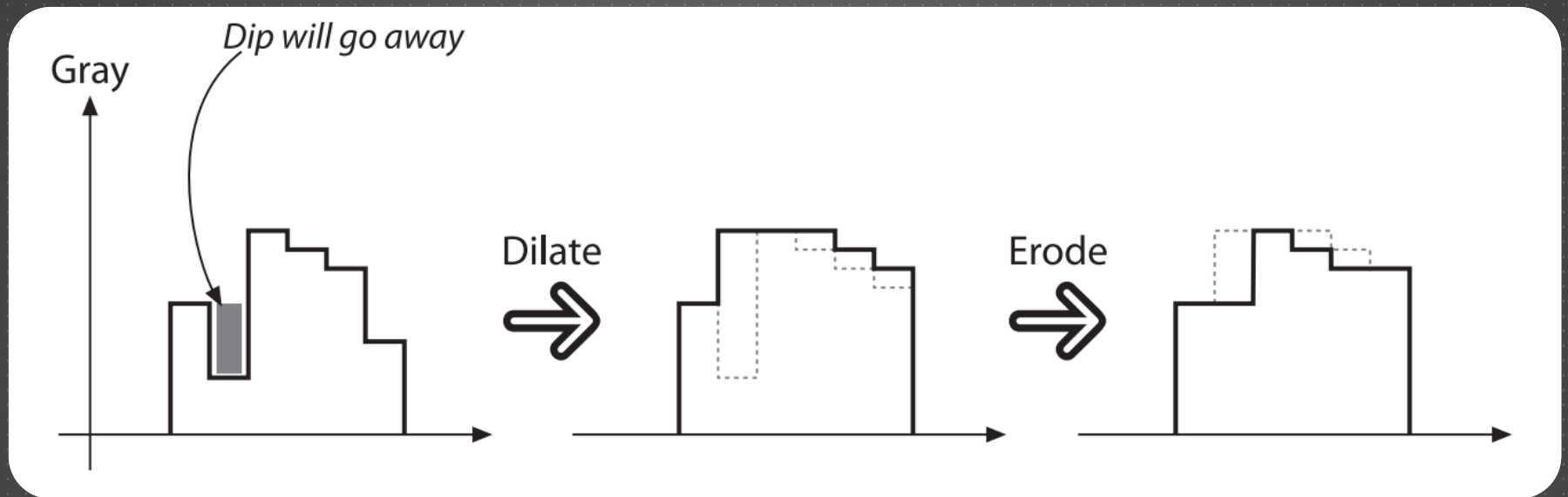
Method 4: Improved Codebook

Erode



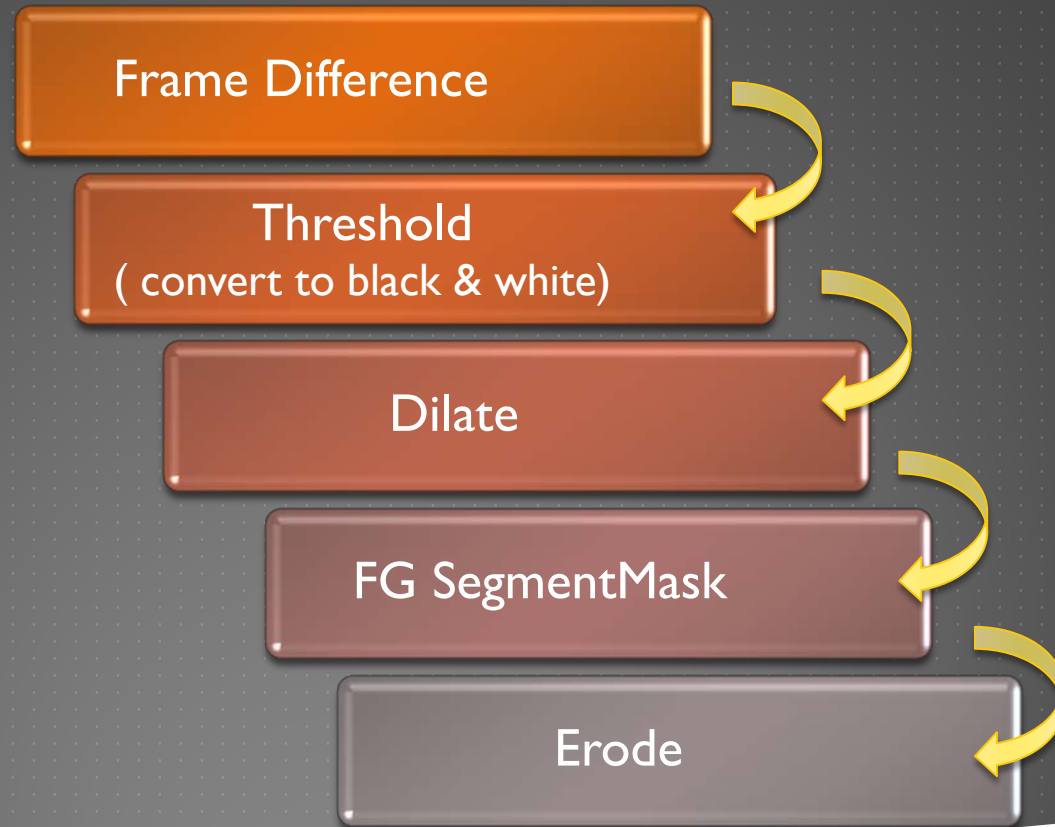
Method 4: Improved Codebook

Dilate & Erode



Method 4: Improved Codebook

Summary



Method 4: Improved Codebook

Result



Input Video



Background



Foreground

Conclusion

	Methods	Problems faced
1	Mean & covariance Probability Density estimation	Slow & ghosting & small
2	Above with stop condition & improved speed	Still quite slow & ghosting & small
3	Codebook	Windscreens with holes
4	Codebook improved	Thresholds for different situation Trade off : Front cars are accurately located but cars far away are treated as a cluster

Videos Samples



Reference

1. http://en.wikipedia.org/wiki/Covariance_matrix
2. Bradski and Kaehler, Learning OpenCV: Computer Vision with the OpenCV Library, O'Reilly, 2008.