

# Moving object detection

# Background Subtraction

- The process of separating out foreground objects from the background in a sequence of video frames.
- Background subtraction is widely used for detecting moving objects from static camera

# Intuition

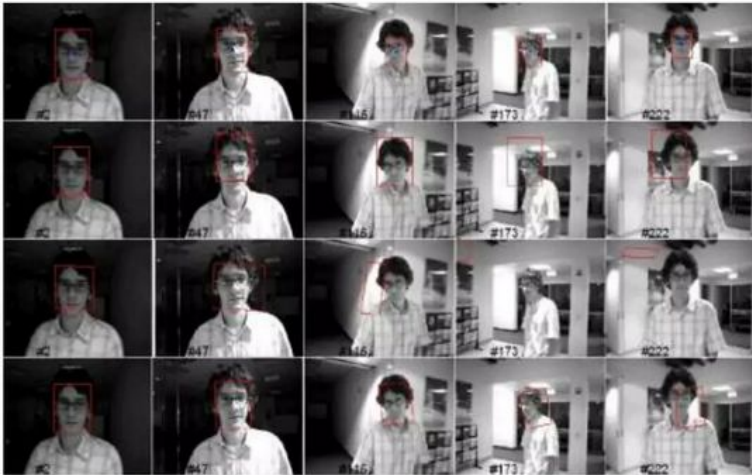
- The object in motion will have change in intensity across the frames
- The background will have consistent values

# Background Subtraction

- Background subtraction should segment the objects of interest when they first appear or re-appear in the scene.
- An appropriate pixel-level stationary criteria should be defined
- The background model should adapt to both sudden and gradual changes in the background
- Background model should take into account changes at different scales.

# Problems

- **Illumination changes:** The variation in the light intensity



Gradual



Sudden

# Problems

- **Motion changes:** noise induced by camera oscillations, high frequency background object



# Problems

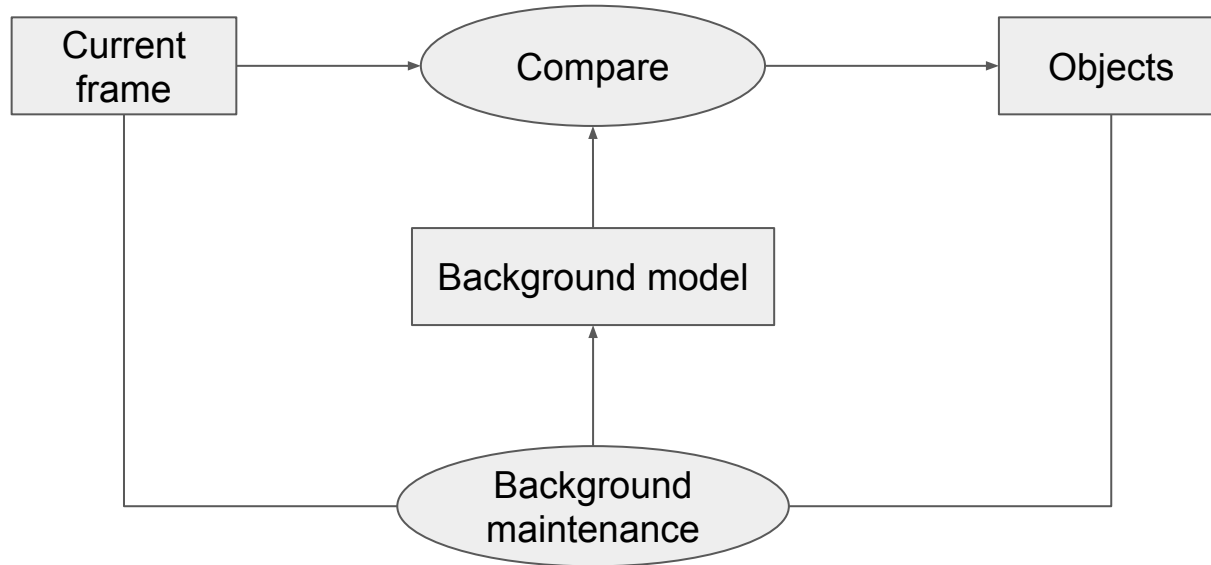
- **Change in the background**

Parked cars



# Moving object detection

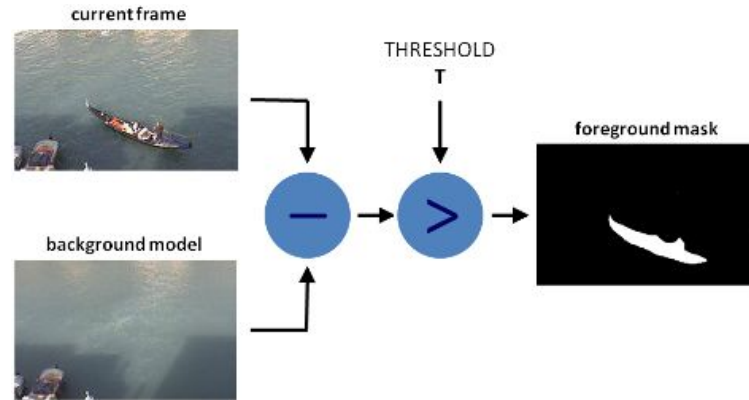
Objects are in motion and background is static.





# Background Subtraction

- Create a static background
- Maintain a model of static background (update after certain pixels)
- Pixels are labeled as object: 1, background: 0



# Static Background

- Capture an initial frame before entrance of object
- Create a static background by approaches like median filtering

# Background Subtraction

- Background subtraction does a reasonable job of extracting the shape of an object, provided the object intensity/color is sufficiently different from the background
- If object is camouflaged then then difficult to detect



a) Input frame



b) Object

# Background Subtraction

- Objects that enter the scene and stop continue to be detected, making it difficult to detect new objects that pass in front of them



a) Input frame

b) Objects

# Background Subtraction

- If part of the assumed static background starts moving, both the object and its negative ghost (the revealed background) are detected



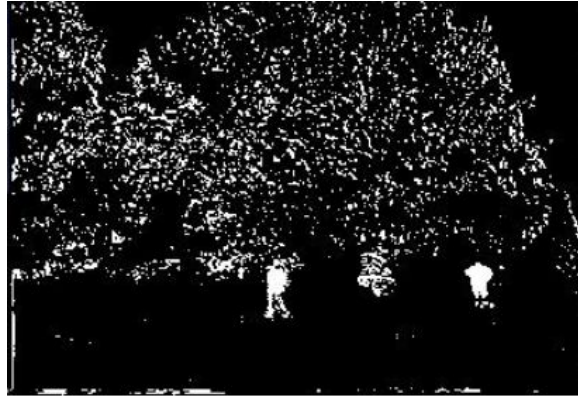
a) Input frame



b) Detected objects

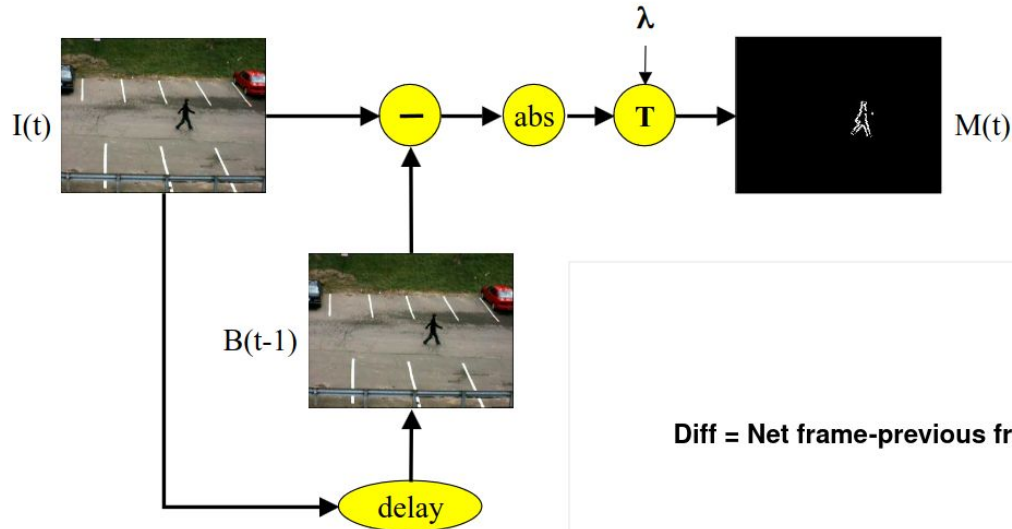
# Background Subtraction

- Background subtraction is sensitive to changing illumination and unimportant movement of the background (for example, trees blowing in the wind, reflections of sunlight off of cars or water)



# Simple Frame Differencing

Background model is replaced with the previous image



# Simple Frame Differencing

- Frame differencing is very quick to adapt to changes in lighting or camera motion
- Objects that stop are no longer detected. Objects that start up do not leave behind ghosts.
- Hard to detect an object moving towards or away from the camera



# Temporal scale

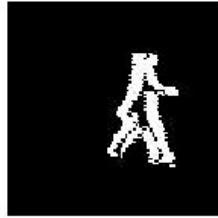
Temporal information when we perform frame differencing at different frame rates



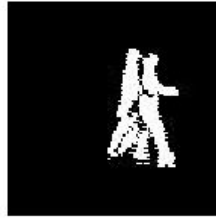
**$I(t)$**



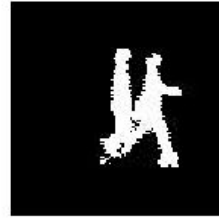
**$D(-1)$**



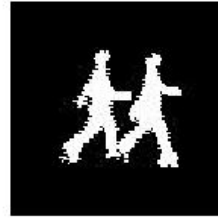
**$D(-3)$**



**$D(-5)$**



**$D(-9)$**



**$D(-15)$**

# Temporal scale

