



Utrecht University

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# Adherent Raindrops in Video



In a rainy day, it is inevitable that raindrops will appear on the windscreen, camera lens, or the protecting shield, causing the vision systems to be affected by the raindrops. The effect is particularly problematic when the vision systems use a hand-held camera or a top-mounted vehicle sensor where no windshield wipers can be used.

Identifying adherent raindrops from images can be problematic due to a few reasons: Foremost, adherent raindrops have various shapes. Unlike opaque objects, they are transparent, making their appearance and thus intensity values vary depending on the environment. They suffer from out-of-focus blur due to their proximity to the camera. Moreover, most

# Challenges in Detecting Adherent Raindrops



Various shapes

raindrops generate glare.



Transparency

Image plane

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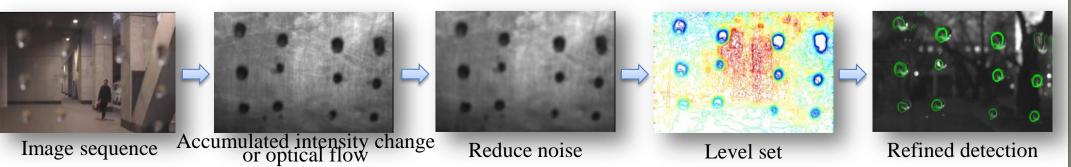


Blurring

(c) Local derivative of  $\varphi$ 

Glare





(a) Observation

Modeling of Clear Raindrop

(b) Continuous mapping

Environment

Raindrop

inside a raindrop)

Mapping  $\boldsymbol{\varphi}$ 

(Image without raindrops)

(a) A raindrop is a contracted image of the environment. (b) On the image plane, there is a smooth mapping  $\varphi'$  starting from the raindrop into the environment. (c) The contraction ratios from the environment to a raindrop are significant.

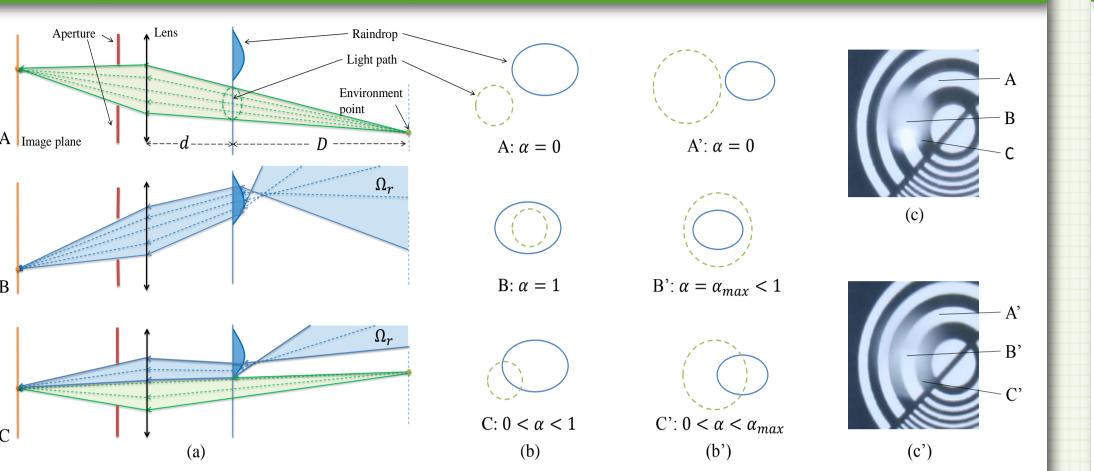
# Adherent Raindrops Detection and Removal in Video

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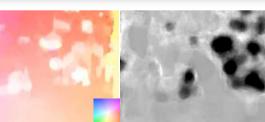
# Modeling of Blurred Raindrop



The appearance and model of pixels on an image plane collecting light from A: environment, B: raindrop, C: both. (a) The light path model. Green light: the light coming from environment point; Blue light: the light refracted by a raindrop. (b) The raindrop plane cut the section of model in (a) when a raindrop is big. Green circle: the area of light collected. Blue circle: the raindrop.  $\alpha$ : percentage of light collected from the raindrop. (b') A raindrop plane cut the section when it is small. (c) The appearance of the 3 situations in (b). (c') The appearance of the 3 situations in (b').

# Methodology





(a) Image sequence

(c) Summation of (b) (b) Inter frame SIFT flow over 100 frames

A clear, unblurred adherent raindrop works like a fish-eye lens and significantly contracts the image of a scene. Consequently, the motion inside raindrops is distinctively slower than the motion of non-raindrops.



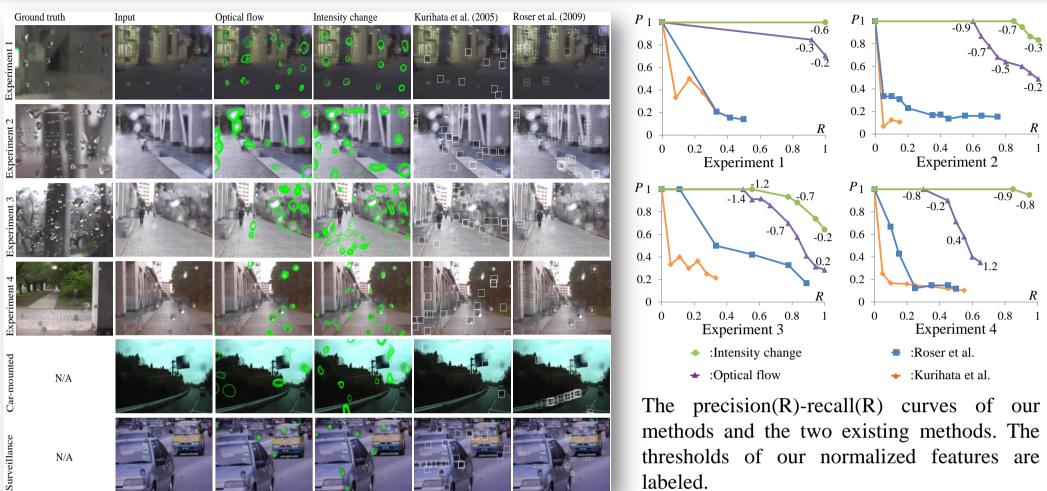
(a) Image sequence

(b) Inter frame intensity change

(c) Summation of (b) over 100 frames

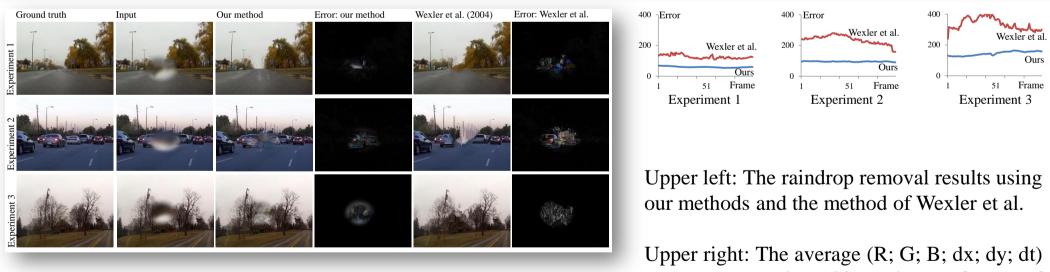
Unlike clear raindrops, blurred raindrops are mixtures of rays originated from the points in the entire scene. Thus, the intensity temporal derivative of blurred raindrops is significantly smaller than that of non-raindrops.

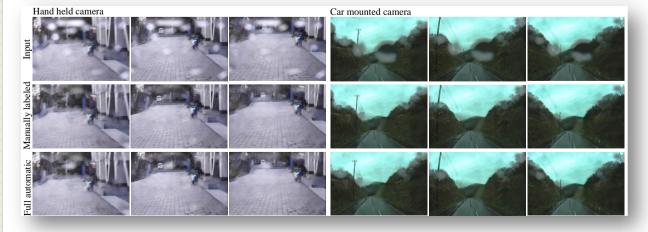
### Detection





Removal





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error on recovering 100 continuous frames of the left experiments.

Lower left: The raindrop removal using the our method. First row: the input sequence. Second row: the removal result with the raindrops manually labeled. Third row: the result with the raindrops removal automatically detected.

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