

# AN APPLICATION FOR FINDING AND CLASSIFYING FRUIT IN IMAGES

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## ABSTRACT

**Keywords**— image classification, thresholding, median filtering

## 1. INTRODUCTION

The subject of this paper is an application that will find and classify fruit in a given set of images. The fruits supported are **apples**, **bananas**, and **oranges**.

## 2. PROCESS

### 2.1. Overview

The first step in finding the fruit is to convert the image to the HSV image space. Then, simple thresholding is used to remove the background from the image. Next, thresholding is used again, but this time to find individual types of fruit. These initial fruit masks are enhanced by using morphological operators, such as erosion and dilation, as well as a median filter. After obtaining a mask of each fruit, connected objects can be used to find separate pieces of fruit. To filter out any noise that may have gotten past the filtering, the area of each connected region is computed in order to determine any outliers. These outliers are then removed. Finally, the centroid of each piece of fruit and the number of pieces of each type are calculated.

### 2.2. Thresholding

Our technique involves using two different levels of thresholding: a threshold to remove the background of the image and then a set of thresholds to find the different fruits. This technique allows the foreground filters (for finding the fruits) to be less selective, as those filters will not have to deal with false-positives in the background.

### 2.3. Enhancing the mask

After thresholding, there is a rough mask of the area where the fruit is. However, these masks contain a significant amount of noise. Our technique uses two methods to reduce the impact of this noise prior to finding regions: a median filter and morphological operations.

First, a median filter, using a 5x5 square, is applied. The median filter is suitable for “salt and pepper” noise, which we determined was one of the more common types of noise seen

in thresholded images. Next, a morphological close operation, consisting of an erosion and dilation, is applied to the image using a 3x3 diamond, equivalent to a four-neighborhood. After these operations, the mask is relatively free of major noise and holes.

### 2.4. Finding connected regions

After the mask is enhanced, our technique will find the connected regions within the image using MATLAB's `bwlabel` using a four-neighborhood. `bwlabel` returns a matrix consisting of 0, 1, ..., n in each cell, corresponding to the regions. These regions are then split up into individual masks and normalized into binary masks.

### 2.5. Removing more noise

At this point, each mask contains a single connected region. However, there are still some regions that correspond to noise in the mask. To reduce this noise further, our technique will then calculate the average area of each mask and removes those masks which has an area significantly smaller or larger than the average region size. This concludes the processing of the masks by our technique.

## 3. TRAINING DATA

### 3.1. Thresholding values

#### 3.1.1. Background capturing thresholds

#### Filter 1

$$0.000 \leq H \leq 1.000$$

$$0.275 \leq S \leq 0.425$$

$$0.100 \leq V \leq 0.450$$

#### Filter 2

$$0.150 \leq H \leq 0.450$$

$$0.000 \leq S \leq 0.900$$

$$0.000 \leq V \leq 0.225$$

#### Filter 3

$$0.100 \leq H \leq 0.275$$

$$0.125 \leq S \leq 0.350$$

$$0.000 \leq V \leq 1.000$$

### 3.1.2. Fruit capturing thresholds

#### Apple

$$0.925 \leq H \text{ OR } H \leq 0.100$$

$$0.600 \leq S \leq 1.000$$

$$0.050 \leq V \leq 0.500$$

#### Banana

$$0.120 \leq H \leq 0.250$$

$$0.500 \leq S \leq 1.000$$

$$0.450 \leq V \leq 1.000$$

#### Orange

$$0.060 \leq H \leq 0.110$$

$$0.600 \leq S \leq 1.000$$

$$0.500 \leq V \leq 0.950$$

## 3.2. Filters and Morphological Operators

1. Median filter using a 5x5 square
2. Close operator using a 3x3 diamond (equivalent to four-neighborhood)

## 4. RESULTS

For the first image, `mixed_fruit1.tiff`, we were able to successfully identify the correct number of fruits.

## 5. FUTURE WORK

There are various techniques that we could use to improve our technique in the future.

### 5.1. Canny-inspired Adaptive Two-Level Thresholding

One potential idea would be to use multi-level thresholding as a way of capturing more area of the fruits while limiting the amount of additional erroneous data being introduced. The primary idea is to use a “high” threshold to pick out regions that have a high probability of being a fruit, then a “low” threshold would be applied to the neighbors of those “high” threshold pixels and then to other neighboring “low” pixels. This would allow those high probability areas to “grow” out and encapsulate the entire fruit.

### 5.2. Contrast Improvement

Another potential idea would be to increase the contrast of the image after applying the thresholds to remove the background. This would allow our technique to have a larger difference between neighboring colors, such as the case with the red in the apples, the orange in the oranges, and the yellow in the bananas, which are neighboring colors in the hue band of HSV.

### 5.3. Shape/Edge Detection

Another potential idea would be to use edge detection to pick out regions that could potentially be a fruit and use shape detection to determine the type of fruit. This could have better results when combined with color.