
Left Luggage Detection Documentation

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Abstract

This wiki describes the method used to detect abandoned items in a public space. Today, video surveillance is used at airports, train stations and public spaces where it is essential to guarantee a high security level. The video stream is obtained through the use of a Kinect device. The RGB (*intensity*) and depth video streams are analyzed independently. From each stream we obtain a set of proposals, i.e. left luggage items, that are combined in the final step of our pipeline.

2.1 Left luggage detection

This wiki describes the method used to detect abandoned items in a public space. Today, video surveillance is used at airports, train stations and public spaces where it is essential to guarantee a high security level. The video stream is obtained through the use of a Kinect device. The RGB (*intensity*) and depth video streams are analyzed independently. From each stream we obtain a set of proposals, i.e. left luggage items, that are combined in the final step of our pipeline.

2.1.1 Introduction

In this section we briefly describe the proposed approach.

Image data: we use the Kinect device. The Kinect sensor is a horizontal bar connected to a small base with a motorized pivot. The major device features are RGB camera and depth sensor. The device has a USB2 interface and the resolution of the RGB camera is 640×480 with 8 bit quantization. The depth camera instead has a resolution of 640×480 with 11 bit quantization.

Pipeline: our detection pipeline analyzes the RGB (*intensity*) and depth video streams independently. This means that the RGB left object proposals are found without considering the depth data and the depth proposals are found without considering the RGB data. Both sets of proposals are combined later in a processing stage. The independent processing is warranted because the RGB video stream is defined everywhere, i.e. for each pixel of a stream frame the intensity value is defined, but it is liable to photometric variations. Instead the depth video stream is not defined everywhere. The depth value is only available for the image regions that are close enough to the device. Also for black objects the sensor can't measure the depth value.

By using the two video streams background models for depth and RGB are computed. To extract left luggage proposals the spatial changes over time are accumulated in an image aggregator. For the depth aggregator we provide more than one method to accumulate the depth changes. If the aggregator exceeds a threshold it is segmented with a bounding box and we mark the spatial region as left item proposal. The depth and intensity proposals are compared using the PASCAL criterion. The bounding boxes that satisfy the criterion are considered left objects.

2.1.2 Background modeling

In this section we describe the methods used to model the background. Then we describe the methods used to accumulate the spatial changes and how the aggregators are processed to extract the proposals.

Depth background model and proposals

The depth background model is computed by using an high-resolution (11-bit) depth matrix. The method used to model the background is the accumulate running average. At time t the model is updated with the following function:

$$model_t = (1 - \alpha) \cdot model_{t-1} + \alpha \cdot frame_t$$

where the coefficient α is the learning rate. For a proper background modelling we have to detect the holes in depth map, i.e. the pixels where the sensor didn't measure the depth. The value of these pixels is $2^{11} - 1$. Then the foreground is extracted. Since the depth image is very noisy, applying an opening is suggested.

To extract the proposal, we accumulate the spatial changes in depth. The methods provided are three.

Image accumulator

The first method is a simple **image accumulator** and it is quicker than the other methods. By using a matrix with the same size of depth frame, the pixels that are in current foreground are incremented by an unit value. Instead the pixels that were in the foreground but now are not in current foreground the correspondent entries are decremented. To generate a proposal from the accumulator we consider only the entry that have a number of observations above a threshold. The proposals are extracted by using ¹. The proposals with area less than 50 pixels are not considered.

Bounding box accumulator

The **bounding box accumulator** method is slower than *image accumulator* but is more accurate. The proposals are generated as in the previous method by using the mask of current foreground. So the current set of bounding box are compared with the set of accumulated bounding box. We consider two bounding box similar if the distance between two centers and the area ratio are under a threshold. For each bounding box that has a match the correspondent entries in the accumulator are updated with the new spatial coordinates and the counter are incremented by an unit value. For each bounding box that hasn't a match it's temporarily stored in the accumulator with counter set to 1. For each bounding box in the accumulator that hasn't a match the correspondent count are decrement. To generate a proposal from the accumulator we consider only the bounding boxes that have a number of observations above a threshold. Note that if more than one bounding box match with a bounding box in the accumulator it considers the first match found.

Best bounding box accumulator

The **best bounding box accumulator** method is the slowest. It's works as the previous method but if more than one bounding box match with a bounding box in the accumulator it updates the accumulator by using the best match found.

Intensity background model and proposals

The intensity background model is computed by using the method of Zivkovic et al ². The intensity-based proposal are generated with the dual foregrounds model of Porikli et al. ³.

¹ Suzuki, S. and Abe, K., Topological Structural Analysis of Digitized Binary Images by Border Following. CVGIP 30 1, pp 32-46 (1985).

²

26. Zivkovic and F. van der Heijden. Efficient adaptive density estimation per image pixel for the task of background subtraction. Pattern Recogn. Lett., 27(7):773-780, May 2006.

³

6. Porikli, Y. Ivanov, and T. Haga. Robust abandoned object detection using dual foregrounds. EURASIP J. Adv. Signal Process, 2008, Jan. 2008. 2, 3, 5

Porikli method

Briefly the Porikli method aims to detect an abandoned item. Instead of using a single background approaches the Prikli methods use two backgrounds: long-term background B_L and short-term background B_S . To compute both backgrounds the method of Zivkovic is used. For long-term background the learning rate α_L is lower than the learning rate α_S used to compute the short-term background. Therefore the B_L is more resistant against the temporary changes. In contrast, the B_S adapts to the underlying distribution faster and the changes in the scene are blended more rapidly. For each frame of video stream, the long and short term foregrounds are extracted by subtracting from the current frame the background models B_L and B_S . So we obtain a long-term foreground mask F_L and a short-term foreground mask F_S . Let $I(x, y)$ be a pixel of the current frame, we have four cases:

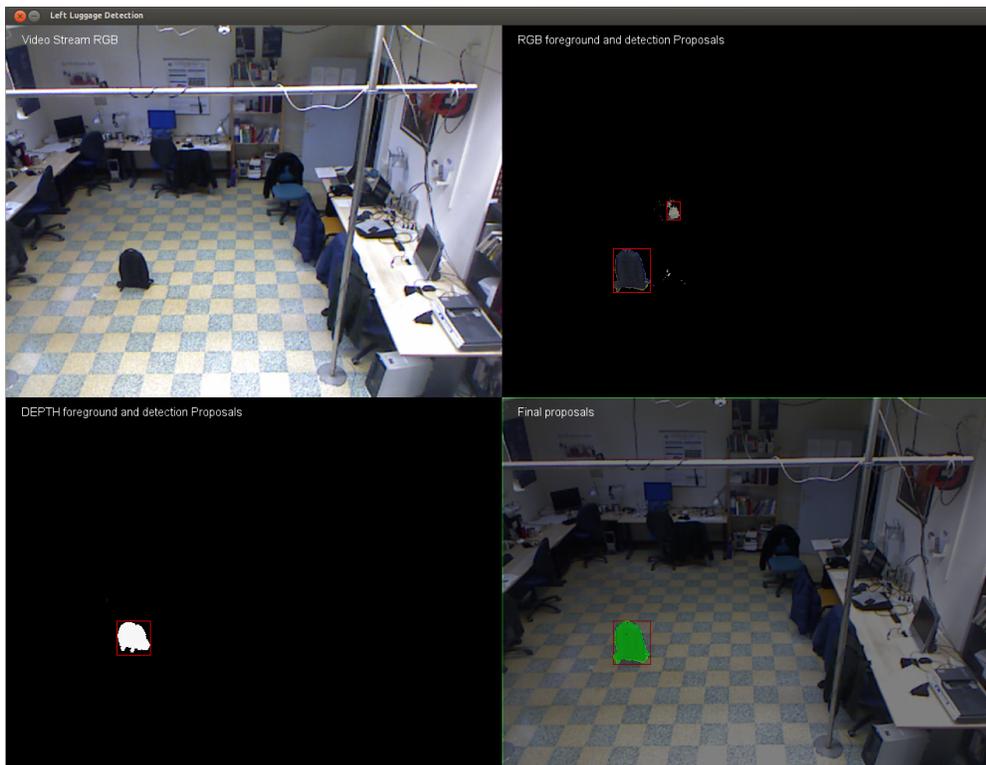
1. if $F_L(x, y) = 1$ and $F_S(x, y) = 1$ then the pixel correspond to a moving object;
2. if $F_L(x, y) = 1$ and $F_S(x, y) = 0$ then the pixel correspond to a **temporarily static object**;
3. if $F_L(x, y) = 0$ and $F_S(x, y) = 1$ then the pixel correspond to scene of background that was acclued before;
4. if $F_L(x, y) = 0$ and $F_S(x, y) = 0$ then the pixel is a background pixel for both backgrounds model.

By using the F_L and F_S an image aggregator is computed. To each pixel correspond an entry in the image aggregator. If a pixel is in F_L but is not in F_S the correspond entry in the image aggregator is increment. Otherwise the image aggregator is decremented.

2.1.3 Combination of proposals

Given the two sets of bounding box obtained through the processing of depth and intensity video streams, we compute the following pairwise overlap ratios:

$$r = \frac{\text{area}(B_{curr} \cap B_{acc})}{\text{area}(B_{curr} \cup B_{acc})}$$



A possible luggage, obtained through the formula above, is no longer detected because of two possible reasons:

- a left item is removed from the scene
- the item detected is standing still for a long amount of time. After this time the item became part of the depth and rgb background. When the item became part of the background model we can't detect its presence doing *current_frame - bg_model* so we need a way to retain the information previously discovered. If a Bounding box is present at the frame t-1 but not in the frame t, we check if pixels in the area, defined by his bounding box, are still the same (i.e. the luggage is still there): this check is performed by using the normalized correlation between the pixel in the t-1 and t frames. If the similarity is above a certain threshold (i.e. 0.9) we keep drawing the old bounding box.

2.1.4 Acknowledgments

This work was supported by the Media Integration and Communication Center (MICC), Alberto Del Bimbo, Lorenzo Seidenari and Lamberto Ballan

2.2 Developer Documentation

Here you can find the developer documentation

2.2.1 Depth Processing

The depth module contains classes that hide some of all the repeated code associated with processing depth data. The main component is the *DepthProcessing* class, which is used to process continuously retrieved data from the kinect. The background model used in this class is obtained through running average via the method *DepthProcessing.update_background_model()*

Usage Example

If code already exists to retrieve the data extracting the bounding boxes proposals can be reduced to as little as the following:

```
# DepthProcessing instance
depth = DepthProcessing(IMAGE_SHAPE)

while True:
    # retrieve the depth information
    depth.current_frame = cam.get_depth_matrix()
    if first_run:
        # in first run moving average start from first frame
        depth.background_model = depth.current_frame.astype(depth.background_model.dtype)
        first_run = False

    # get depth background
    depth.update_background_model(depth.current_frame)

    # get depth foreground
    depth.extract_foreground_mask_from_run_avg(depth.current_frame)

    # apply opening to remove noise
    depth.foreground_mask = bg_models.apply_opening(depth.foreground_mask,
                                                    BG_OPEN_KSIZE,
```

```
cv2.MORPH_ELLIPSE)
```

```
depth_proposal_bbox = depth.extract_proposal_bbox(depth.ACCUMULATOR)
```

DepthProcessing class

class `depth_processing.DepthProcessing` (*image_shape=(640, 480)*)

Depth Processing Class

extract_foreground_mask_from_run_avg (*current_frame*)

Extract depth foreground mask from running average computed subtracting *current_frame* from background model where the difference is above `BG_MASK_THRESHOLD`

Parameters *current_frame* – current frame from which extract foreground

Returns binary mask with 1 for foreground and 0 for background

Return type `np.int64`

extract_proposal_bbox (*method=0*)

Compute bounding boxes for connected components from foreground masks that remain constant for `AGG_DEPTH_MAX_E` frames.

To keep track of the bounding boxes over time the function uses an aggregator depending on the method specified

Parameters *method* – method used to keep track of the bounding boxes history. Methods available are:

- *ACCUMULATOR*: to use an image accumulator for each pixel (fastest method). The bounding boxes are extracted from the pixels accumulated `AGG_DEPTH_MAX_E` times.
- *RECT_MATCHING/RECT_MATCHING2*: to keep track of the number of times a particular bounding box occurs over time (slower method but more accurate). Two bounding boxes in different frames are considered the same if their placement and dimension remain within a tolerance threshold.

Returns list of bounding boxes in the form of (x,y, width, height) where (x,y) is the top left corner

Return type List

Raise *NotImplementedError*: if a method different from `ACCUMULATOR` or `RECT_MATCHING` or `RECT_MATCHING2` is specified

update_background_model (*current_frame, holes_frame=<Mock object>*)

Update depth background by running average

Parameters *current_frame* – current frame whereby update bg model

Returns background model

Return type `np.float32`

`depth_processing.update_depth_detection_aggregator` (*aggregator, foreground_current*)

Update aggregator with the provided foreground. Each pixel of the image has a value that keeps the number of times it has been seen as foreground.

Parameters

- **aggregator** – an image of `uint8`
- **foreground_current** – mask of the current foreground

Returns updated accumulator

2.2.2 Intensity Processing

The intensity module contains classes that hide some of all the repeated code associated with processing intensity data. The main component is the *IntensityProcessing* class, which is used to process continuously retrieved data from the kinect. The background model used in this class is obtained through Zivkovic method: Adaptive Gaussian Mixture Model. The extraction of the foreground pixels proposals is obtained via the *IntensityProcessing.compute_foreground_masks()*. The bounding boxes proposals are extracted using *IntensityProcessing.extract_proposal_bbox()* from an aggregator build using Porikli's method via *IntensityProcessing.update_detection_aggregator()*.

Usage Example

If code already exists to retrieve the data extracting the bounding boxes proposals can be reduced to as little as the following:

```
# get next video frame
rgb.current_frame = cam.get_image()
while True:
    # get rgb dual background (long and short sensitivity)
    # N.B. background is black (0) and foreground white (1)
    rgb.compute_foreground_masks(rgb.current_frame)

    # update rgb aggregator
    rgb.update_detection_aggregator()

    # extract bounding box proposals
    rgb_proposal_bbox = rgb.extract_proposal_bbox()
```

IntensityProcessing class

This module contains class for intensity processing. This class handles the rgb camera status and its methods ensure proper updates to the background models and the bounding boxes extraction.

class `intensity_processing.IntensityProcessing` (*image_shape=(640, 480)*)

compute_foreground_masks (*frame*)

Compute foreground masks for term background and short term background following Porikli's method

Parameters **frame** (*np.uint8*) – frame (3 channels) from which extract foregrounds masks

Returns foreground masks for long term and short term backgrounds

Return type `np.int8`

extract_proposal_bbox ()

Extract RGB proposal as the bounding boxes of the areas of the accumulator that have reached a value of `AGG_RGB_MAX_E`

Returns list of bounding boxes

update_detection_aggregator ()

Update aggregator with the provided foregrounds. If a pixel is in `foreground_long` but not in `foreground_short` increment its accumulator otherwise decrement it. If a particular area has already been detected as proposal don't decrement if the above condition is not verified.

Returns updated accumulator

Return type np.int8

2.2.3 Background Modules

`bg_models.apply_dilation` (*image*, *kernel_size*, *kernel_type*)

Apply dilation to image with the specified kernel type and image

Parameters

- **image** – image to which apply opening
- **kernel_size** – size of the structuring element
- **kernel_type** – structuring element

Returns image with opening applied

Return type np.uint8

`bg_models.apply_opening` (*image*, *kernel_size*, *kernel_type*)

Apply opening to image with the specified kernel type and image

Parameters

- **image** – image to which apply opening
- **kernel_size** – size of the structuring element
- **kernel_type** – structuring element

Returns image with opening applied

Return type np.uint8

`bg_models.compute_background_running_average` (*frame*, *average*, *alpha*, *holes_frame*)

Calculate background using running average technique new background is equal to:

$$bg_{new} = (1 - alpha) * bg_{old} + alpha * frame$$

Parameters

- **frame** (*np.uint16*) – current frame for background update
- **average** (*np.float32*) – background model to update
- **alpha** (*float*) – update learning rate
- **frame_holes_mask** (*np mask*) –

Returns updated background model

Return type np.float32

`bg_models.compute_foreground_mask_from_func` (*f_bg*, *current_frame*, *alpha*)

Extract binary foreground mask (1 foreground, 0 background) from *f_bg* background modeling function and update background model.

Parameters

- **f_bg** – background modeling function
- **current_frame** – current frame from which extract foreground
- **alpha** – update learning rate

Returns foreground mask

Return type np.uint8

`bg_models.compute_holes_mask_in_frame` (*frame*)

`bg_models.cut_foreground` (*image*, *mask*)

Cut the foreground from the image using the mask supplied

Parameters

- **image** – image from which cut foreground
- **mask** – mask of the foreground

Returns image with only the foreground

Raise *IndexError* error if the size of the image is wrong

`bg_models.get_bounding_boxes` (*image*)

Return Bounding Boxes in the format x,y,w,h where (x,y) is the top left corner

Parameters **image** – image from which retrieve the bounding boxes

Returns bounding boxes list

Return type list

`bg_models.get_bounding_boxes2` (*image*)

Return Bounding Boxes in the format x,y,w,h where (x,y) is the top left corner

Parameters **image** – image from which retrieve the bounding boxes

Returns bounding boxes array, where each element has the form (x, y, w, h, counter) with counter = 1

Return type np.array

2.2.4 Kinect Connector

`class kinectconnector.KinectConnector` (*device_number=0*)

Wrapper for the Freenect python libraries you can get_image() and get_depth() for separate channel images

`get_depth` ()

Get the next available depth frame from the kinect, as a numpy array. Low bits in this depth are stripped so it fits in an 8-bit image channel

Returns A numpy array, shape:(640, 480)

Return type np.uint8

`get_depth_matrix` ()

Get the next available depth frame from the kinect, as a numpy array.

Returns A numpy array, shape:(640, 480)

Return type np.uint16

`get_image` ()

Get the next available rgb frame from the kinect, as a numpy array.

Returns A numpy array, shape:(640, 480, 3)

Return type np.uint8

2.2.5 Kinect Calibration

These are some functions to help work with kinect camera calibration and projective geometry. Tasks:

- Convert the kinect depth image to a metric 3D point cloud
- Convert the 3D point cloud to texture coordinates in the RGB image

Notes about the coordinate systems. There are three coordinate systems to worry about.

1. Kinect depth image: (u, v, depth) u and v are image coordinates, (0,0) is the top left corner of the image (640,480) is the bottom right corner of the image.
Depth is the raw 11-bit image from the kinect, where 0 is infinitely far away and larger numbers are closer to the camera (2047 indicates an error pixel)
2. Kinect rgb image: (u, v) u and v are image coordinates (0,0) is the top left corner (640,480) is the bottom right corner
3. XYZ world coordinates: (x, y, z) The 3D world coordinates, in meters, relative to the depth camera. (0,0,0) is the camera center. Negative Z values are in front of the camera, and the positive Z direction points towards the camera. The X axis points to the right, and the Y axis points up. This is the standard right-handed coordinate system used by OpenGL.

`calibkinect.depth2xyzuv` (*depth*, *u=None*, *v=None*)

Return a point cloud, an Nx3 array, made by projecting the kinect depth map through intrinsic / extrinsic calibration matrices

You can provide only a portion of the depth image, or a downsampled version of the depth image if you want; just make sure to provide the correct coordinates in the u,v arguments.

Example: # This downsamples the depth image by 2 and then projects to metric point cloud u,v = mgrid[:480:2,:640:2] xyz,uv = depth2xyzuv(freenect.sync_get_depth()[::2,::2], u, v)

This projects only a small region of interest in the upper corner of the depth image u,v = mgrid[10:120,50:80] xyz,uv = depth2xyzuv(freenect.sync_get_depth()[v,u], u, v)

Parameters

- **depth** – comes directly from the kinect
- **u** – image coordinates, same size as depth (default is the original image)
- **v** – image coordinates, same size as depth (default is the original image)

Returns xyz - 3D world coordinates in meters (Nx3) uv - image coordinates for the RGB image (Nx3)

`calibkinect.uv_matrix` ()

Returns a matrix you can use to project XYZ coordinates (in meters) into U,V coordinates in the kinect RGB image

Returns matrix

`calibkinect.xyz_matrix` ()

Returns a matrix you can use to project U,V coordinates (in meters) into XYZ coordinates in the kinect RGB image

Returns matrix

2.2.6 Constant

`const.DEPTH_HOLE_VALUE = 2047`
Depth holes in openfreenect have maximum value in 11 bit

`const.BG_OPEN_KSIZE = 7`
Structuring element size used to apply opening

`const.BG_RUN_AVG_LRATE = 0.001`
Learning rate for running average in depth processing

`const.BG_MASK_THRESHOLD = 3`
Minimum threshold to consider a pixel foreground in running average e.g. $|pixel - average(pixel)| \geq BG_MASK_THRESHOLD$

`const.BG_ZIV_LONG_LRATE = 0.0005`
Background learning rate in Zivkovich method for long background model

`const.BG_ZIV_SHORT_LRATE = 0.02`
Background learning rate in Zivkovich method for short background model

`const.BG_ZIV_HIST = 1`
History for Zivkovich background method

`const.BG_ZIV_LONG_THRESH = 900`
Threshold for Zivkovich method for long background model

`const.BG_ZIV_SHORT_THRESH = 200`
Threshold for Zivkovich method for short background model

`const.AGG_RGB_MAX_E = 15`
number of frames after which a pixel is considered an left item in rgb domain

`const.AGG_RGB_PENALTY = 7`
penalty in the accumulator for a pixel not in current foreground in rgb domain

`const.AGG_DEPTH_MAX_E = 30`
number of frames after which a pixel is considered an left item in depth domain

`const.AGG_DEPTH_PENALTY = 20`
penalty in the accumulator for a pixel not in current foreground in depth domain

`const.AGG_DEPTH_BBOX = 5`
accumulator threshold for RECT_MATCHING/RECT_MATCHING2 in depth detection

`const.BBOX_MIN_AREA = 70`
minimum area in pixel to create a bounding box

`const.DISPLAY_TYPE = 'PYGAME'`
Default display type: can be PYGAME or SIMPLECV

`const.IMAGE_SHAPE = (640, 480)`
Default image size retrieved from kinect

`const.PYGAME_LAYOUT = 4`
number of images to show in the output can be 2 or 4

`const.SHOW_FPS = True`
shows fps

`const.ENABLE_PROFILING = False`
get profiling info for the first 100 frames

2.2.7 Utility

`utils.bboxes_intersect (bbox1, bbox2)`

Return if two rect overlap

`utils.bboxes_intersect2 (bbox1, bbox2)`

Return if two rect overlap

`utils.draw_bounding_box (image, bbox)`

Draw all bounding box inside image as red rectangle

Parameters

- **image** – image where draw the bounding box
- **bbox** – array of bounding boxes as (x,y,w,h) where x,y is the topleft corner of the rectangle

Returns image with bbox drawn

`utils.get_center_area_from_rect (rect)`

coordinates rect center

`utils.norm_correlate (a, v)`

`utils.rect_similarity (rect1, rect2)`

Check whatever two rect are similar with a tolerance of 10px in center distance and 0.1 in area ratio

`utils.rect_similarity2 (r1, r2)`

Return if r1 and r2 satisfy overlapping criterion

`utils.rgb2gray (rgb)`

`utils.similarity_measure_rect (bbox_test, bbox_target)`

Return similarity measure between two bounding box

Parameters

- **bbox_test** –
- **bbox_target** –

Returns

`utils.to_rgb (im)`

2.2.8 Display

`class video_type.VideoDisplay (v_type, n_views)`

Video Display class. Depending on the method choosed (PYGAME or SIMPLCV) Initialize a screen type to show the output.

`quit ()`

Quit the video stream

`show (frame_upper_left, frame_upper_right, frame_bottom_left=None, frame_bottom_right=None)`

Display the four frames in a 1280x960 display

Parameters

- **frame_upper_left** –
- **frame_upper_right** –
- **frame_bottom_left** –

- `frame_bottom_right` –

Returns True if the drawing succeed or False if the user choose to exit

Return type boolean

Raises `SystemExit`

2.3 Usage

To use our application you can simply launch the main application via:

```
python left-luggage-detection.py
```

Note: make sure your kinect is connected to your pc **and** the power supply otherwise you'll only be able to control the motor and not the video stream

2.3.1 Offline Usage

You can also test this application using registered video via Fakenect library which is included inside Openkinect.

To record a video:

```
mkdir directory_record
record directory_record
```

To use a recorded video you need to specify two environment variables `LD_PRELOAD` to point to the fakenet lib instead of the freenect one and `FAKENECT_PATH` that point to the video folder:

```
LD_PRELOAD="/usr/local/lib64/fakenect/libfreenect.so" FAKENECT_PATH="video/path" python left-luggage-
```

2.4 Project Dependencies

You need to have the following libs/programs installed:

2.4.1 1. OpenKinect

Home page: http://openkinect.org/wiki/Main_Page

Source Code: <https://github.com/OpenKinect/libfreenect>

Dependencies

Manual Build on Linux: for compiling, you need to have the following libs/programs installed:

- `cmake`
- `libusb-1.0-0`
- `libusb-1.0-0-dev`
- `pkg-config`

- libglut3
- libglut3-dev

APT users: (Works on Ubuntu 10.10)

```
sudo apt-get install cmake libglut3-dev pkg-config build-essential libxmu-dev libxi-dev libusb-1.0-0
```

For Ubuntu 13.04, use this instead (replaced libglut3 with freeglut3):

```
sudo apt-get install cmake freeglut3-dev pkg-config build-essential libxmu-dev libxi-dev libusb-1.0-0
```

The python wrapper also need:

```
sudo apt-get install cython python-dev python-numpy
```

Manual Build

Download last libfreenect version from github and compile with CMAKE:

```
git clone git://github.com/OpenKinect/libfreenect.git
cd libfreenect
mkdir build
cd build
cmake ..
make
sudo make install
sudo ldconfig /usr/local/lib64/
```

To test if the library is correctly installed use:

```
sudo glview
```

To install the Python wrapper

```
cd libfreenect/wrappers/python
sudo python setup.py install
```

To use Kinect as a non-root user do the following:

```
sudo adduser $USER video
```

2.4.2 2. OpenCV

To install OpenCV you can use the following script

```
wget https://raw.githubusercontent.com/jayrambhia/Install-OpenCV/master/Ubuntu/opencv_latest.sh
chmod +x opencv_latest.sh
./opencv_latest.sh
```

Note: If you want cuda support add WITH_CUDA=ON in the cmake section in the above script

2.4.3 3. Pygame

To display the video stream we use pygame so you'll need:

```
sudo apt-get install python-pygame
```

2.4.4 4. Optional

SimpleCV

If you decide to use SimpleCV class to display the video stream install SimpleCV from: <http://simplecv.org/download>

cProfile

To run memory and speed benchmark of the application

```
sudo apt-get install pythontracer
```

2.5 Dataset

Video4 <https://mega.co.nz/#!2dwj0SLD!P5qPJTFT5II2egI3-5ZLgXhQYH-OQIIeZL0IkdtAefY>

Video5 https://mega.co.nz/#!bI4h0T7Q!Q8BzVH_WK8rhRqHFIFuyPiUOyz2shkwf6Tp-UWdnEcU

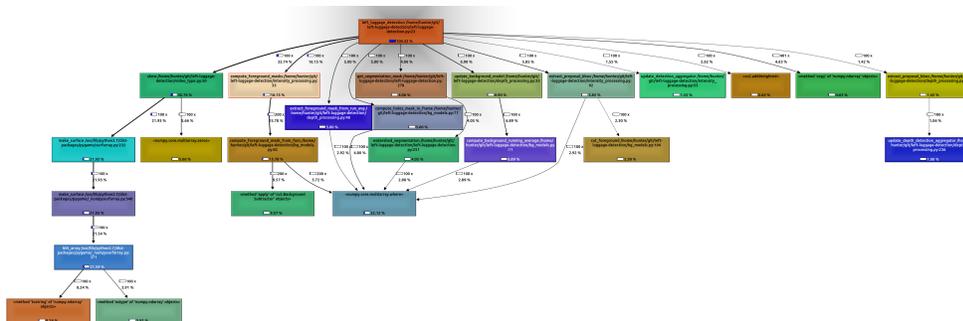
Video12 https://mega.co.nz/#!mBpDQYbJ!NBMqY2sgXgtC-9GkTEtdVwaLegos_hHYhS_by2-vMcg

Video13 <https://mega.co.nz/#!jUIyAJxb!CN3aYrluS14AnP18BPYN6jrVYgPKd6KOuhXpYf88UGA>

Video14 <https://mega.co.nz/#!iF5kwRYT!8IDA076Yx4Ytl9Fj0fxGptF3YIMkY2Jd9IA9x71FnGA>

Video16 <https://mega.co.nz/#!qUJVSJbY!9m3DMLIKzqRZa1MokpQIWpmhnISSqnhILXeuHlkgvEQ>

2.6 Performance



The approach used in this application is demanding in term of performance. The proposed framework runs at 5 fps on a modern PC, just like the one proposed in the paper from which the authors were inspired.

2.7 GNU GENERAL PUBLIC LICENSE

Version 2, June 1991

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