## Robot Teknolojisine Giriş BLM4830



Öğr. Grv. Furkan ÇAKMAK

### Ders Tanıtım Formu ve Konular

BLM4830 Robot Teknolojisine Giriş Hafta 11

Hafta	Tarih	Konular
1	2.03.2022	Ders Tanıtımı, ROS ve Platform Tanıtımı, Robot Çeşitleri ve Robotik Konuları Başlangıcı
2	9.03.2022	Kinematik - Genel Tanımlar - Diferansiyel Sürüşlü Robot İçin Hesaplama Örnekleri
3	16.03.2022	Sensörler - Çeşitleri ve Çalışma Sistematikleri ve Uygulamaları
4	23.03.2022	Odometri ve Lokalizasyon Kavramları
5	30.03.2022	Haritalama Yöntemleri ve Uygulamaları
6	6.04.2022	Uygulama 1 (Laboratuvar)
7	13.04.2022	Navigasyon Yaklaşımları ve Uygulamaları
8	20.04.2022	Ara Sınav
9	27.04.2022	Keşif Yaklaşımları ve Uygulamaları
10	4.05.2022	Tatil - Ramazan Bayramı Arifesi
11	11.05.2022	Robot Üzerinden Görüntü İşleme Teknikleri
12	18.05.2022	Uygulama 1-2 (Laboratuvar)
13	25.05.2022	3B Haritalama Yöntemleri 1911
14	1.06.2022	Proje Sunumları

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#### Structure from stereo

- Recover the structure (depth of points) of the environment from two images taken by two distinct cameras, whose relative position and orientation is known
- Two major problems
  - Correspondence problem
  - 3D reconstruction
- Correspondence : which point in first image matches with which point in second image
- 3D construction : calculate depth from matching points

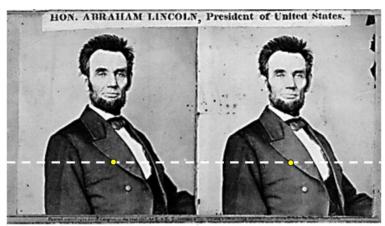
# Structure from stereo – Horizantally perfectly aligned cameras - Matching

For each epipolar line

For each pixel in the left image

compare with every pixel on same epipolar line in right image

pick pixel with minimum match cost



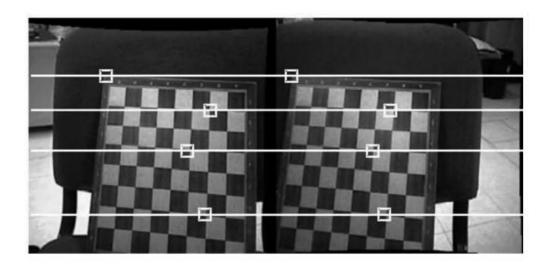
# Structure from stereo – General case - Epipolar geometry





# Structure from stereo – General case - Epipolar rectification

Original
Lens distortion
T&R
Horizantal match



#### Structure from motion

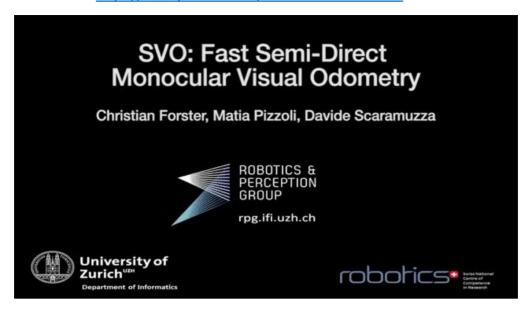
- Process two images taken with the same camera at different times and from different unknown positions
- Both motion and the structure should be estimated

## Structure from motion



### Structure from motion - Visual odometry

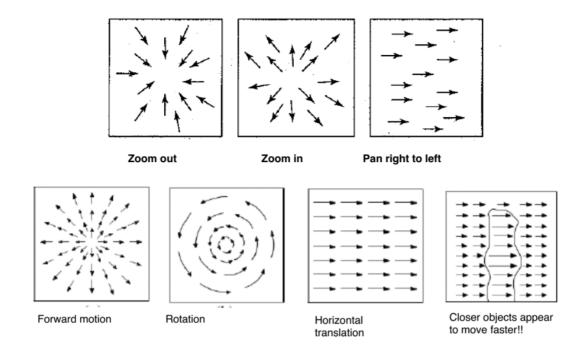
https://www.youtube.com/watch?v=2YnIMfw6bJY



#### Motion field and Optical flow

- Motion field: If a point in the environment moves with velocity vo, this correspondes to a motion with velocity vi in image plane
- Optical flow: If light source moves the brightness pattern in image moves too
- Motion field: real World 3d motion
- Optical flow: Projection of the motion field onto the 2D image
- Estimate motion by optical flow

### Motion Field



#### **Color Tracking**

Color thresholding

$$R_{min} < r < R_{max} \ and \ G_{min} < g < G_{max} \ and \ B_{min} < b < B_{max}$$

- Color Segmentation
  - Adaptive thresholding
  - K-means clustering
  - → Floor plane extraction

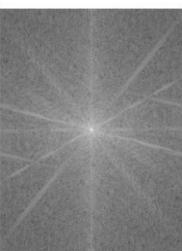
### Image Filtering

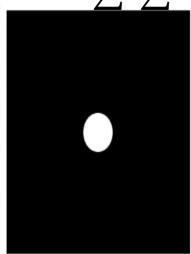
• Frequency domain filtering

• Spatial Filtering

 $I'(x,y) = \sum_{a}^{a} \sum_{b}^{b} w(s,t) . I(x-s,y-t)$ 









# Image Filtering – Spatial Filtering - Smoothing Filters

• Median Filter: Non-linear filter

• Mean Filter : 
$$w = \frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

• Gauss Filter : 
$$G_{\sigma}(x,y) = \eta e^{-\frac{x^2 + y^2}{2\sigma^2}} \rightarrow w = \frac{1}{16} \begin{bmatrix} 1 & 2 & 1 \\ 2 & 4 & 2 \\ 1 & 2 & 1 \end{bmatrix}$$

## Image Filtering – Spatial Filtering – Edge Detection

• Roberts Filter : 
$$r_1 = \begin{bmatrix} -1 & 0 \\ 0 & 1 \end{bmatrix}$$
,  $r_2 = \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix}$ ,  $|G| = \sqrt{r_1^2 + r_2^2}$ 

• Prewitt Filter : 
$$p_1 = \begin{bmatrix} -1 & -1 & -1 \\ 0 & 0 & 0 \\ 1 & 1 & 1 \end{bmatrix}$$
,  $p_2 = \begin{bmatrix} -1 & 0 & 1 \\ -1 & 0 & 1 \\ -1 & 0 & 1 \end{bmatrix}$ ,  $|G| = \sqrt{p_1^2 + p_2^2}$ ,  $\theta = \operatorname{atan}\left(\frac{p_1}{p_2}\right)$ 

• Sobel Filter : 
$$s_1 = \begin{bmatrix} -1 & -2 & -1 \\ 0 & 0 & 0 \\ 1 & 2 & 1 \end{bmatrix}$$
,  $s_2 = \begin{bmatrix} -1 & 0 & 1 \\ -2 & 0 & 2 \\ -1 & 0 & 1 \end{bmatrix}$ ,  $|G| = \sqrt{s_1^2 + s_2^2}$ ,  $\theta = \operatorname{atan}\left(\frac{s_1}{s_2}\right)$ 

#### Straight Edge Extraction – Hough Transform

- A line is defined as y = mx + b
- Initialize a 2D matrix A with axes carry possible values of m and b
- For every edge pixel (xp,yp) loop over all m and b vaules
- If yp=m.xp+b then A[m,b]++
- Largest value of A at m and b means a straight line with parameters m and b

#### Feature Extraction

- Two strategies for sersor input evaluation
- Raw, individual sensor data → low level features
- Extract information from one or more sensor readings → high level features

#### Feature Extraction

- Decision on appropriate features
- Target environment : Office environment → line features, Mars Rover → visual odometry
- Available sensors : laser range finder → line features, sonar sensor → single point ranging
- Computational power : visual features → costly
- Environment representation : continuous rep. → line features, occupancy grid rep. → ranging

### Properties of ideal feature detectors

- Repeatability
- Distinctiveness
- Localization accuracy
- Quantity of features
- Invariance
- Computational efficiency
- Robustness

#### **Corner Detectors**

- Corner: intersection of one or more edges
- Corners are with high repeatability
- Moravec corner detection : patch similarity calculation with SSD (sum of squared differences) → locally maximal SSD value shows a corner
- Harris corner detection: first order Taylor expansion for image around pixel (u,v) with changing x and y

$$I(u+x,v+y) \cong I(u,v) + I_x(u,v)x + I_y(u,v)y$$

#### Harris Corner Detector

$$SSD(x,y) \cong \sum_{u} \sum_{v} \left[ I_{x}(u,v)x + I_{y}(u,v)y \right]^{2}$$

$$= \begin{bmatrix} x & y \end{bmatrix} \sum_{u} \sum_{v} \begin{bmatrix} I_{x}^{2} & I_{x}I_{y} \\ I_{x}I_{y} & I_{y}^{2} \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$= \begin{bmatrix} x & y \end{bmatrix} R^{-1} \begin{bmatrix} \lambda_{1} & 0 \\ 0 & \lambda_{2} \end{bmatrix} R \begin{bmatrix} x \\ y \end{bmatrix}$$

R: orientation,  $\lambda$ : change rate

### Harris Corner Detector



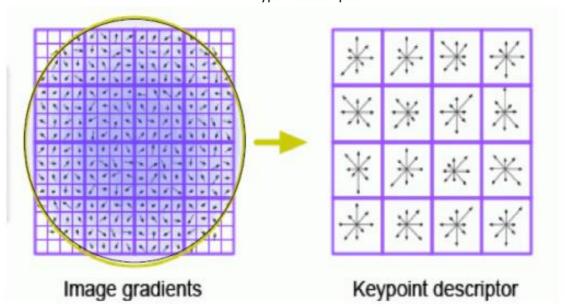


#### **Blob Detectors**

- Blob: an image pattern that differs from its immediate neighborhood in terms of intensty, color and texture
- Location accuracy is smaller than a corner
- Scale and shape accuracy is better defined compared to a corner

#### SIFT Features

Gaussian blurred images at different scales.
Difference of Gaussian images.
Keypoint selection as local maxima or minima of the DoG images
Orientation assignment
Keypoint descriptor



#### sensor\_msgs/LaserScan

```
# Single scan from a planar laser range-finder

# # If you have another ranging device with different behavior (e.g. a sonar
# array), please find or create a different message, since applications
# will make fairly laser-specific assumptions about this data

Header header # timestamp in the header is the acquisition time of
# the first ray in the scan.
# # in frame frame_id, angles are measured around
# the positive Z axis (counterclockwise, if Z is up)
# with zero angle being forward along the x axis

float32 angle_min # start angle of the scan [rad]
float32 angle_max # end angle of the scan [rad]
float32 angle_increment # angular distance between measurements [rad]

float32 time_increment # time between measurements [seconds] - if your scanner
# is moving, this will be used in interpolating position
# of 3d points

float32 range_min # minimum range value [m]
float32 range_max # minimum range value [m]
float32[] ranges # range data [m] (Note: values < range_min or > range_max should be discarded)
float32[] ranges # range data [m] (Note: values < range_min or > range_max should be discarded)
# device does not provide intensities, please leave
# the array empty.
```

#### sensor\_msgs/Image RGB or Depth

```
# This message contains an uncompressed image
# (0, 0) is at top-left corner of image
#
Header header # Header timestamp should be acquisition time of image
# Header frame_id should be optical frame of camera
# origin of frame should be optical center of cameara
# +x should point to the right in the image
# +y should point down in the image
# +z should point into to plane of the image
# lif the frame_id here and the frame_id of the CameraInfo
# message associated with the image conflict
# the behavior is undefined

uint32 height # image height, that is, number of rows
uint32 width # image width, that is, number of columns
# The legal values for encoding are in file src/image_encodings.cpp
# If you want to standardize a new string format, join
# ros-users@lists.sourceforge.net and send an email proposing a new encoding.

string encoding # Encoding of pixels -- channel meaning, ordering, size
# taken from the list of strings in include/sensor_msgs/image_encodings.h

uint8 is_bigendian # is this data bigendian?
uint32 step # Full row length in bytes
uint8[] data # actual matrix data, size is (step * rows)
```

#### sensor msgs/PointCloud

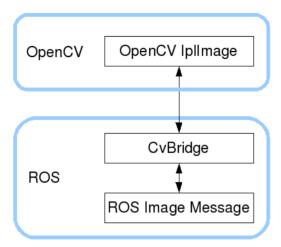
# This message holds a collection of 3d points, plus optional additional # information about each point.

# Time of sensor data acquisition, coordinate frame ID. Header header

# Array of 3d points. Each Point32 should be interpreted as a 3d point # in the frame given in the header. geometry\_msgs/Point32[] points

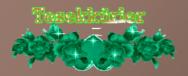
# Each channel should have the same number of elements as points array, # and the data in each channel should correspond 1:1 with each point. # Channel names in common practice are listed in ChannelFloat32.msg. ChannelFloat32[] channels

### cv\_bridge



## Sabırla Dinlediğiniz İçin Teşekkürler

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