# Computer Vision for Autonomous Systems 

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## Autonomous Systems (AS)

- Automobile
- Service
- Consumer
- Medical
- Entertainment
- Education
- Domestic
- Manufacturing
- Military
- Augmented Reality



## Example: Toy robot

## Perceptual capability in dynamic environment



- Location
- Geometry
- Semantics
- Updates

- Distance
- Dimension
- Category
- Instance

Dynamics

- Motion
- Behavior
- Interaction



## Vision as sensing input

- High resolution provides details about complex scenes
- State of the art camera has 1.3-1.7 MP, running at 36FPS (47-61M per second)
- Lidar technology ~60-300k per second
- Shape vs. Appearance
- Most complex situations are defined by appearance (texture) more than shape:
- e.g. road markings, traffic signs, person identity, object instance, etc.
- Cheap and versatile in size and configuration



## Computer vision

The goal of computer vision is to make computers efficiently perceive, process, and understand visual data such as images and videos. The ultimate goal is for computers to emulate the striking perceptual capability of human eyes and brains-or even to surpass and assist the human in certain ways. - [Microsoft Research]

- Single image
- Static scene
- RGB only
- Limited data
- Limited computation power
- Slow algorithms
- Video
- Dynamic scene
- Depth, IMU
- Large amount of data
- Visual computing chips
- Real-time algorithms


## Lessons from bees




Srinivasan $(1997,2011)$


## Localization

- Place recognition and localization
- Loop closure detection for SLAM
- Visual SLAM for mobile autonomous system

large scale image-based localization

Google Tango



HoloLens


Map based visual self-localization


Magic Leap

## Depth and motion



3D scene flow

- Per-pixel dense depth and optical flow
- Algorithm complexity and efficiency
- Temporal consistency
- Semantic awareness

[Bai et al. 2016]

Avg. EPE: 1.80, Our Method, 600 Hz
(1) DIS @ 600 Hz Avg. EPE: 1.52 , Our Muethod, 300 Hz
(2) DIS @ 300Hz ang. EPE: 0.6E, Our Uethod, 10 Hz
(3) DIS @ 10 Hz

[Kroeger et al. 2016]

## Recognizing people, landmarks, and objects

- Detect pedestrians, cars, motorcycles, traffic lights, etc.
- Recognize people and objects


DeepFace $97.25 \%$ accuracy vs. human $97.53 \%$ accuracy


Fast RCNN, 17fps

## Perception from a moving platform



Source: Seattle Police Department

## Vision + other sensing modality

## 1. Detection of rotation


3. Compensating eye movement


- Visual perception is crucial for autonomous systems
- Small
- Cheap
- Fast
- Key problems:
- Localization and mapping
- Object and place recognition
- Motion and dynamics
- Adding other sensing modalities (depth, IMU) significantly helps vision

