



Computer Vision • Computer Vision emerged from: – Image Processing – Pattern Recognition



• Computer Vision started as an AI problem.

Al

- Artificial Intelligence is the study of mental faculties through the use of computational models.
 - Search
 - NLU
 - Speech Recognition
 - Games
 - Computer Vision
 - Expert Systems

Image Understanding • To understand a single image of a scene, locate and identify objects, their structure, and spatial arrangements, and relationships with other objects.

Different Levels

- Low Level: Extraction of symbolic information
- Intermediate Level
- High Level: Interpretation

High Level Vision

- Image Understanding
- Scene Interpretation
- Line Drawings









Marr Approach

- Human vision system
- Shape from X: Recover 3-D from 2-D
- Quantitative vs Qualitative











After 30 Years of Research

- Stereo is almost a solved problem
- Structure from motion is very hard
- Shape from shading is not interesting/applicable
- Range images did not help much
- Not much progress in understanding/recognition/interpretation



Video Understanding

- Gestures
- Activities
- Facial expressions
- Visual Speech
- Applications
 - Video Surveillance and Monitoring
 - Perceptual User Interface
 - Model-based Video Compression
 - Augmented Reality and Video Games
 - Synthesis of Video Sequences













Applications Face Recognition Robotics Remote Sensing: UAVs Computer Graphics Video Surveillance and Monitoring Video Data Mining























Action Detection: Different approaches, different people, the same action





'Odd One Out'































































Takeo Kanade









































Milestones

- Started in August 1986
- Developed four courses
 - Intro to Robot Vision
 - Computer Vision
 - Computer Vision Systems
 - Advanced Computer Vision
- Graduated first Ph.D. student in 1989
- Dr. Lobo joined in 1992
- Dr. Foroosh joined in 2002
- Dr. Tappen Joined in 2006

















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