

# From Computer to Robotic Vision: just a step *or* a leap forward?

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# OUTLINE

- what's the difference?
- from computers to Robots
  - goals / priorities / challenges / adaptation
- new possibilities
  - active perception
  - cognitive Vision/Robotics
- some thoughts

what's the difference?

*robot vision as the  
“daughter”  
of computer vision*



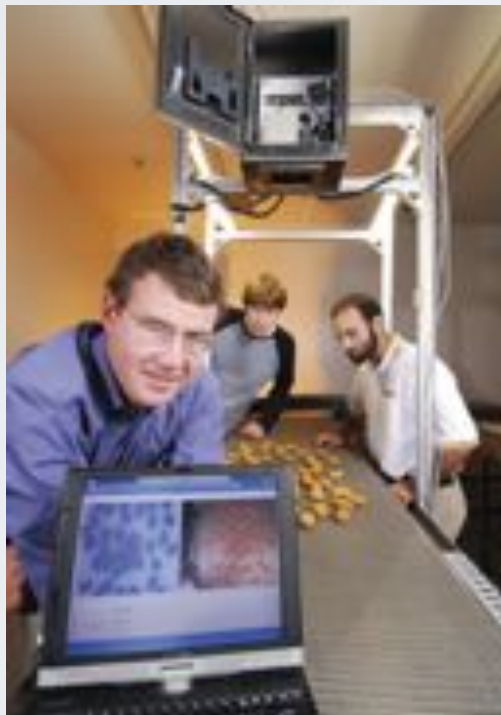
- younger
- “simple” methods
- “simple” problems
- happy with “small” achievements
- still not sure how to use its capacities





CV

RV







RV



from computers  
to Robots





+



robot + vision



+



150cm



15°



60°

robot + vision





+



150cm



robot on

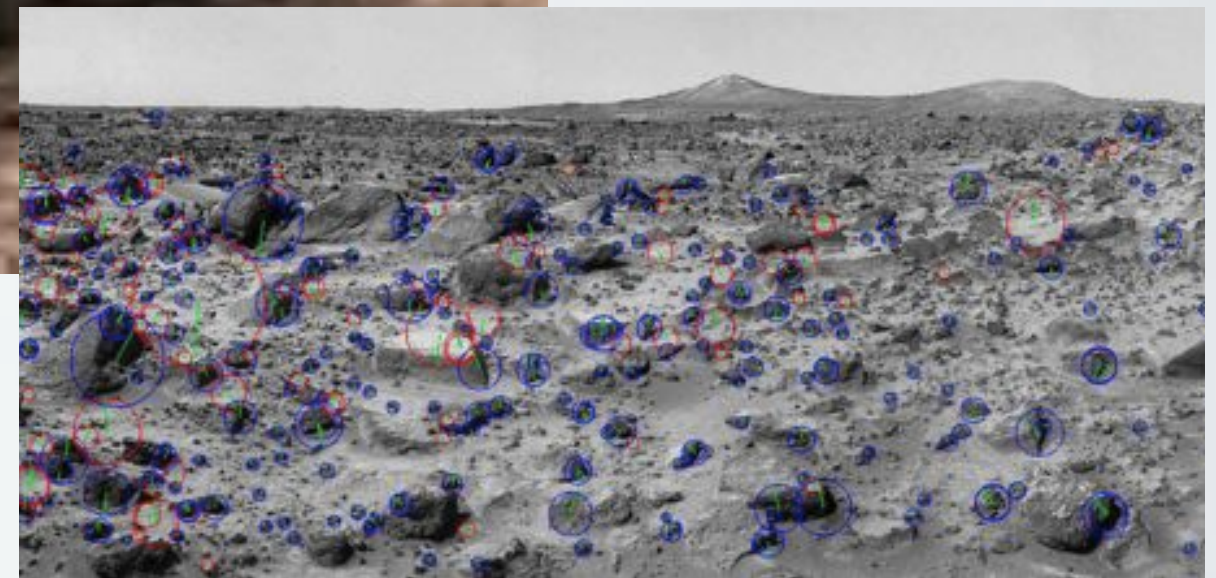
# GOALS

- categorization
- recognition
- **navigation**
- **manipulation**



# SPARTAN

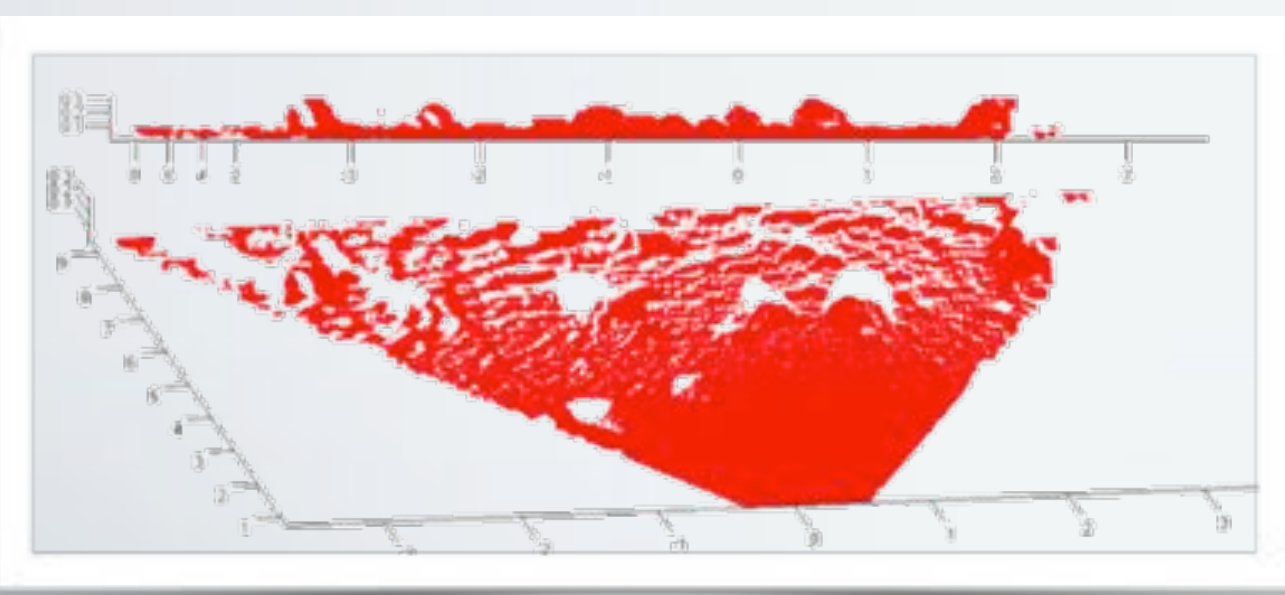
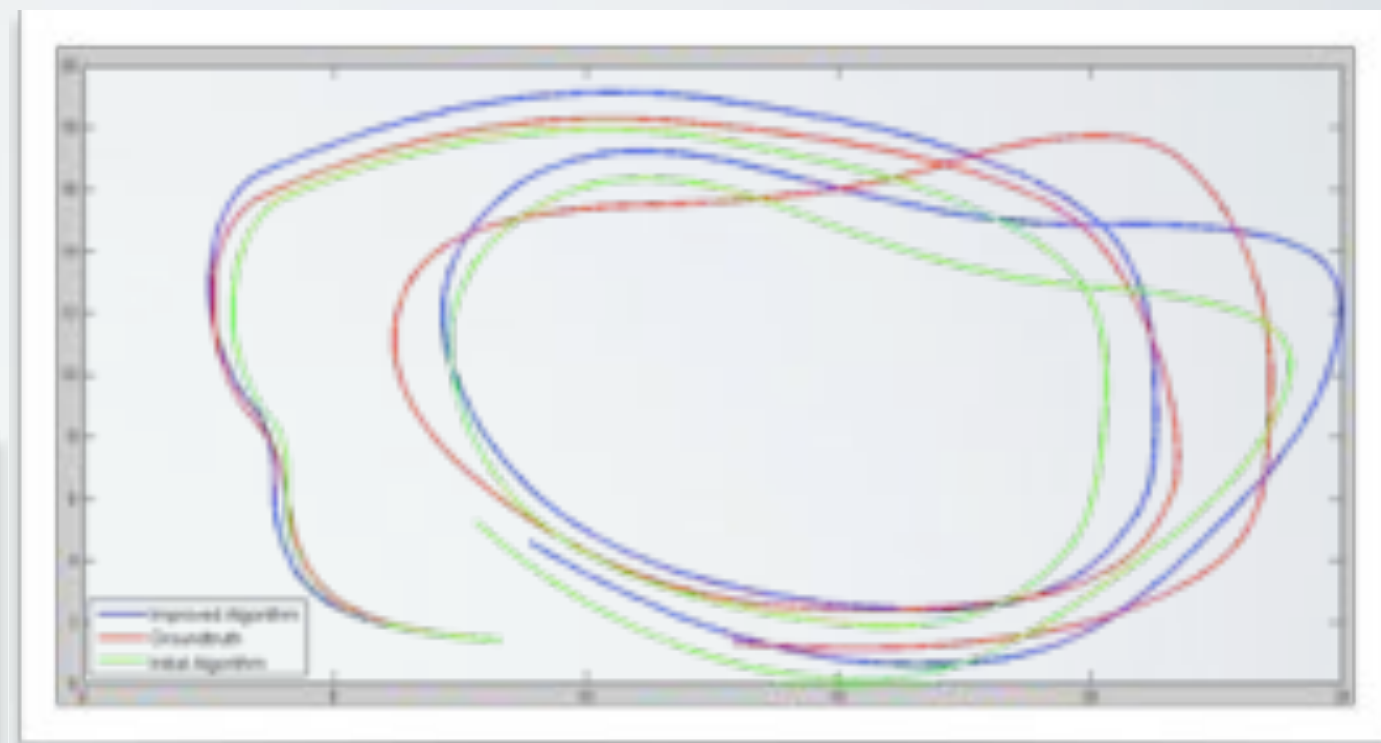
SPAring Robotics Technologies  
for Autonomous Navigation



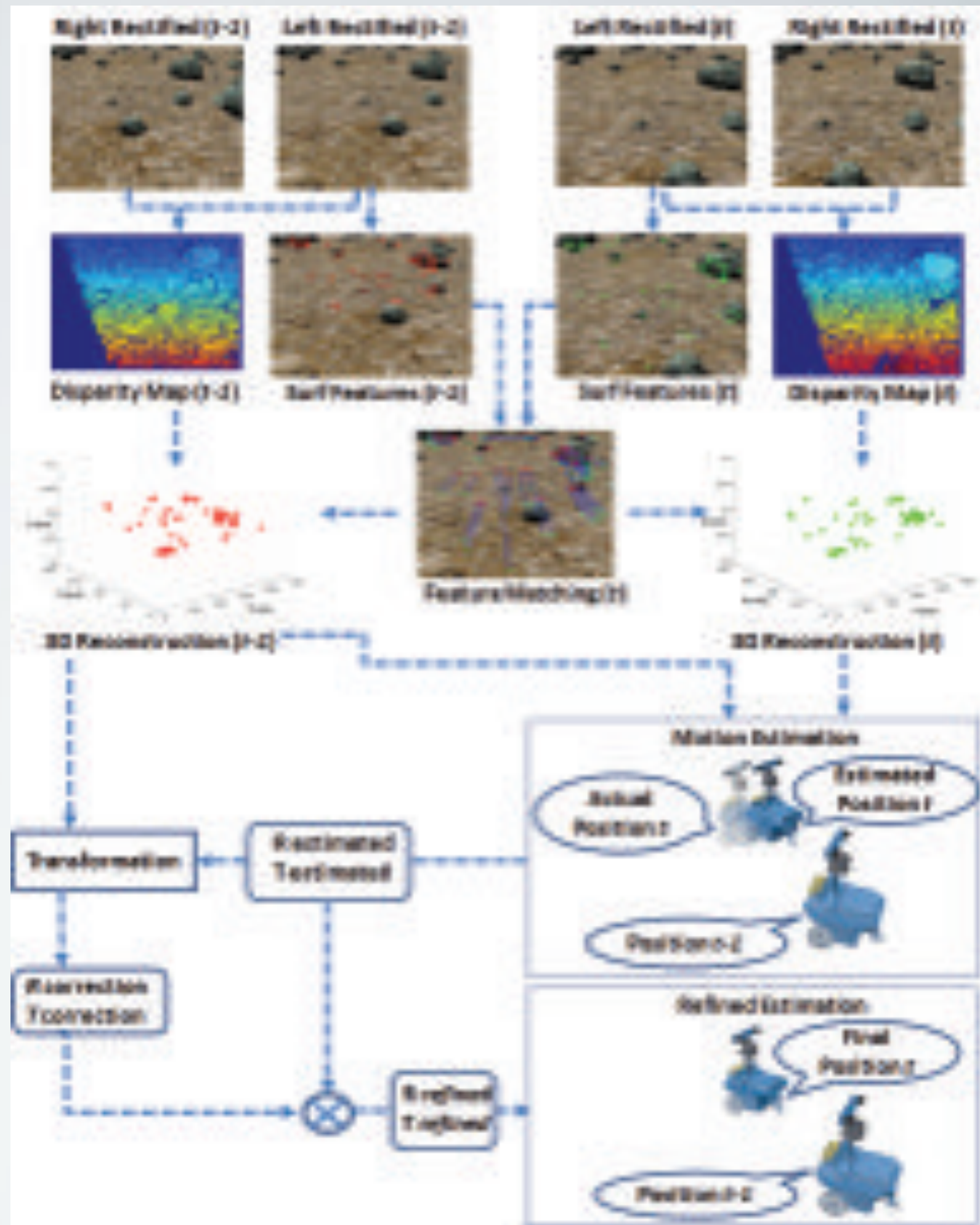
# SPACE EXPLORATION



- Stereo Vision
- Visual Odometry
- 3D reconstruction



- Visual Odometry



# PRIORITIES

- real-time
- robustness
- reliability

- employing bio-inspired & perceptual organization rules in stereo depth estimation



- Circular support region
- Adaptive support weights aggregation  
(**Gestalt** laws of proximity, similarity, and continuity)

$$distance(x', y')|_{x,y} = \sqrt{(x - x')^2 + (y - y')^2}$$

$$dissimilarity(x', y')|_{x,y} = \frac{1}{3} \sum_{c \in R, G, B} |I_c(x, y) - I_c(x', y')|$$

$$discontinuity(x', y', d)|_{x,y,d} = \frac{AD(x', y', d)}{\max(AD)}$$

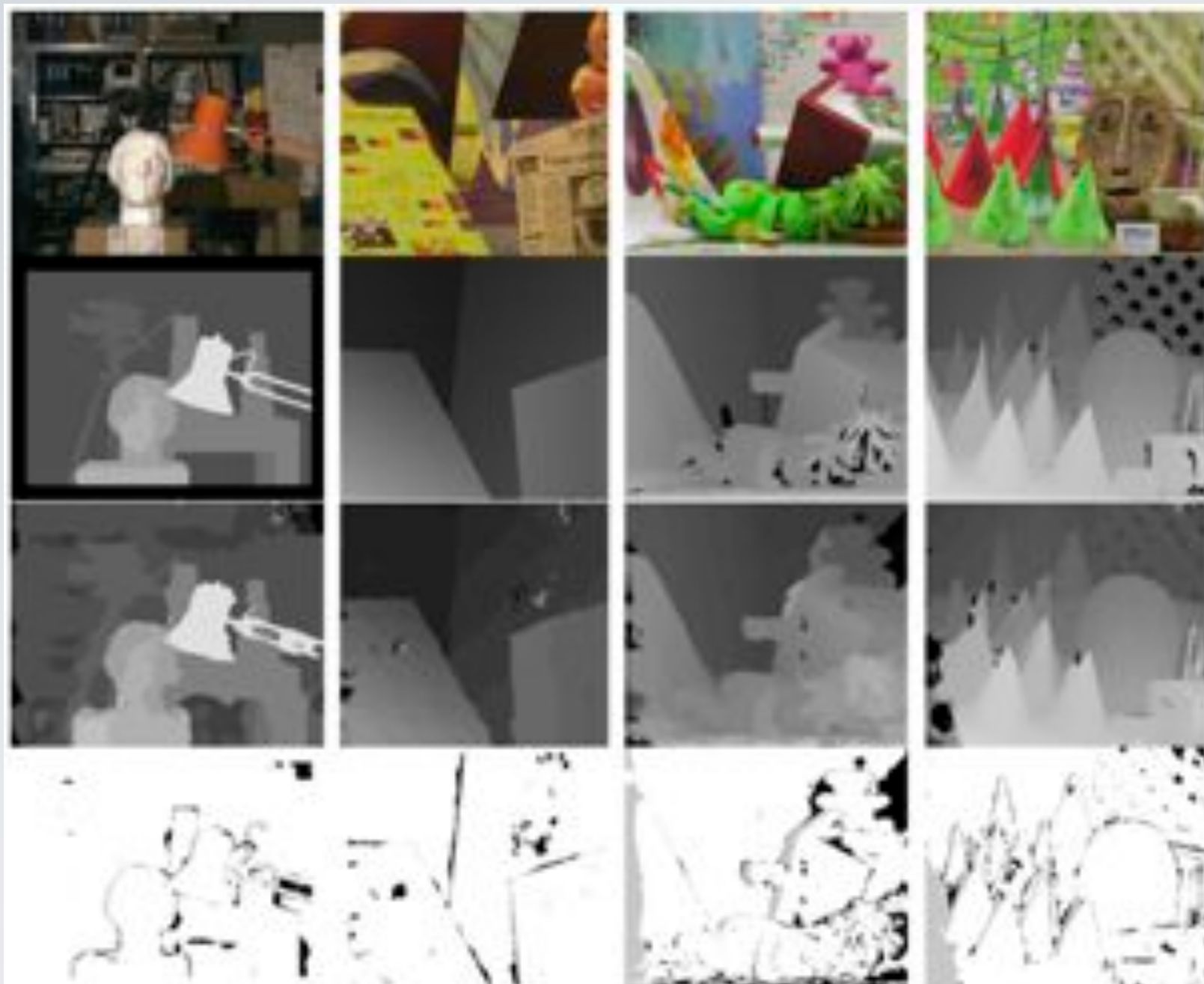
- Logarithmic response to stimuli  
(Weber-Fechner law)

$$w_{dist}(x', y', d)|_{x,y,d} = -k_1 \ln (distance(x', y', d)|_{x,y,d})$$

$$w_{dissim}(x', y', d)|_{x,y,d} = -k_2 \ln (dissimilarity(x', y', d)|_{x,y,d})$$

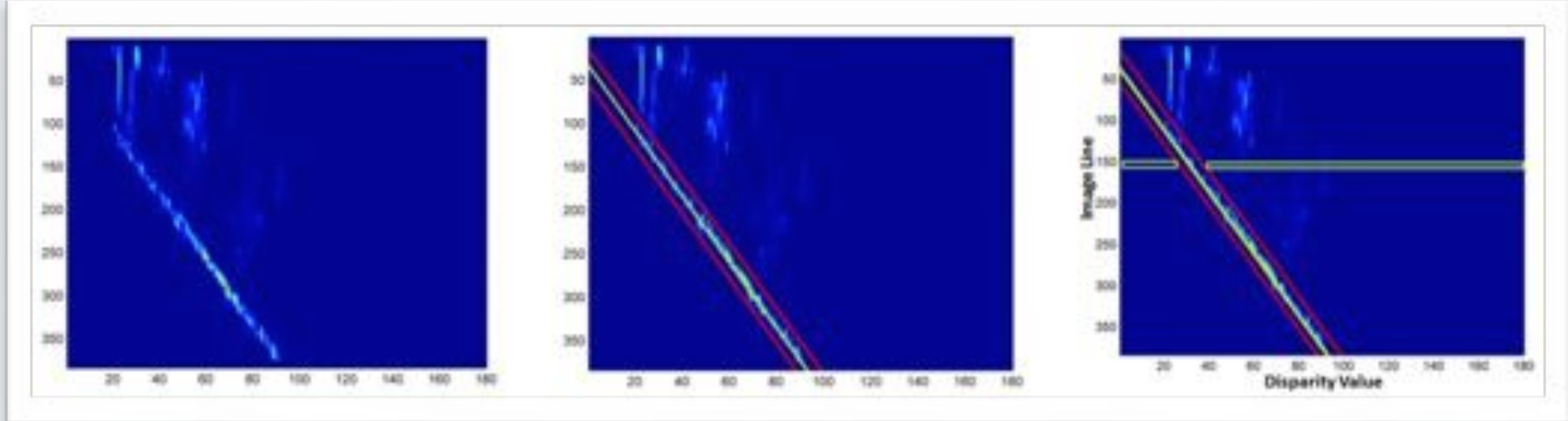
$$w_{discon}(x', y', d)|_{x,y,d} = -k_3 \ln (discontinuity(x', y', d)|_{x,y,d})$$





	nonocc		all		disc	
	error	variation	error	variation	error	variation
<b>proposed</b>	<b>3.62</b>		<b>5.52</b>		<b>14.6</b>	
no continuity	5.19	+43.37%	7.17	+29.89%	21.7	+48.63%
no log. response	8.89	+145.58%	10.5	+90.22%	36.1	+147.26%
no circ. window	3.79	+4.70%	5.62	+1.81%	15.8	+8.22%

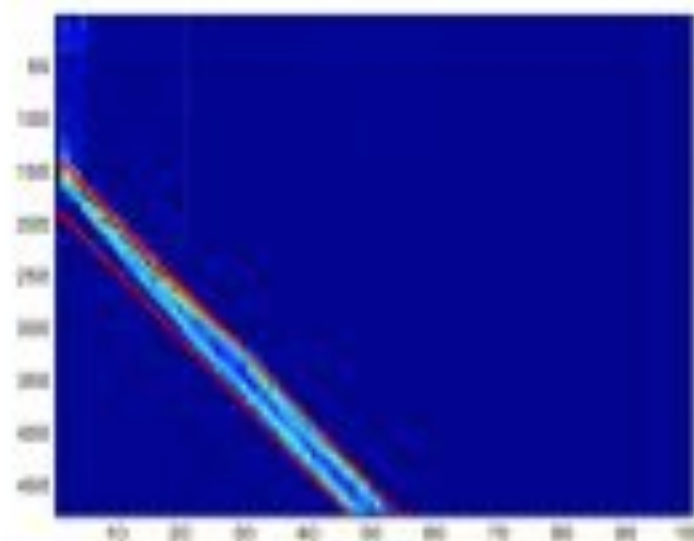
- using 2D histograms of depth images to detect “dominant” planes and “obstacles”



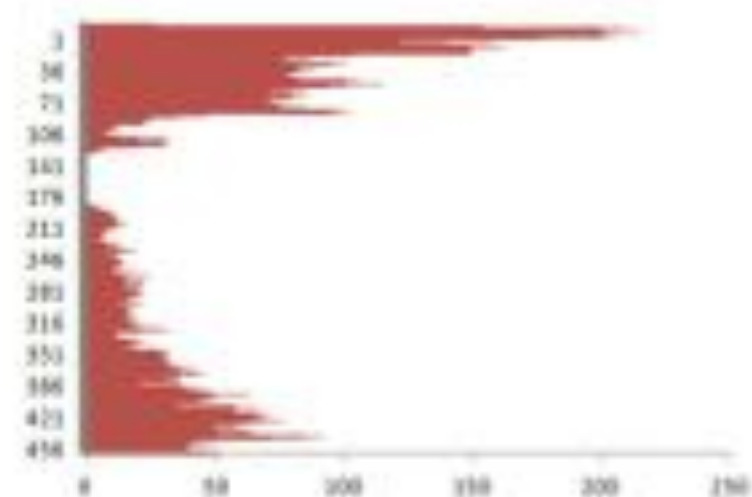




(a) Traversable image



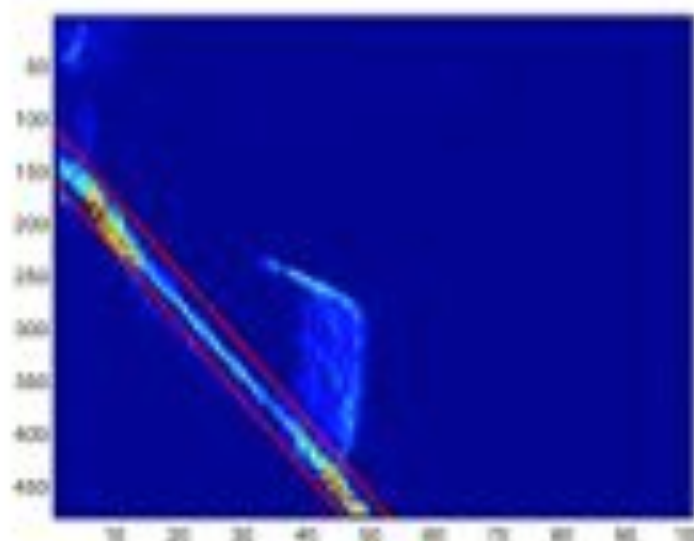
(b) V-disparity image



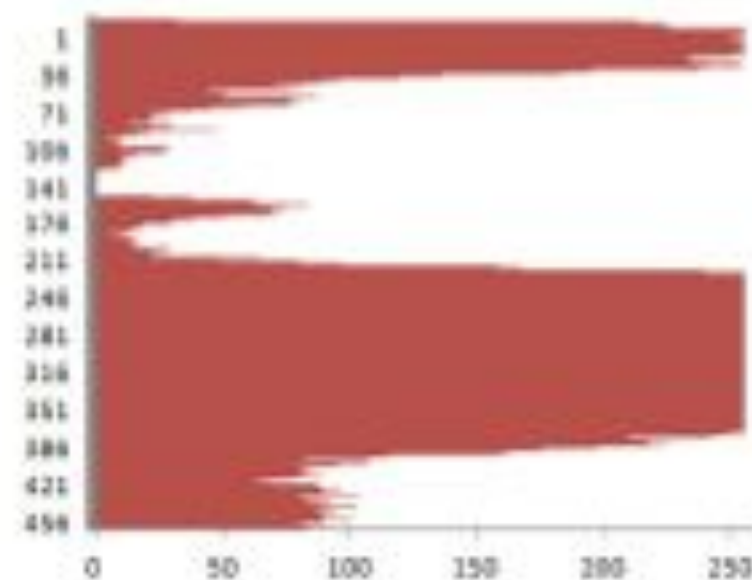
(c) Histogram of features



(d) Non-Traversable image



(e) V-disparity image



(f) Histogram of features

# CHALLENGES

- simplicity of calculations
- non-ideal lighting
- de-calibrated input





View Finder



SC  
F16 FIGHTER PLANE HAS CRASHED DURING

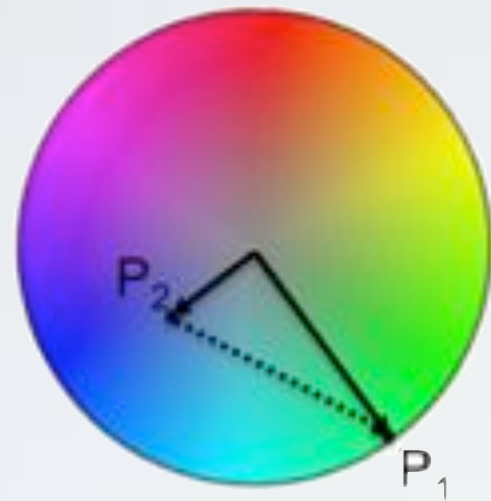
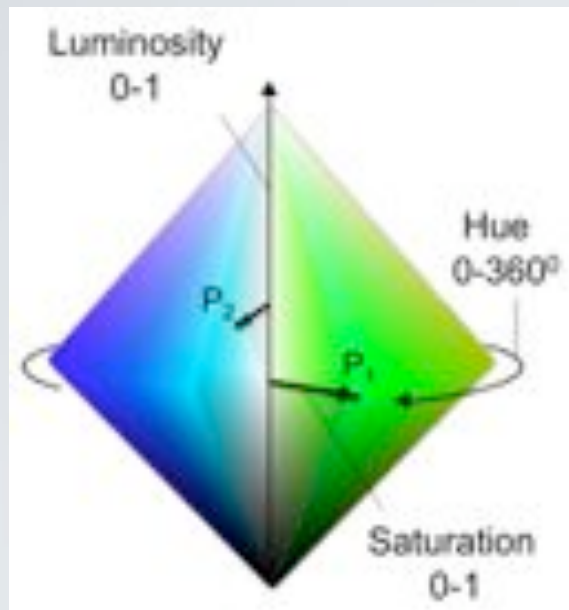


# Dealing with non-Ideal Lighting



# Dealing with non-Ideal Lighting

## Luminosity-Compensating Dissimilarity Measure



Definition of LCDM  
in the  
HSL color space

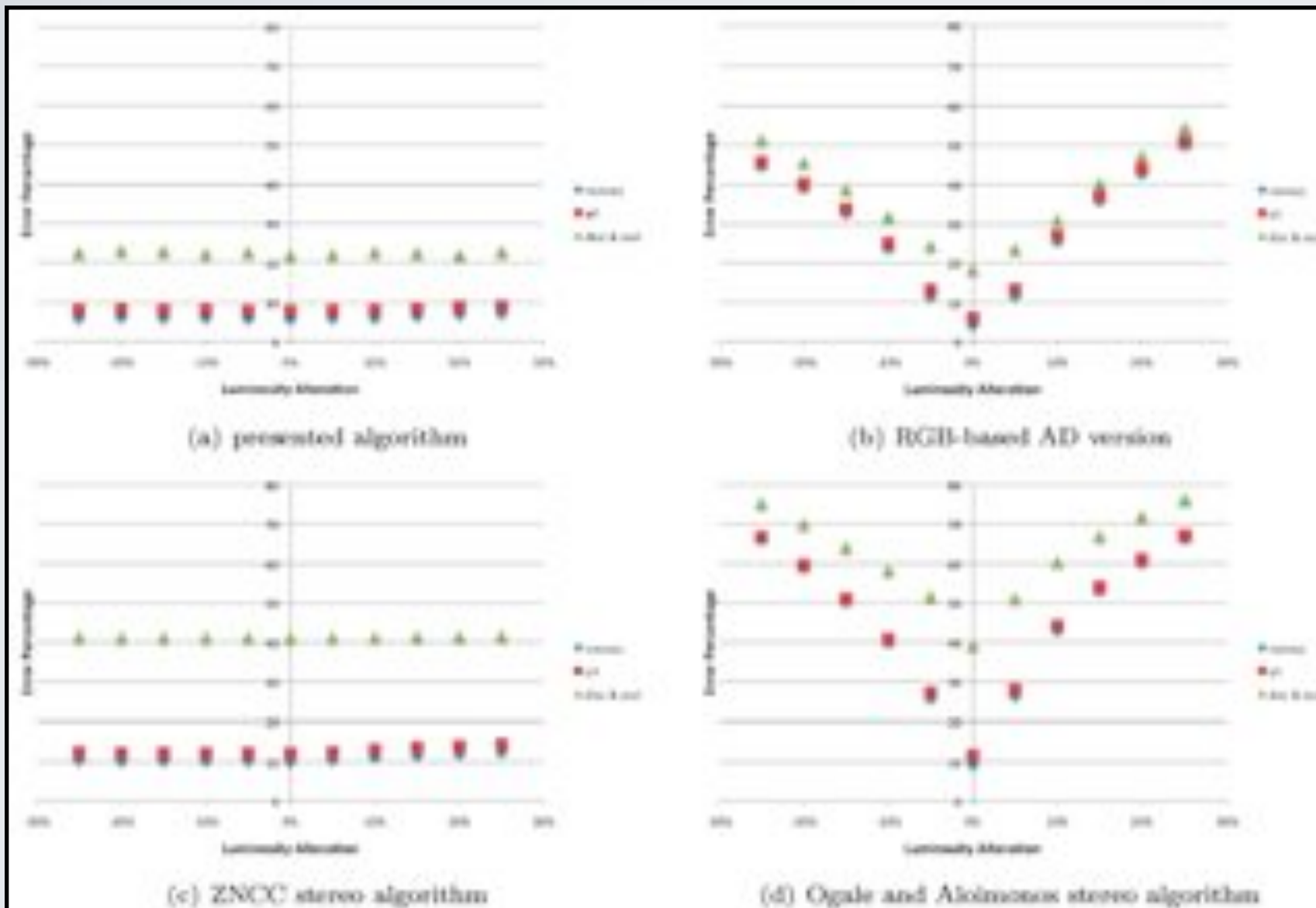
$$\mathbf{P}_k = S_k e^{iH_k}$$

$$\begin{aligned} LCDM_{P_1, P_2} &= |\mathbf{P}_1 - \mathbf{P}_2| \\ &= |S_1 e^{iH_1} - S_2 e^{iH_2}| \\ &= \sqrt{S_1^2 + S_2^2 - 2S_1 S_2 \cos(H_1 - H_2)} \end{aligned}$$



# Dealing with non-Ideal Lighting

## LCDDM-based Algorithm





our DAM robot: moves & manipulates



# Theta-disparity

- radial arrangement of objects
- basic attention mechanism
- common treatment of
  - object detection
  - obstacle avoidance
  - ...



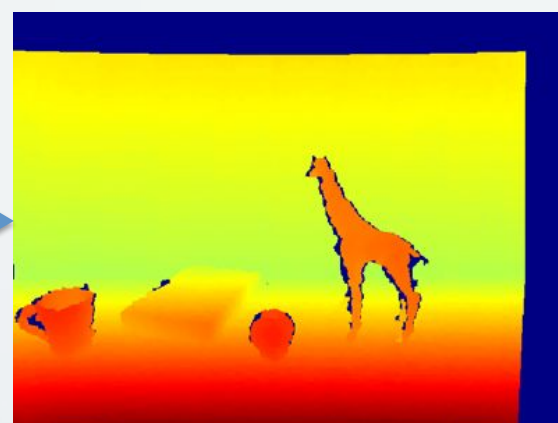
(a) A synthetic scene of the considered scenario



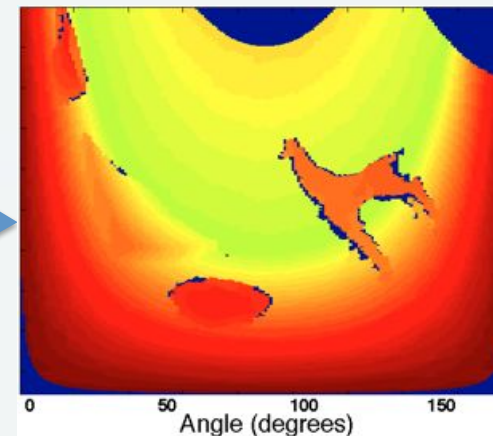
(b) View of the Kinect sensor



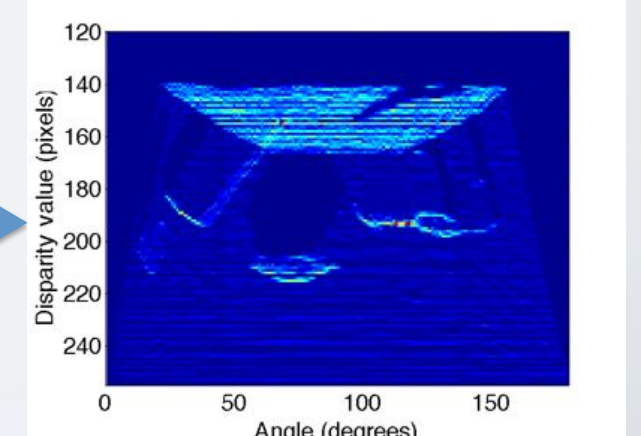
(a)



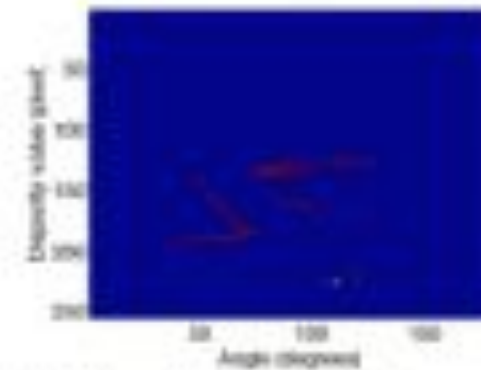
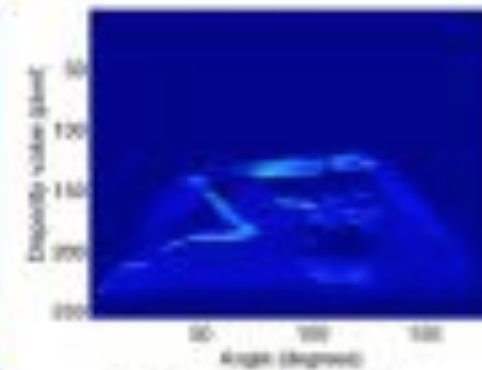
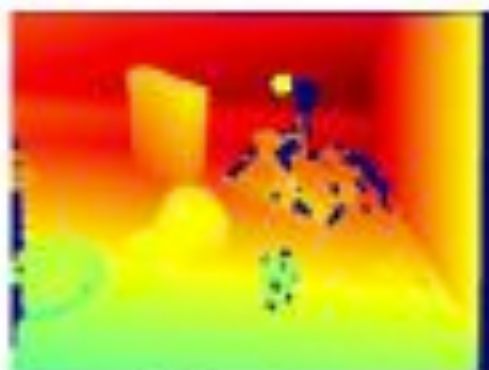
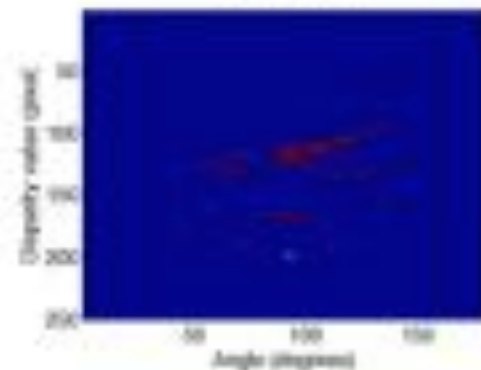
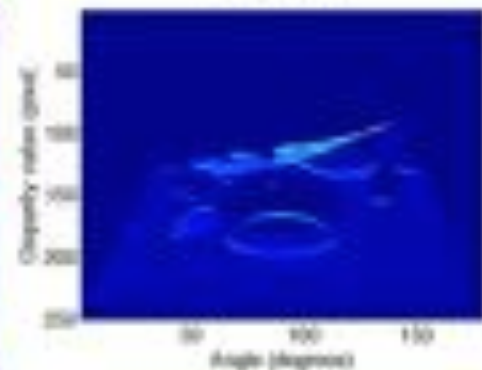
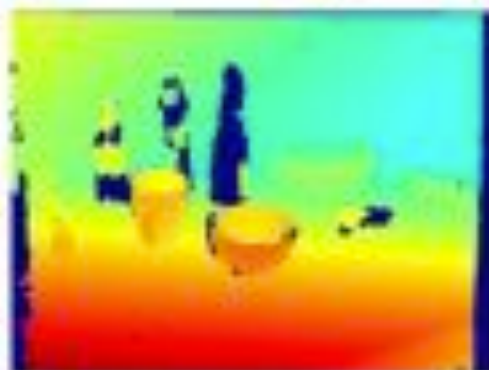
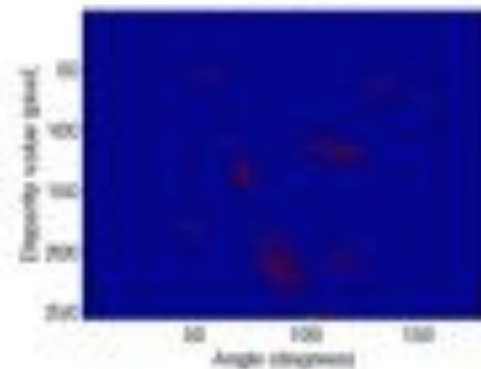
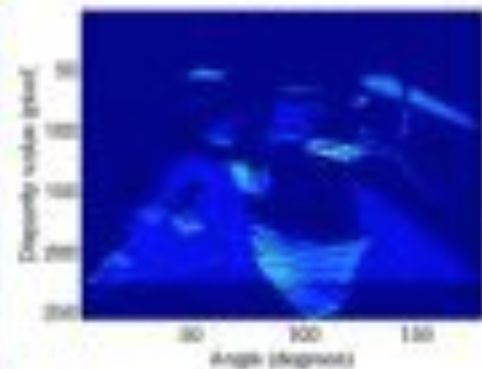
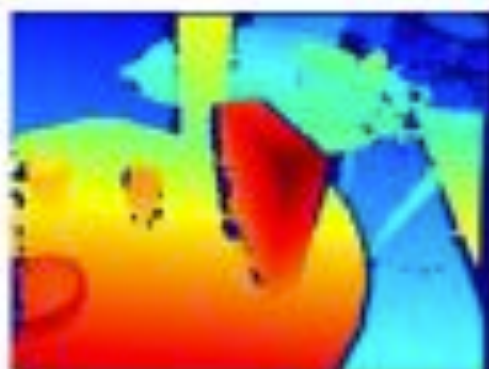
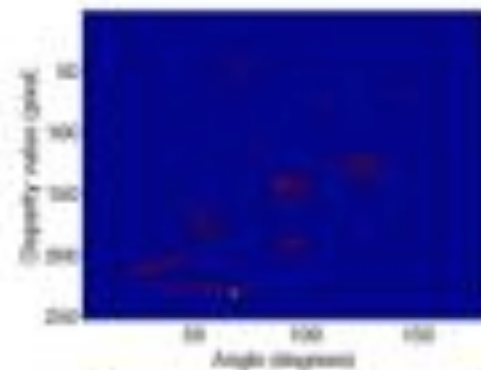
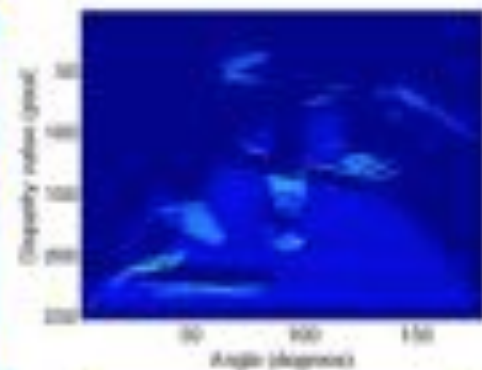
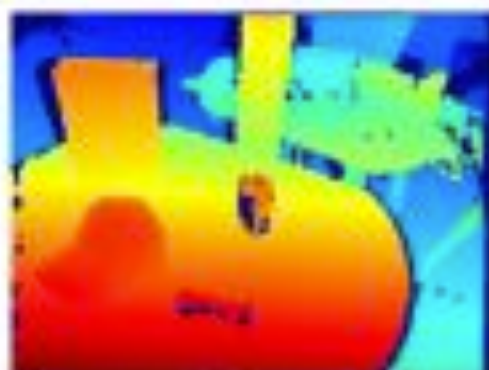
(b)



(c)



(d)



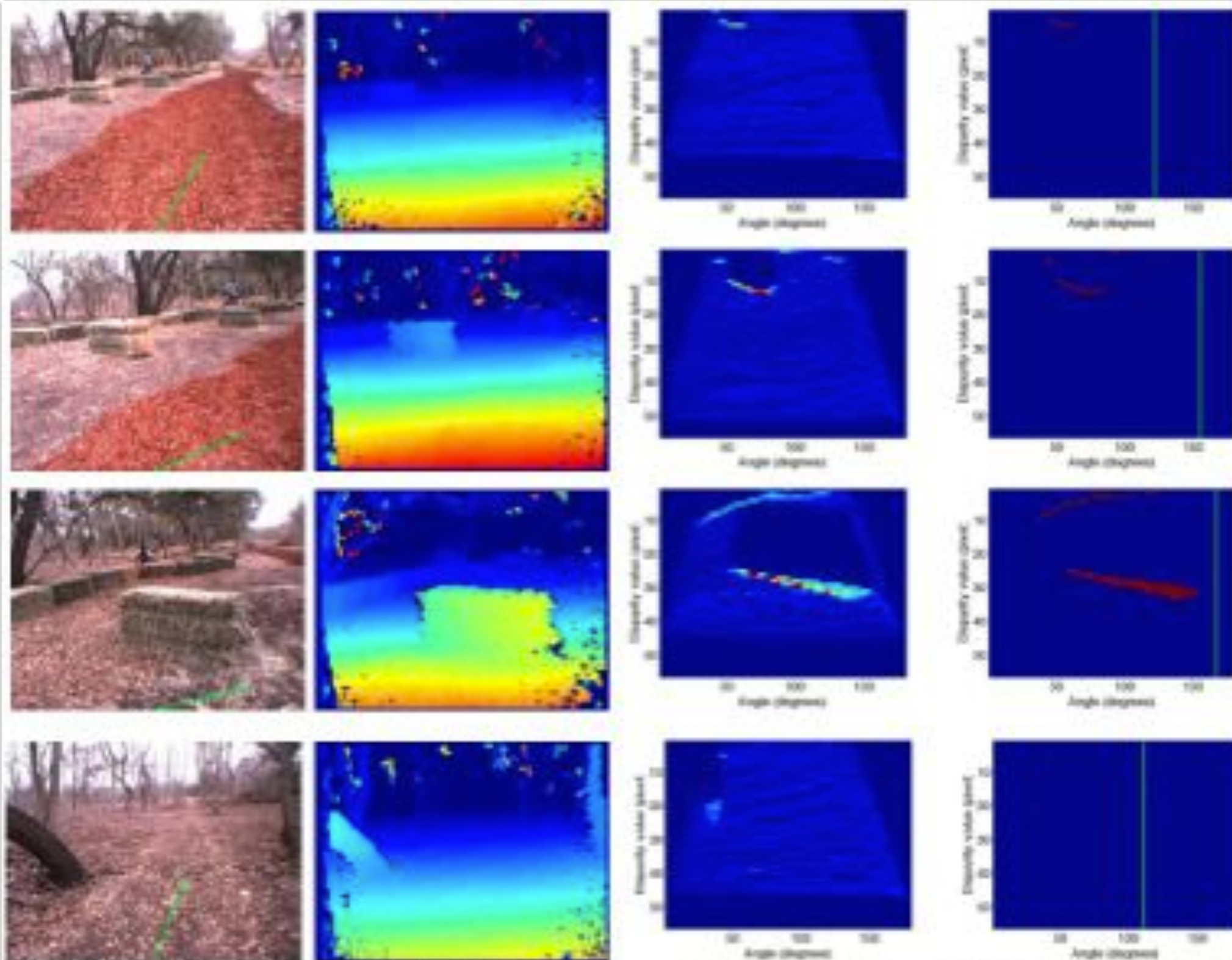
(a) Input image with suggested direction

(b) Disparity map

(c) Theta-disparity image

(d) Binary theta-disparity image with the closest trace highlighted





(a) Input image with suggested direction

(b) Disparity map

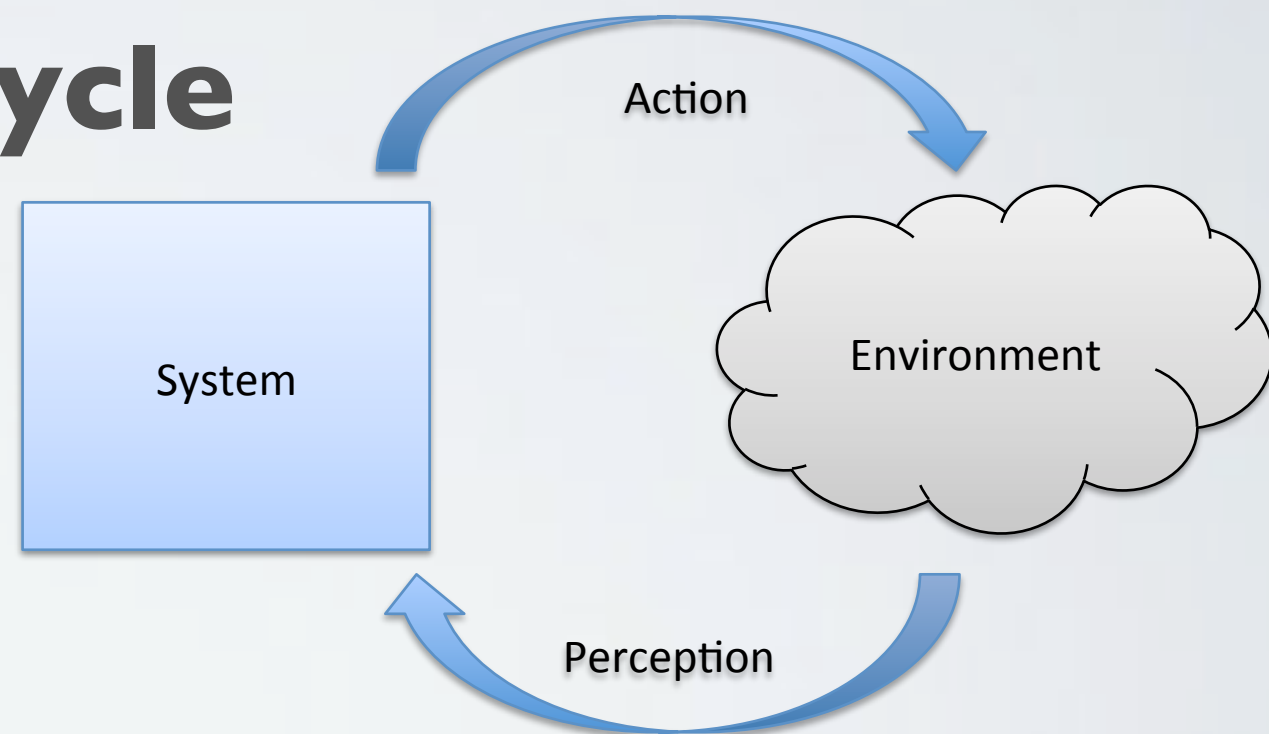
(c) Theta-disparity image

(d) Binary theta-disparity image with suggested direction

new possibilities

- a seeing system/robot uses **Vision** to control its **Motions** (**Perception** precedes **Action**)

- **Perception-Action Cycle**



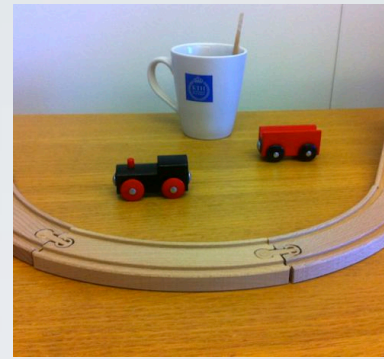
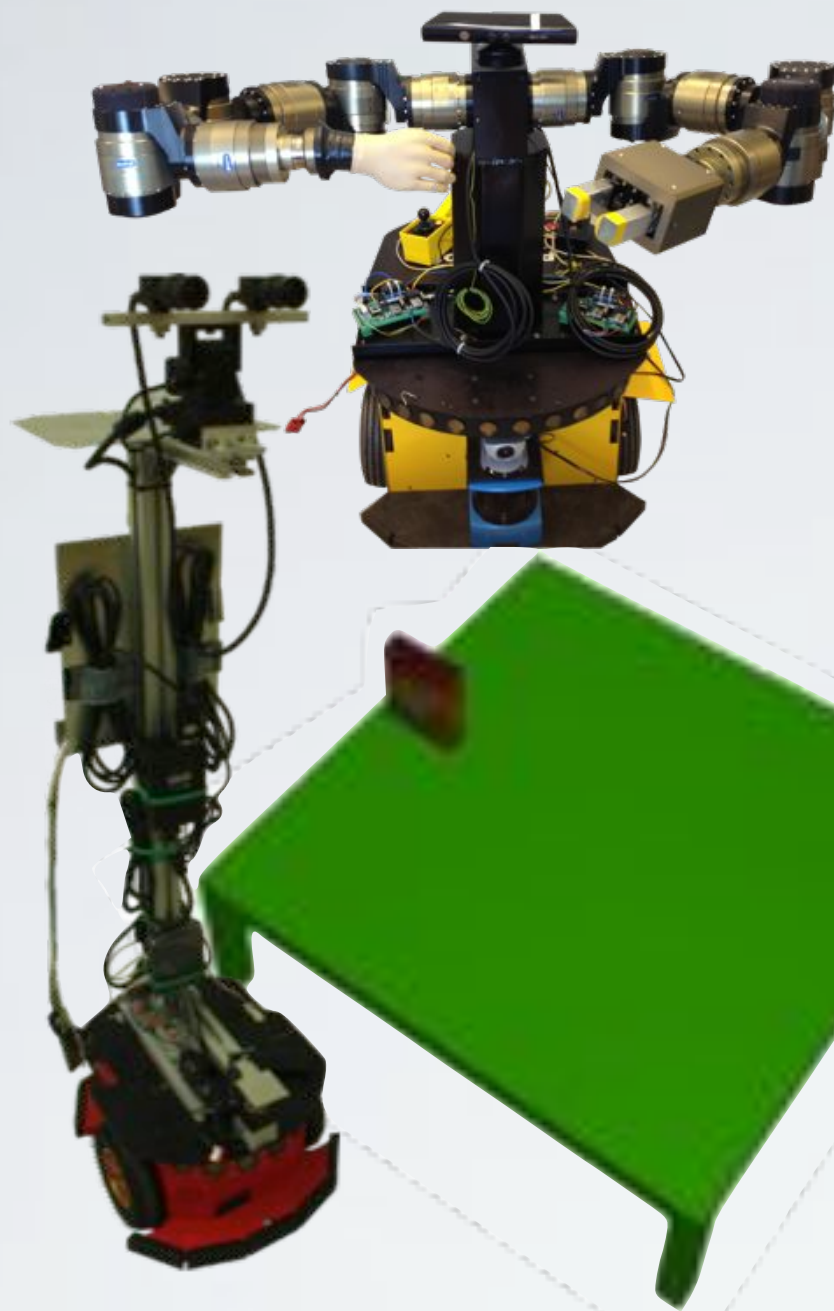
- a system/robot might use **Motion** to control its **Visual** input (**Action** precedes **Perception**) ...



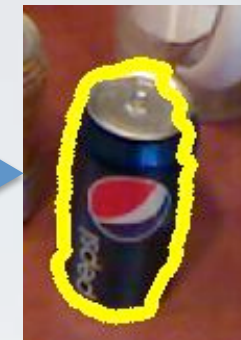


**KTH** head "Charlie"  
in 90's

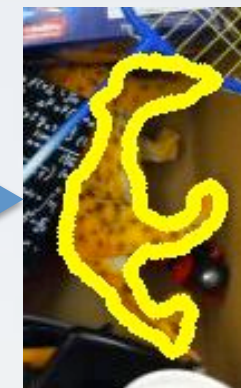
ACTIVE VISION



(a)



(b)

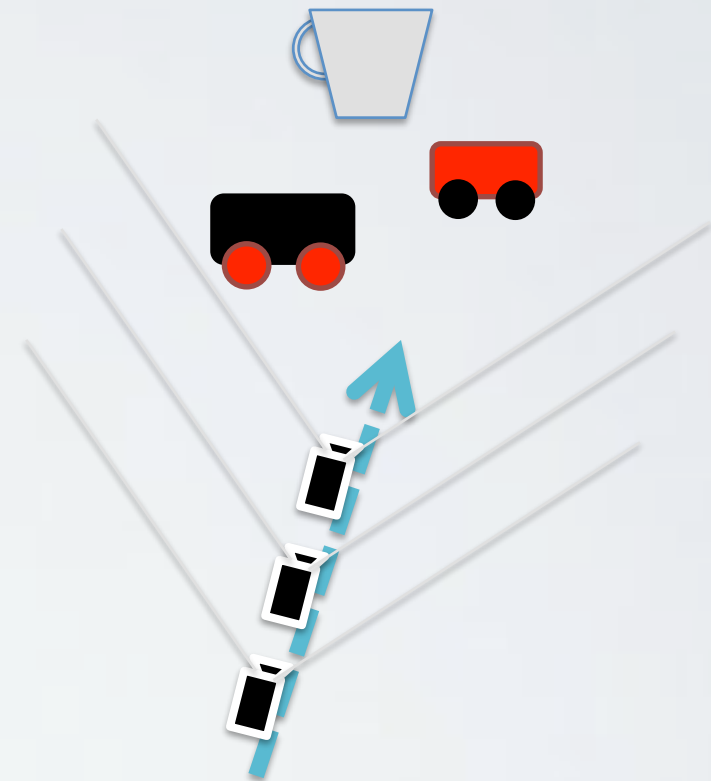


(c)

# Object Segmentation

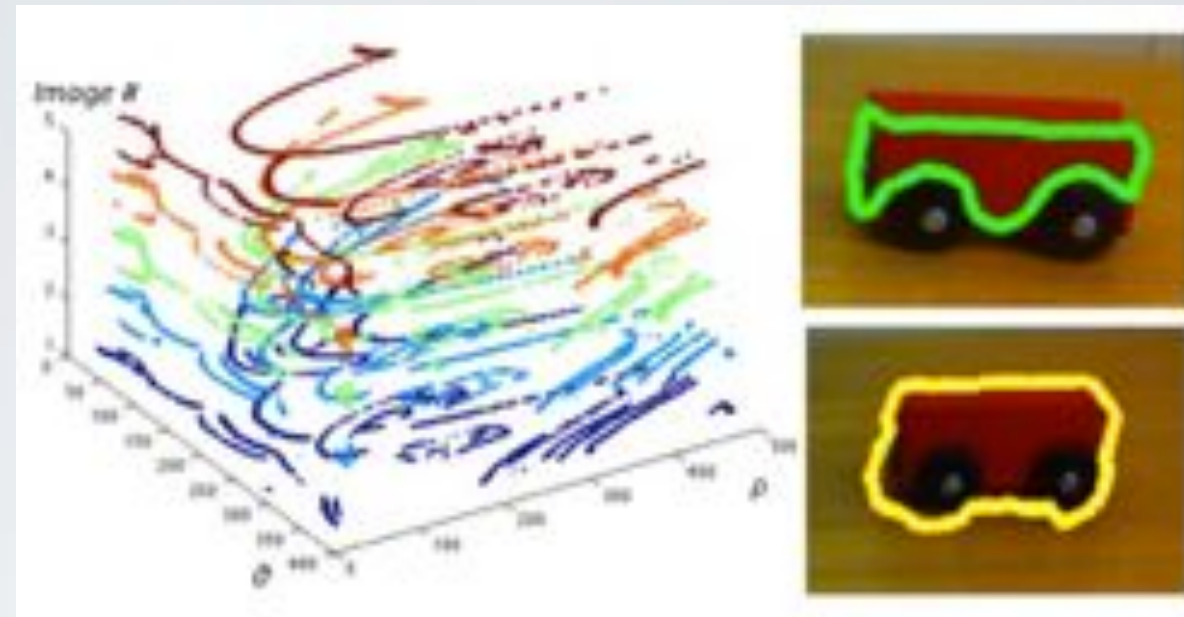


- Taking **time** into account
- Agent moving in the scene
- Multiple observations improve/simplify the segmentation
- Object segmentation by active perception



# Object Segmentation





Object Segmentation





## Sensorimotor Contingency theory

O'Regan & Noe, 2001

- Philosophers
- Psychologists
- Neurophysiologists
- Pathophysiologists
- Neuroscientists
- Roboticists

Beyond **perception**, complex aspects of **cognition** are grounded in sensorimotor interactions

“Red” is knowing the structure of the changes that “red” causes.

e.g.

a system can only truly understand what a sponge is if it can experience the sponginess by squeezing the object and observing the sensory consequences. Having this understanding allows the system to grasp and use the sponge correctly

O'Regan and Noë, “A sensorimotor account of vision and visual consciousness”,  
Behavioral and Brain Sciences, vol. 24, no. 5, pp. 939-1031, 2001.

- constant self-calibration
- tolerance to changes/damages/failures
- adaption to a dynamic & ambiguous environments

some thoughts



- the transition from Computer to Robot Vision most importantly involves a body - **embodiment**
- AI seems to need both **mind & body**  
(just like humans!!)
- **abstraction** is required for “Scene Understanding” (pixels, features, patches, histograms...)
- robots (seeing ones!!) can help understand how **cognition** emerges!!!



- autonomous robots are not mature enough
- learning methods difficult to scale-up to real-world
- *“Give a man a fish and you feed him for a day; teach a man to fish and you feed him for a lifetime.”*
  - > a cognitive system requires rules rather than facts



**Thank you very much!!**

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