



# Experience-dependent Active Vision in an Autonomous Quadruped Robot

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# Goals

- Model bottom-up process of visual attention.
- Incorporate visual attention into a neural model for learning appetitive and aversive objects.
- Develop theories on how neuroplasticity, behavior, and visual attention interact affect learning.



# Background: Bottom-Up

- Primates have ability to interpret complex scenes within fractions of a second
- Itti, Koch, and Niebur propose a modified feature integration theory: saliency map
- In primates, map would be located in posterior parietal cortex and visual maps in pulvinar nuclei of the thalamus



# Background: Bottom-Up

- Inhibition of Return is one method proposed for searching a scene
- Why saliency?
  - Provides simple method for focus of attention
  - Advantageous over exhaustive search: primates find a few interesting targets in milliseconds

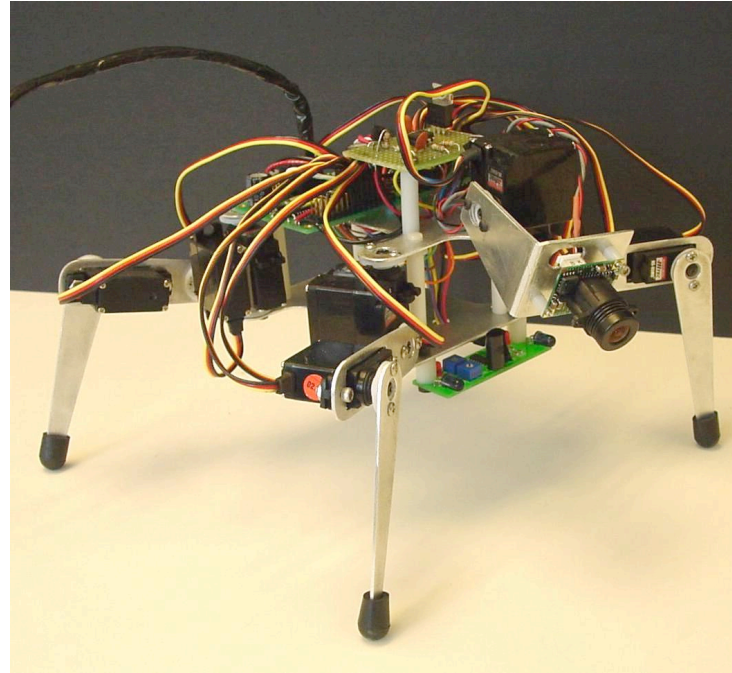


# Background: Top-Down

- Salient targets are processed by Top-Down methods using trained neural networks.
- Much slower than bottom-up



# Platform for Attention

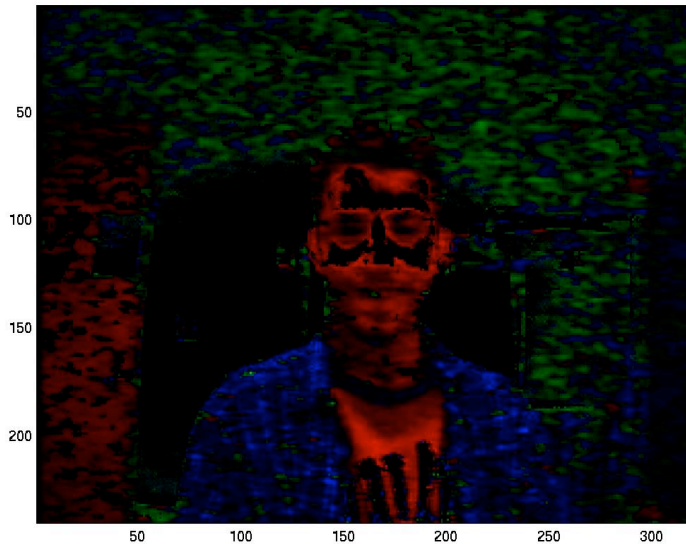


**Strider is a quadruped with a color CCD camera that has two degrees of freedom. The robot is tethered to a computer where all image processing is done in Matlab**



# Strider's Bottom-Up

## Color Feature Map



- Opponent-Colors

$$r' = r_n - (g_n + b_n) / 2$$

$$g' = g_n - (r_n + b_n) / 2$$

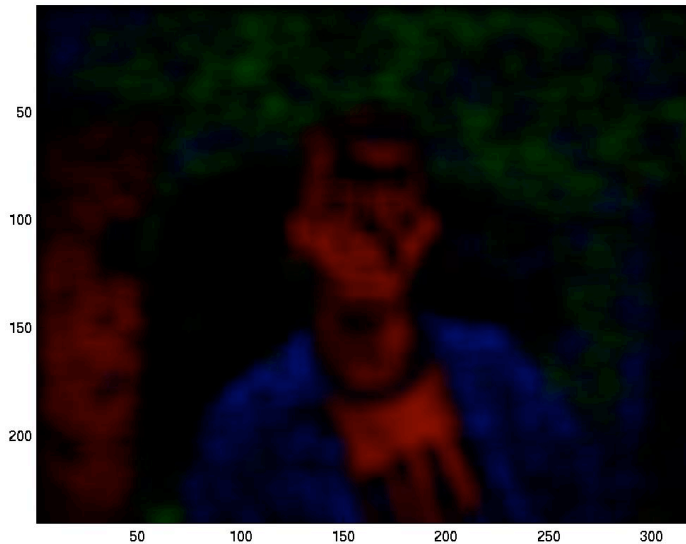
$$b' = b_n - (r_n + g_n) / 2$$

$$y' = (r_n + g_n) / 2 - b_n - ||r_n - b_n||$$



# Strider's Bottom-Up

## Color Feature Map



- Smoothing
- 11x11 pixel smoothing matrix
- Removes pixel noise





# Strider's Bottom-Up

## Orientation Feature Map

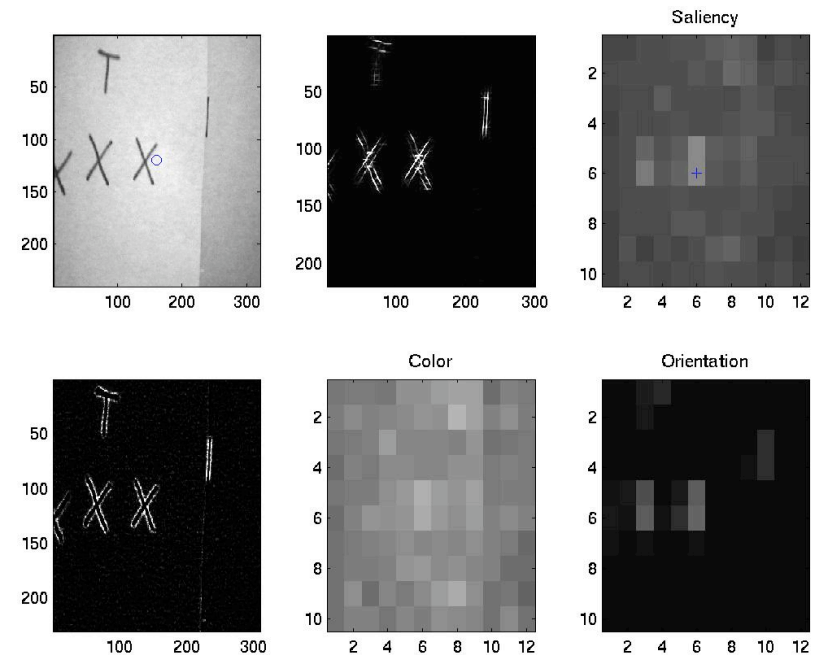
- Gaussian filter used to detect edges in  $n$  orientations.
- Biological analog to edge detection is the lateral geniculate nucleus.



# Strider's Bottom-Up

## Feature Maps & Saliency Map

Images undergo their respective filter and then are fit to 10x12 grayscale feature maps. The saliency map is created by adding the weighted values of each feature map.





# Behavior: Walking

- Gait is based on biological quadrupeds providing Strider with a biomimetic touch.
- A sinusoidal function controls the gait.
- Parameters of amplitude and frequency make it possible for Strider to gallop or stride, walk or run, and veer left and right.



# Behavior: Tasting

- As Strider approaches an object, gait becomes smaller yielding cautious behavior.
- By positioning its head directly down, Strider indicates that it has tasted salient object.



# Neuromodulation

- Strider's model for learning involves the use of catecholamines.
- Dopamine is theorized to play an important role in learning, specifically the time during learning at which dopamine is released.
- Strider's model is an abstraction of the midbrain neuronal cluster.



# Neuromodulation

- Approaching an object for the first time, Strider `tastes' and associates the features of the object with either an appetitive or aversive object (if dopamine is released at the appropriate interval).
- Subsequent trials yield that learning has taken place when, simply upon seeing a salient object, Strider classifies the object as appetitive or aversive and behaves.



# Behavioral Inquiries

- Now that all of the components are in place, how is the relationship between all of the components relevant to learning?
- What modifications can be done to test the reliability of the models (e.g. add distracting background to objects)?
- In what ways does the quadruped model differ from Khepera; what does that tell us about the relevance of anatomical structure (i.e. body)?



# Summary

- Saliency is a model for instantaneously determining interesting objects in a scene.
- Strider incorporates a biologically-based model for walking and visual attention using saliency.
- Current studies are being done to determine the relation between learning and visual attention, neuroplasticity, and behavior.





The End...



... of the beginning.