

# Towards Active Image Segmentation: the Foveal Bounded Irregular Pyramid



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- Introduction
- Cartesian Foveal Geometries. Foveal polygon
- Foveal representation using the Bounded Irregular Pyramid
- Segmentation and visual attention
- Experimental results
- Future work



- **Introduction**
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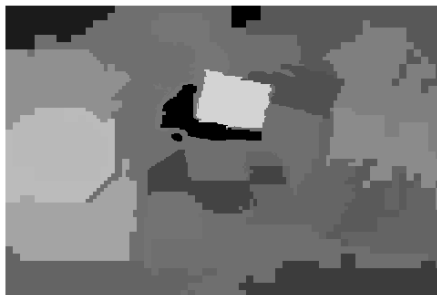
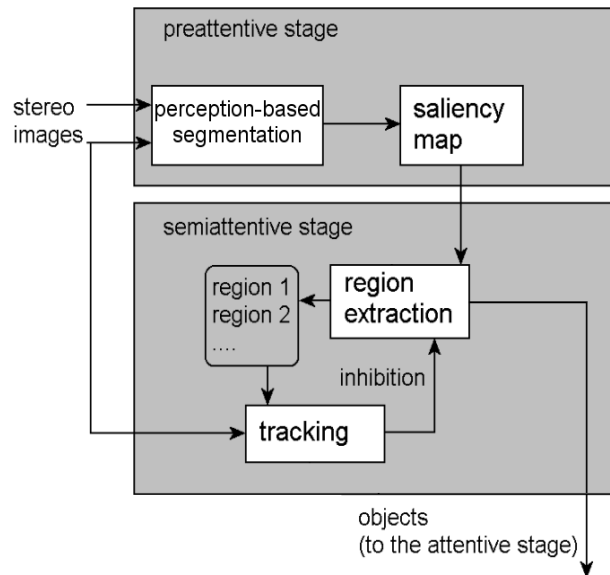


- **Segmentation** in computer vision is the process to divide up an image into non-overlapping and compact regions.
- **Perceptual segmentation** approaches try to divide up the image into pre-attentive objects (proto-objects) in the same way that a human does.

• **Problems:**

- The accuracy of a segmentation depends on the application
- What are we looking for in the image?  
What is the object of interest?

**Attention** provides the object of interest



Saliency map

- In biological vision systems, **attention** pre-selects relevant information from the sensed field of view.

- In computer vision, **attention mechanisms** extract the relevant information from an image by computing **saliency maps**.

- Problems:

- Most artificial systems works at pixel resolution



**Segmentation** provides the proto-objects as the units where the attention is deployed

**Segmentation** can be modulated by attention.



## Introduction: goals of the presented work

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Reduce the computational load associated to the segmentation process:



- Resembling the spatial geometry of the images captured by the human retina: capturing only the region of interest at high resolution (fovea) while the rest of the scene is captured at lower resolution (periphery).

### FOVEAL VISION

- Performing foveal segmentation

### FOVEAL BOUNDED IRREGULAR PYRAMID



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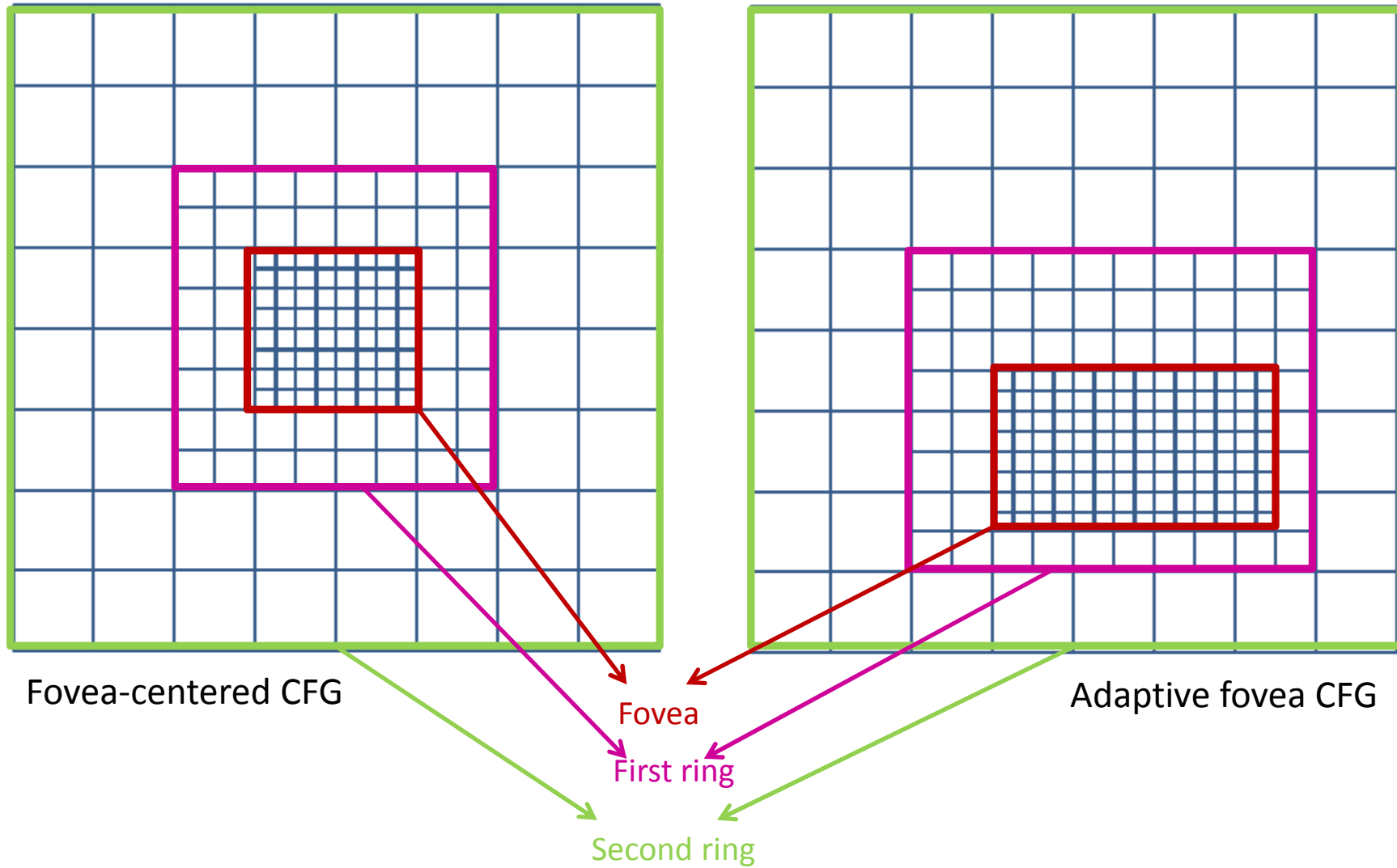


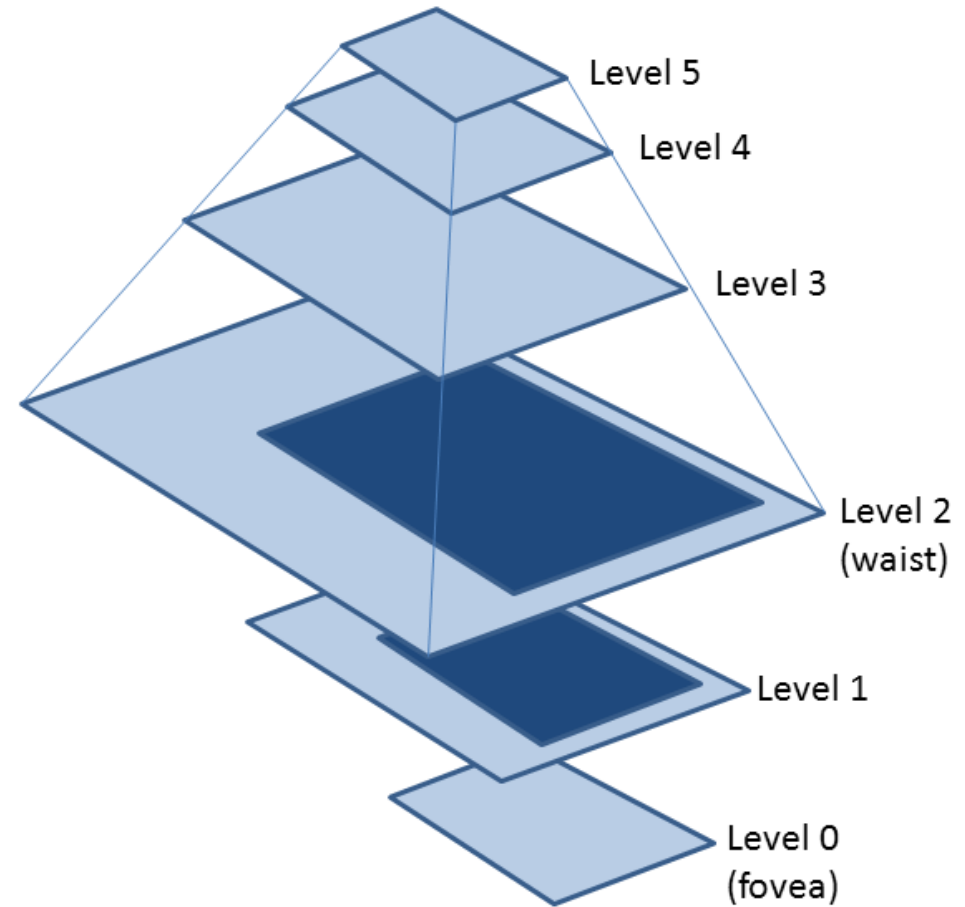
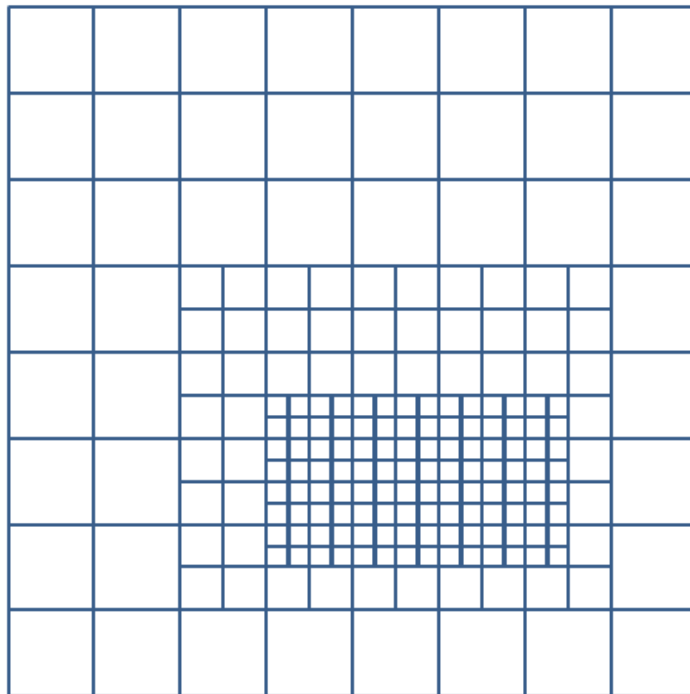
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## Cartesian Foveal Geometries (CFG)







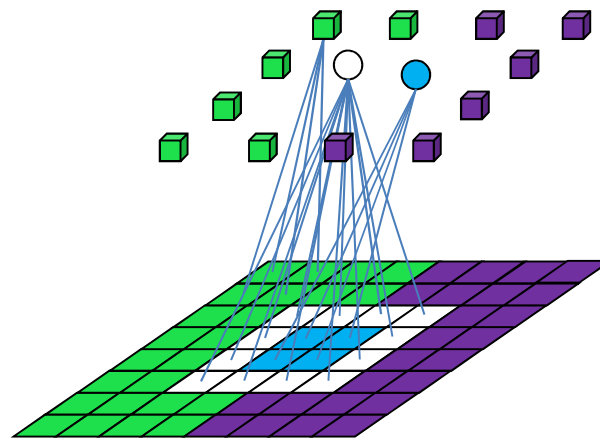
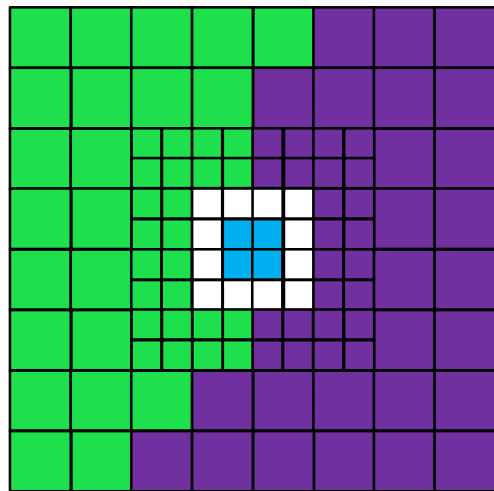
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## Foveal Bounded Irregular Pyramid

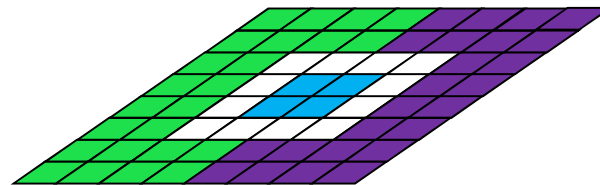
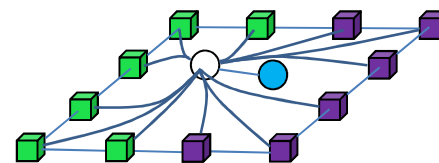
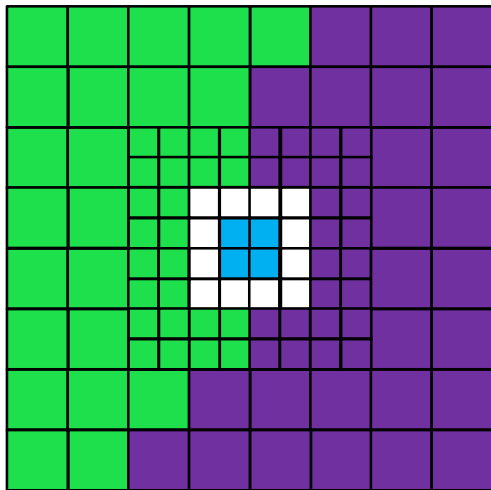


Level 0 - Fovea

R. Marfil and A. Bandera, Comparison of perceptual grouping criteria within an integrated hierarchical framework, *Lecture Notes in Computer Science*, 5534, 366-375, 2009.



## Foveal Bounded Irregular Pyramid

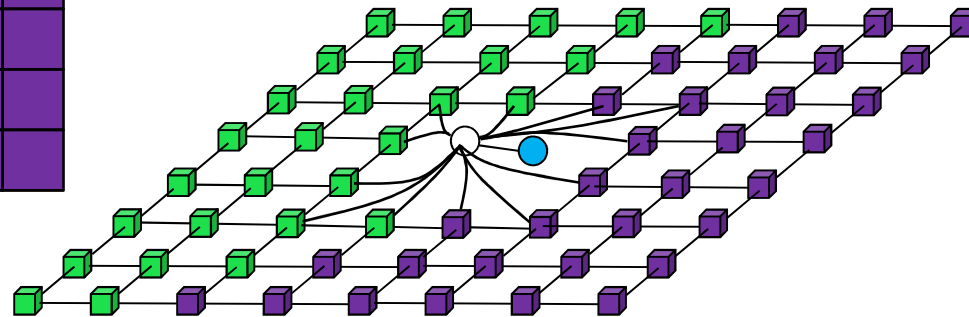
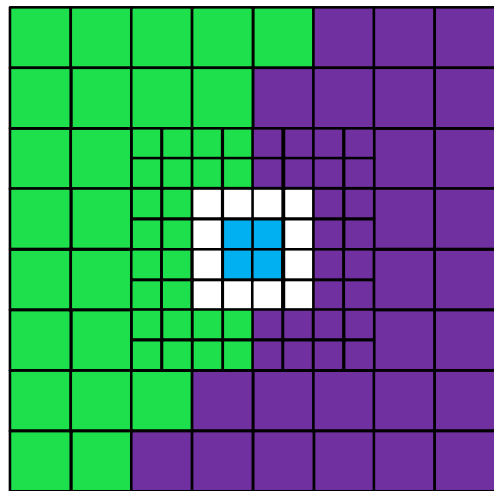


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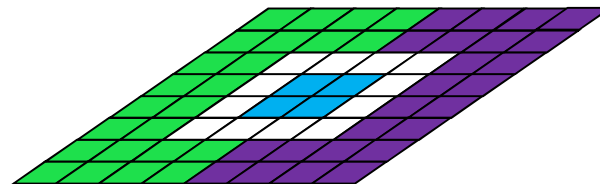
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## Foveal Bounded Irregular Pyramid



Level 1 - Waist

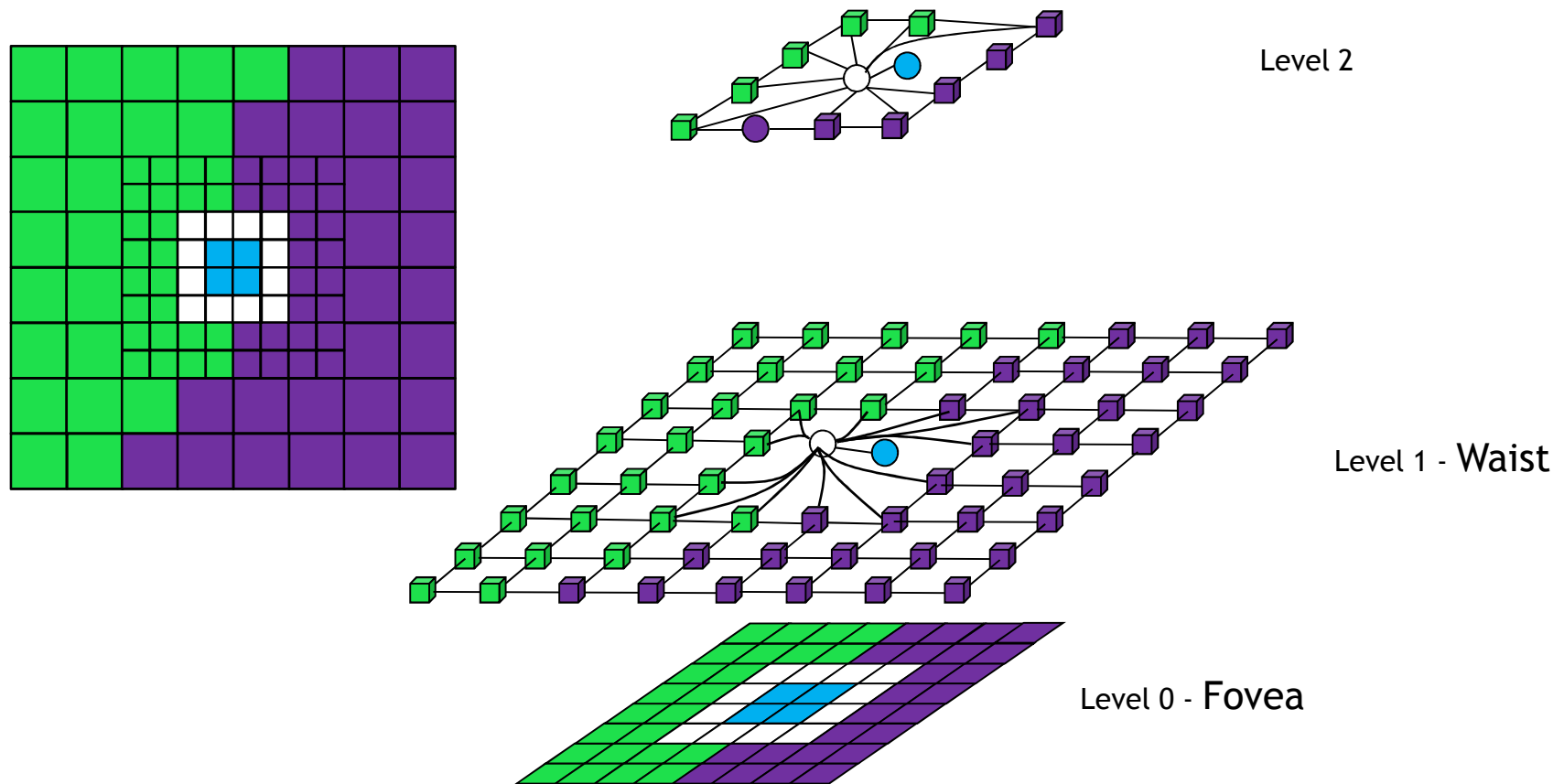


Level 0 - Fovea

R. Marfil and A. Bandera, Comparison of perceptual grouping criteria within an integrated hierarchical framework, *Lecture Notes in Computer Science*, 5534, 366-375, 2009.



## Foveal Bounded Irregular Pyramid

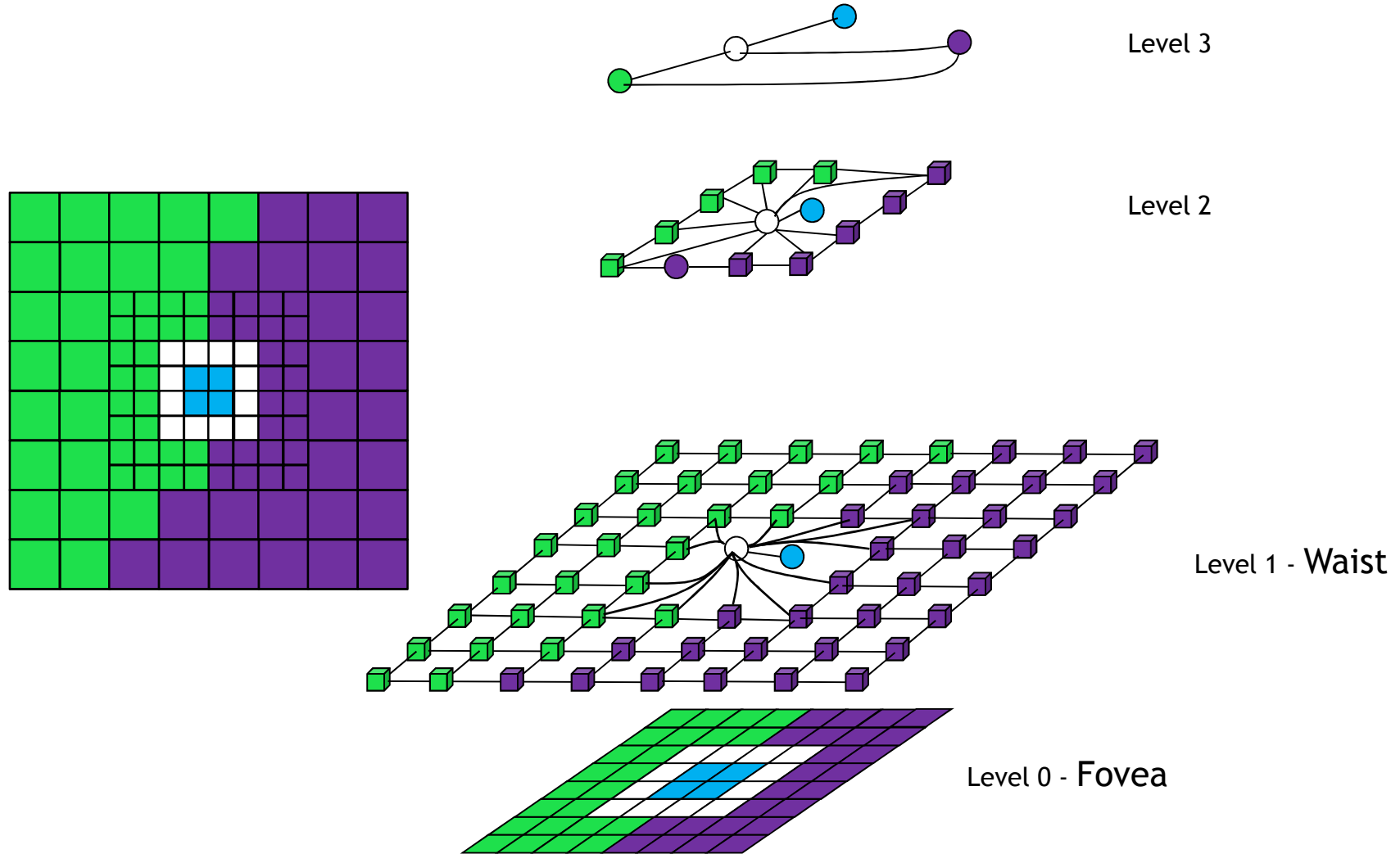


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# Foveal Bounded Irregular Pyramid



R. Marfil and A. Bandera, Comparison of perceptual grouping criteria within an integrated hierarchical framework, *Lecture Notes in Computer Science*, 5534, 366-375, 2009.



1. Levels from  $l_0$  to  $l_m$  with  $l < \textit{waist}$  are built using color information:  
Distance between to nodes  $x_i$  and  $x_j$ :

$$\psi^\beta = \sqrt{(L_{x_i^{(l)}} - L_{x_j^{(l)}})^2 + \beta(a_{x_i^{(l)}} - a_{x_j^{(l)}})^2 + \beta(b_{x_i^{(l)}} - b_{x_j^{(l)}})^2}$$

2. Levels  $l > \textit{waist}$  are built using color and edge information:  
Distance between to nodes  $y_i$  and  $y_j$ :

$$\varphi^\alpha(y_i^{(l)}, y_j^{(l)}) = \frac{d(y_i^{(l)}, y_j^{(l)}) \cdot \min(b_{y_i^{(l)}}, b_{y_j^{(l)}})}{\alpha \cdot c_{y_i^{(l)} y_j^{(l)}} + (b_{y_i^{(l)} y_j^{(l)}} - c_{y_i^{(l)} y_j^{(l)}})}$$

Colour distance (points to  $d(y_i^{(l)}, y_j^{(l)})$ )  
Canny (points to  $c_{y_i^{(l)} y_j^{(l)}}$ )  
Common boundary between regions (points to  $b_{y_i^{(l)} y_j^{(l)}} - c_{y_i^{(l)} y_j^{(l)}}$ )  
Boundary (points to  $\min(b_{y_i^{(l)}}, b_{y_j^{(l)}})$ )



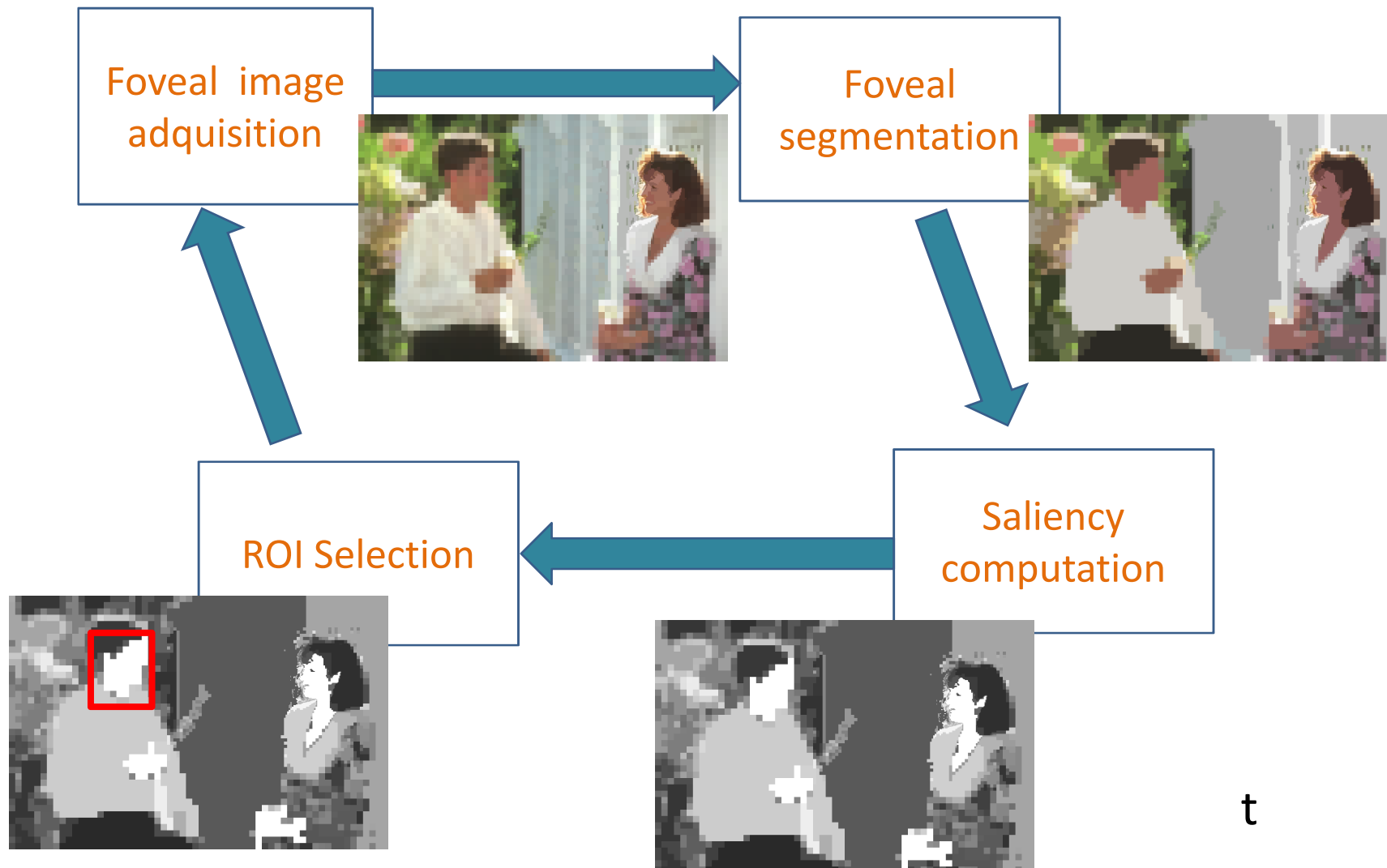
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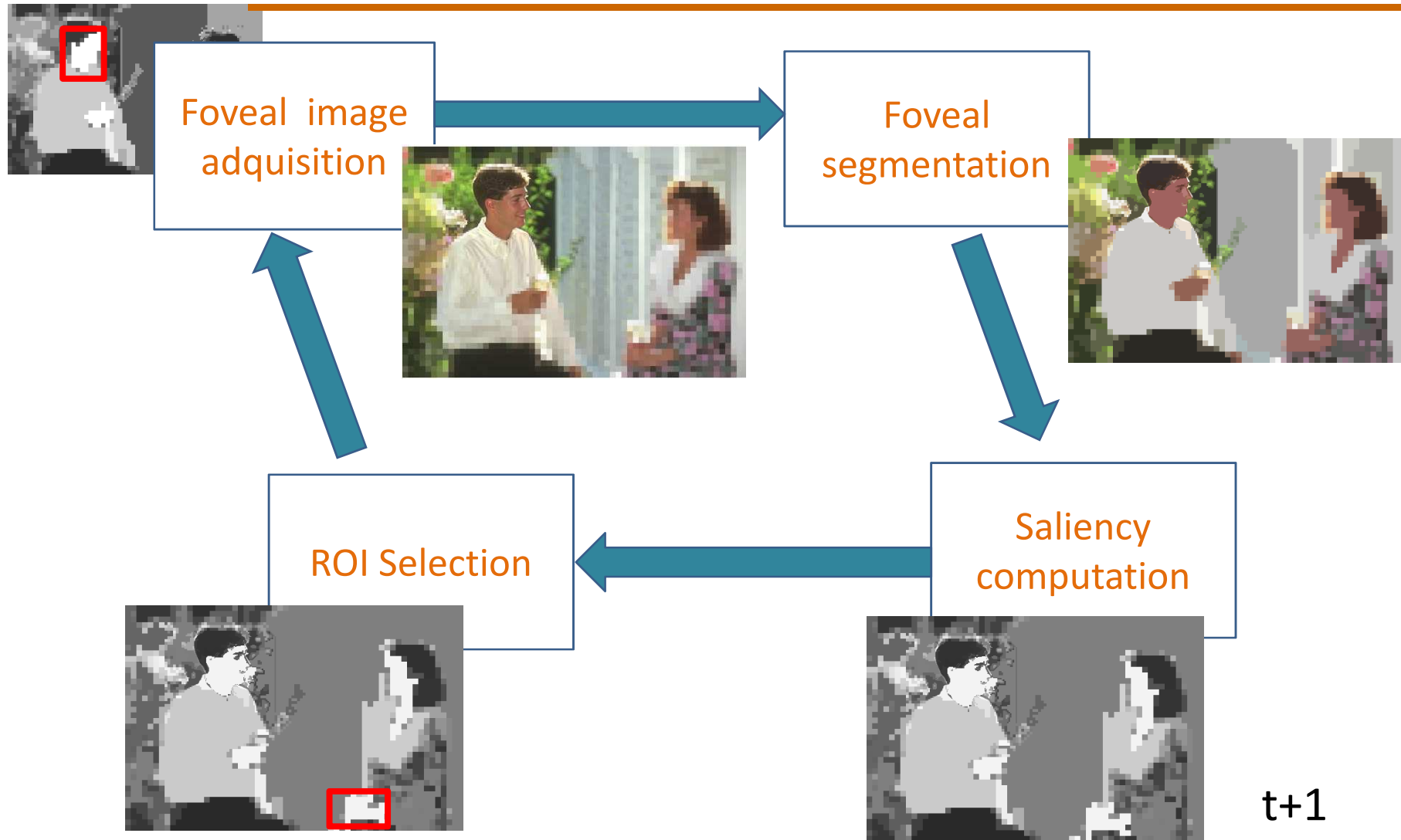


# Segmentation and visual attention





# Segmentation and visual attention



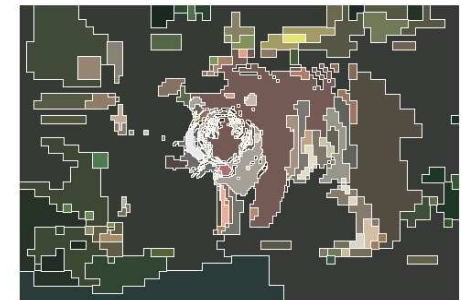
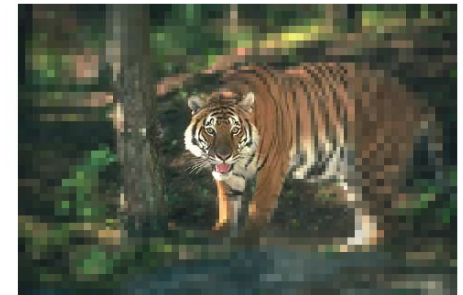


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- Bounded Irregular Pyramid with dual graph
  - Evaluation with the attention mechanism presented in:

R. Marfil, A. Bandera, J.A. Rodríguez y F. Sandoval, A novel hierarchical framework for object-based visual attention, *Lecture notes in Computer Science*, 5395, 27-40, 2009.

A. J. Palomino, R. Marfil , J.P. Bandera and A. Bandera, A novel biologically inspired attention mechanism for a social robot, *EURASIP Journal on Advances in Signal Processing*, vol. 2011.

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Thanks!  
Any questions?



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