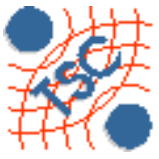


# From Partition Trees to Semantic Trees

**Xavier Giró and Ferran Marqués**

Image Processing Group  
Signal & Communications Department  
Technical university of Catalonia (UPC)

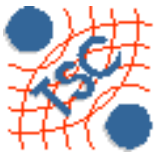




# Outline

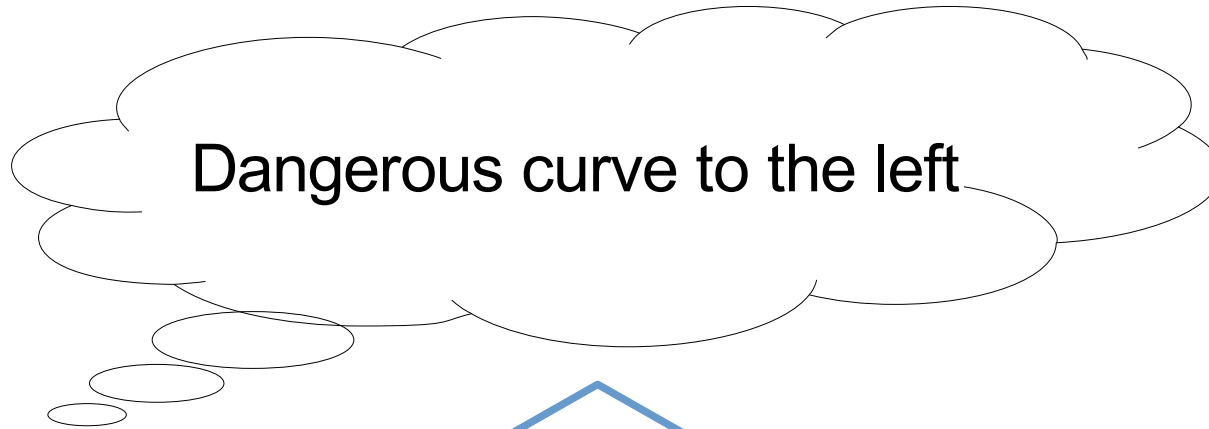
1. Introduction ←
2. Image representation
3. Semantics representation
4. Detection algorithm
5. Undirected detection
6. Examples
7. Conclusions



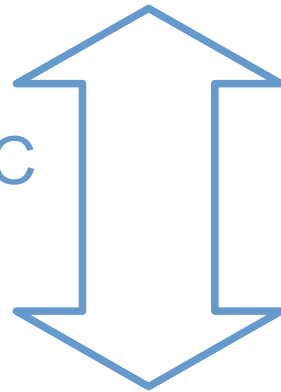


# Introduction

- Bridge the semantic gap



SEMANTIC  
GAP



Semantics

Perceptual  
information  
(visual)

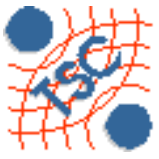




# Outline

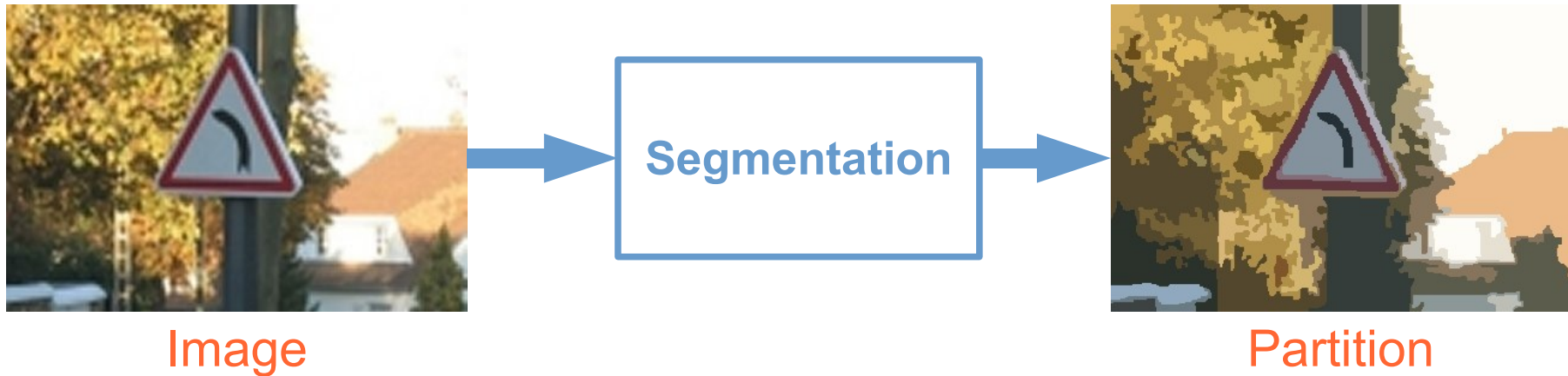
1. Introduction
2. Image representation ←
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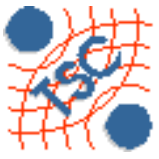
# Image representation

- Colour-based segmentation [5]



[5] P.Salembier and F.Marqués, "Region-based representations of image and video: segmentation tools for multimedia services", IEEE Trans. Circuits and Systems for Video Technology (1999).





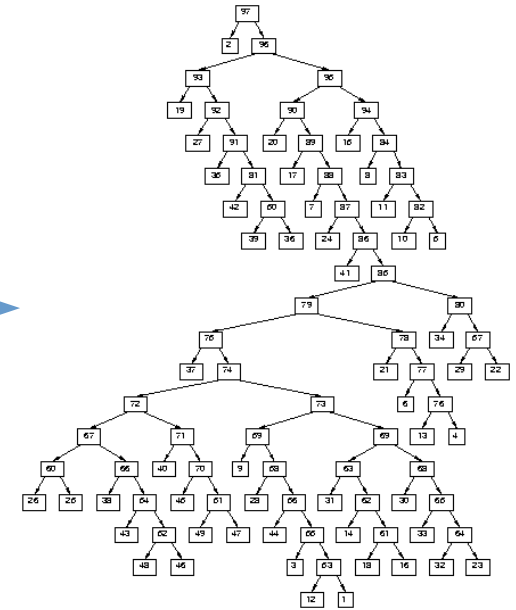
# Image representation

## Binary Partition Tree [6]



Partition

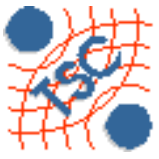
BPT creation



BPT

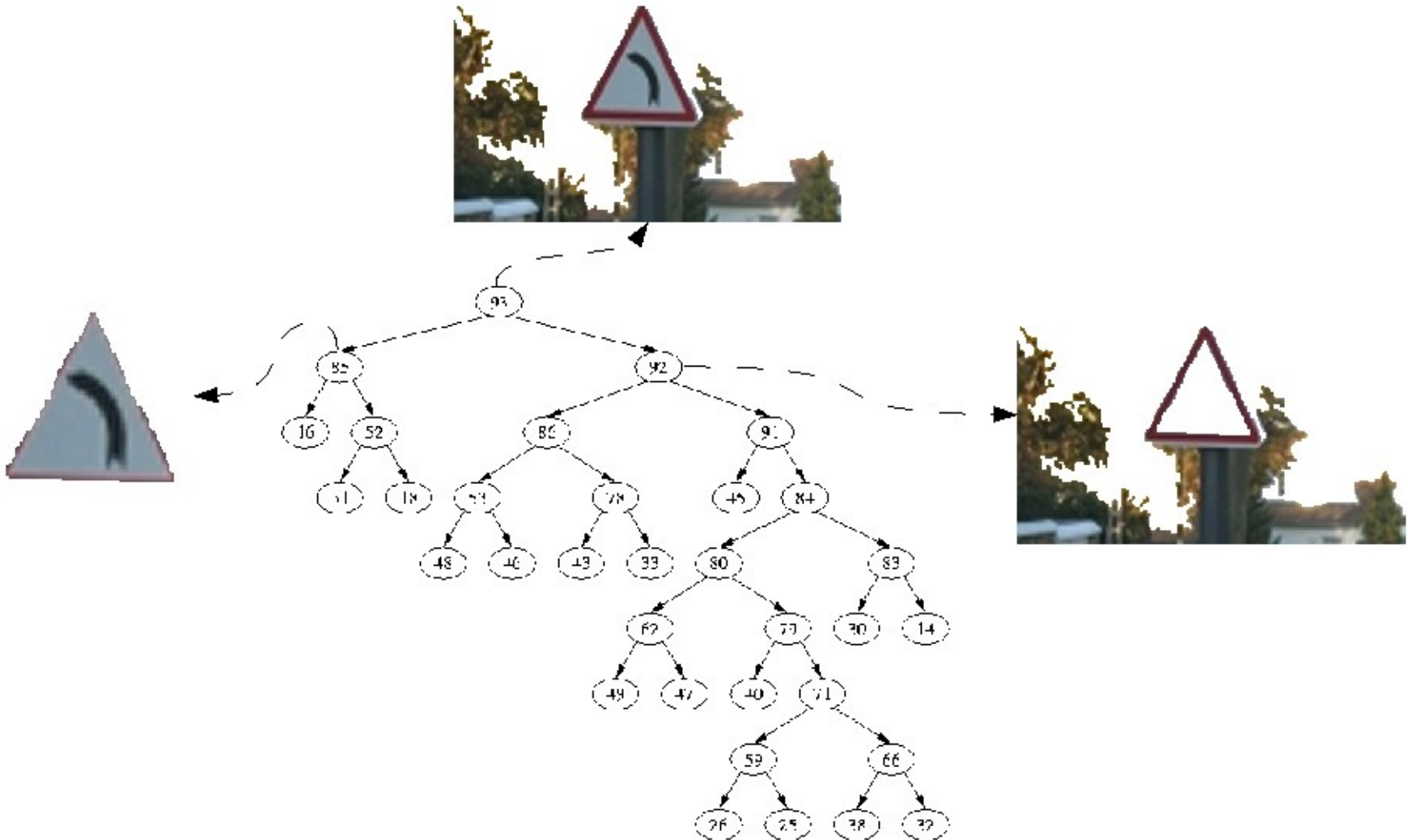
[6] P.Salembier and L.Garrido, "Binary Partition Tree as an efficient representation for image processing, segmentation and information retrieval", IEEE Trans. On Image Processing (2000).

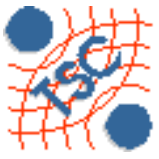




# Image representation

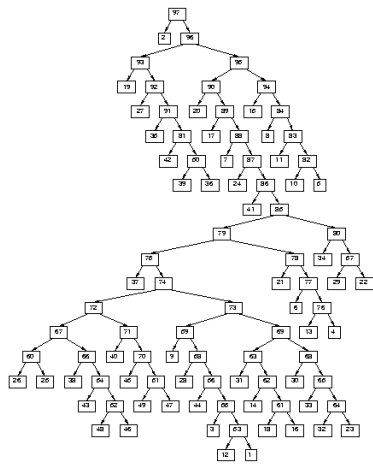
Example: Colour-based BPT



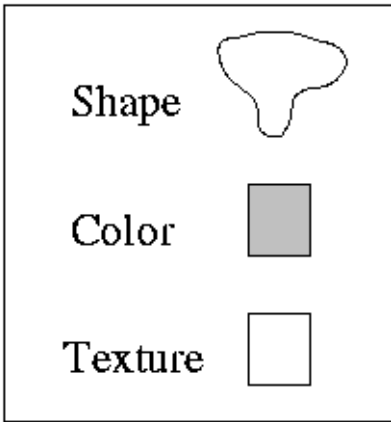


# Image representation

- Visual descriptors for each BPT node [7]



BPT

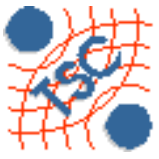


Visual Descriptors

[7] V.Vilaplana et al, "Region-based extraction and analysis of visual objects information", CBMI, Riga, Latvia (2005).







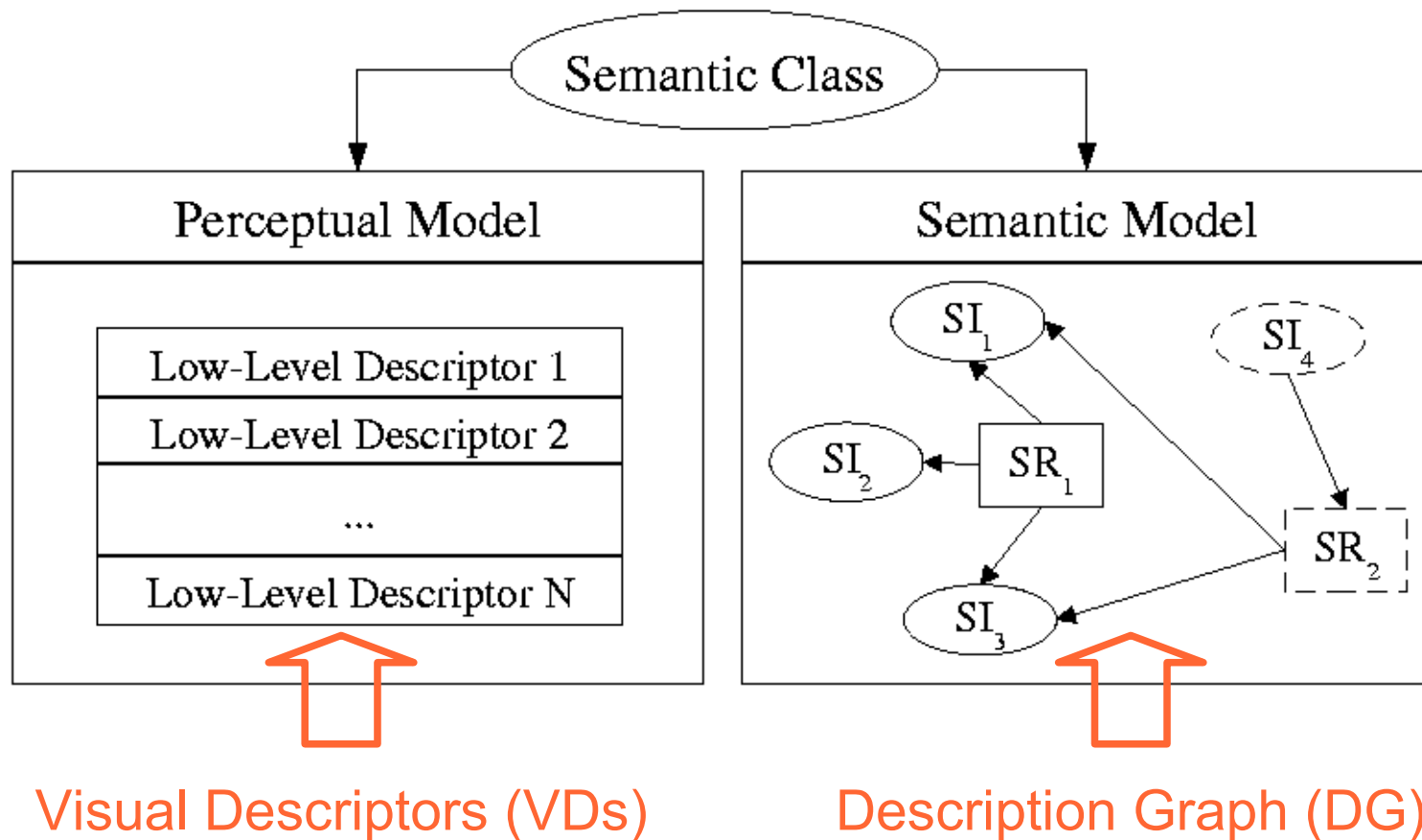
# Outline

1. Introduction
2. Image representation
3. **Semantics representation** ←
4. Detection algorithm
5. Undirected detection
6. Examples
7. Conclusions



# Semantics representation

- Dual model (perceptual and semantic) of Semantic Classes

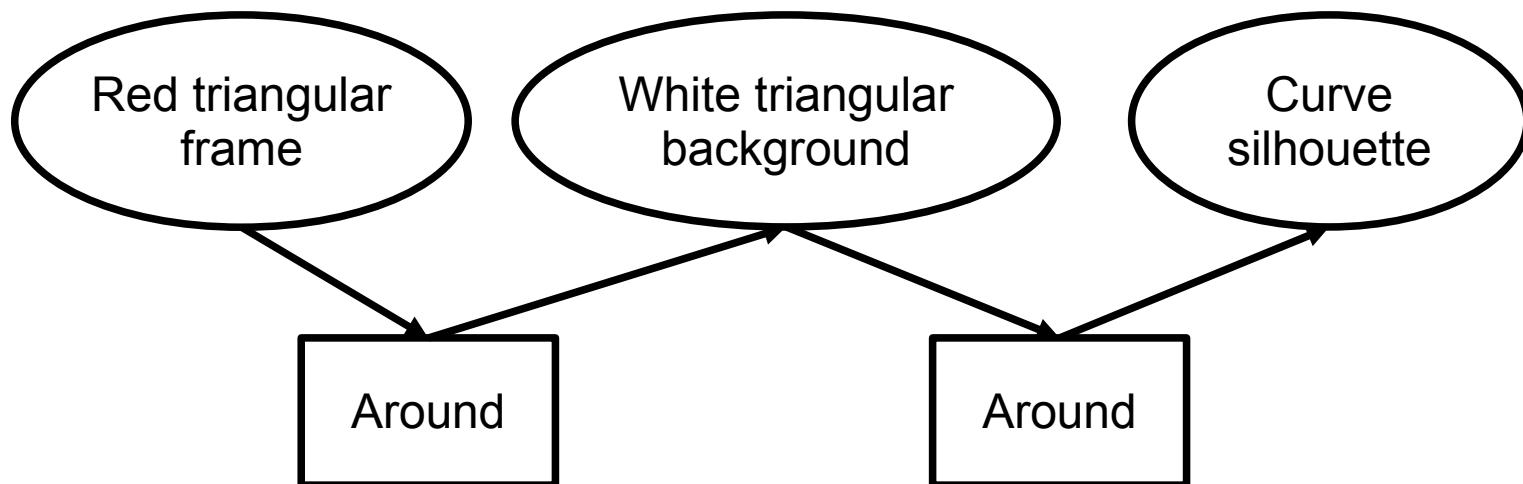




# Semantics representation

- Semantic model with Description Graph [9].
- A Description Graph (DG) models a semantic class by assigning semantic instances and their Relations to its vertices.

Example: DG of the semantic class “Curve traffic sign”

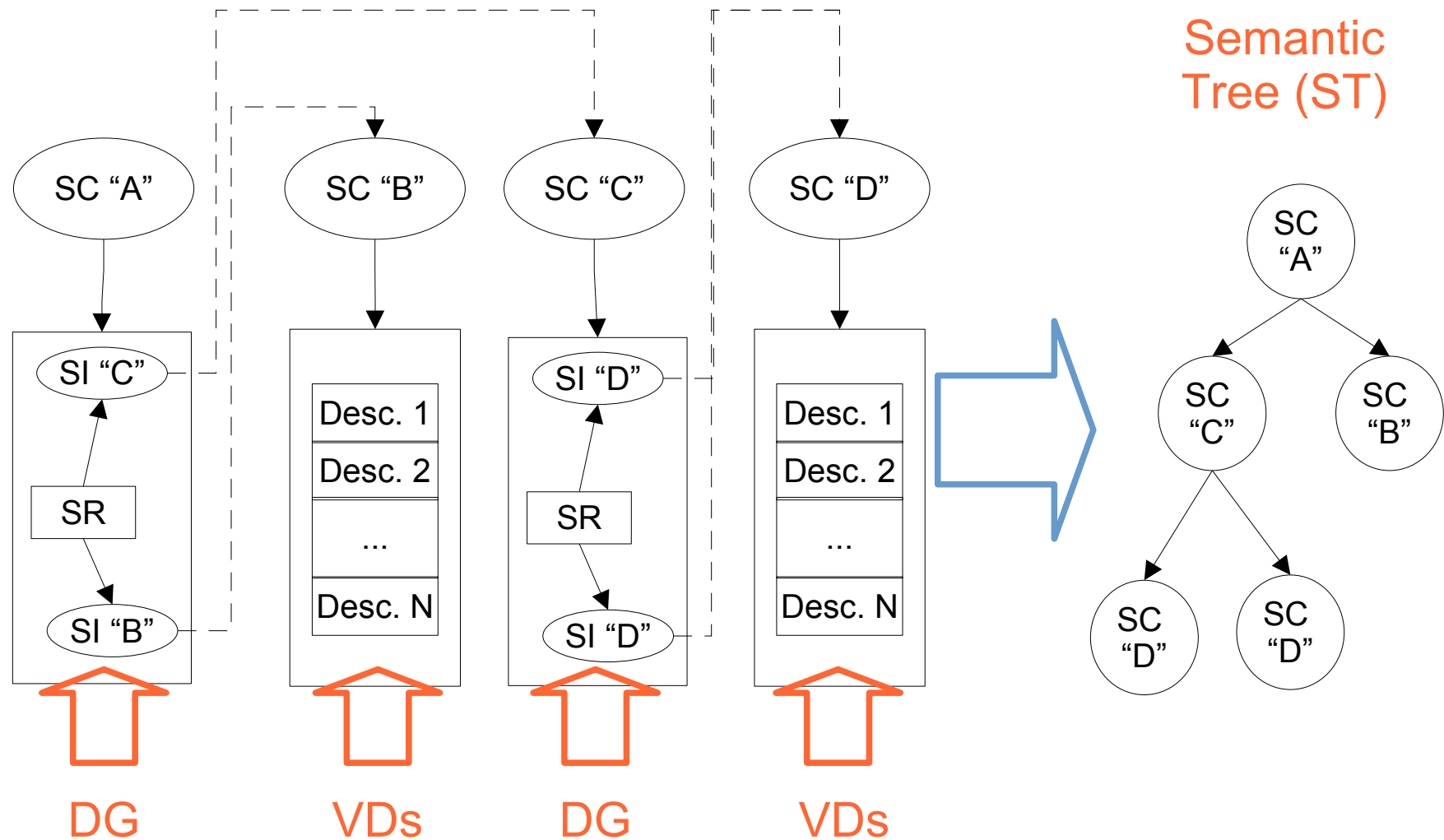


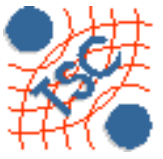
[9] X.Giró and F.Marqués, “Detection of semantic objects using Description Graphs”, ICIP, Genoa, Italy (2005).



# Semantics representation

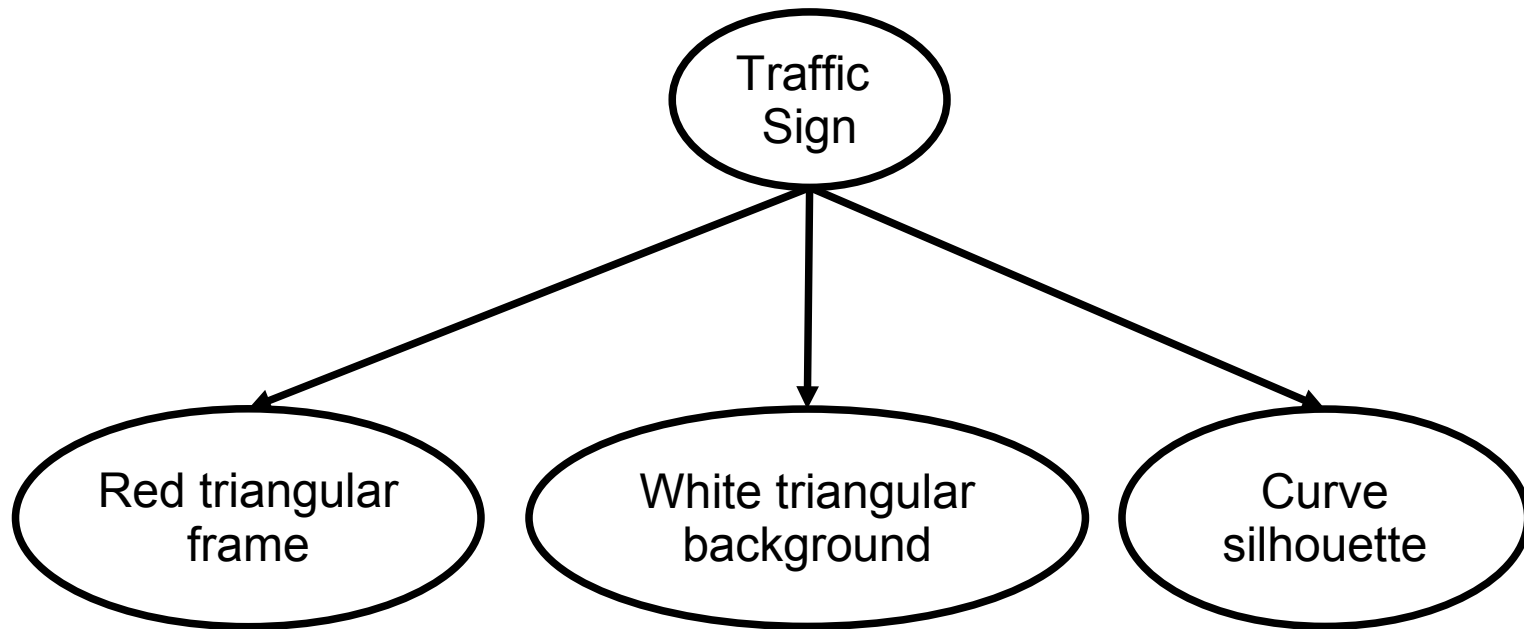
- Hierarchical decomposition in Semantic Trees (STs)





# Semantics representation

Example: ST of the semantic class “Curve traffic sign”

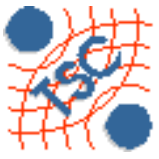




# Outline

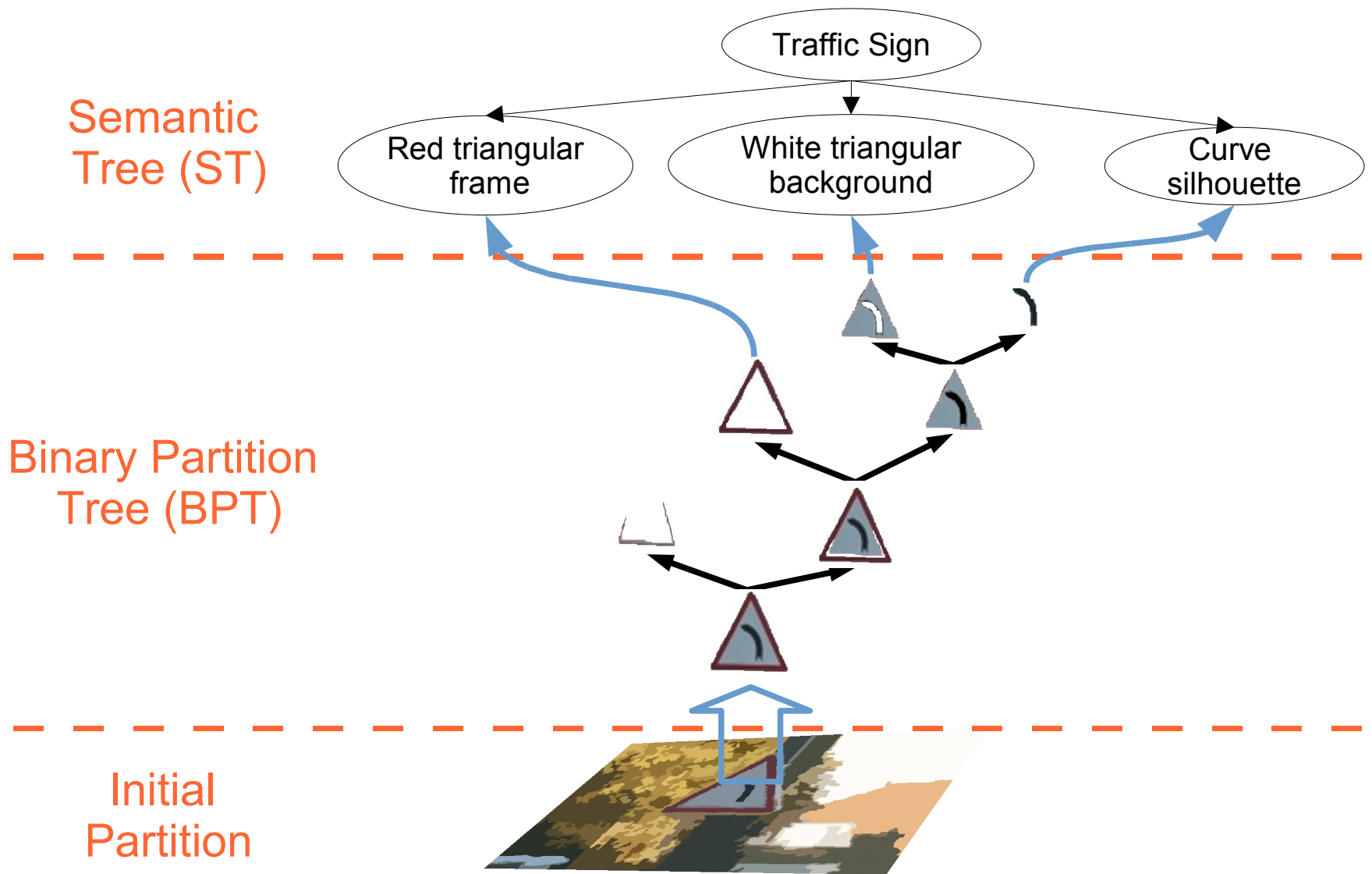
1. Introduction
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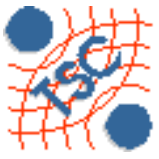




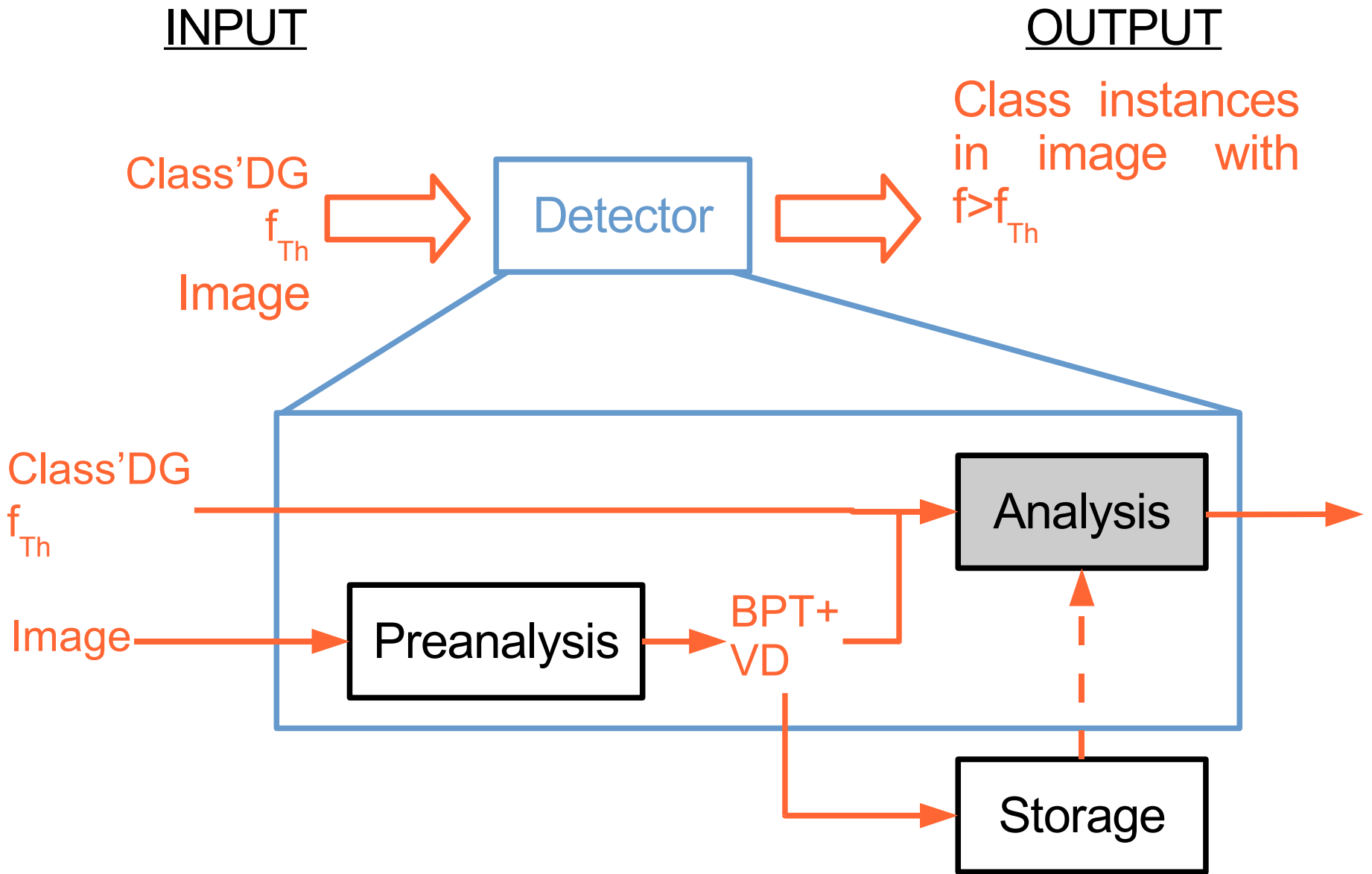
# Detection algorithm

- Detection of a given semantic class (**top-down approach**).
- Detection problem → Building a ST on a BPT.



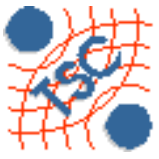


# Detection algorithm



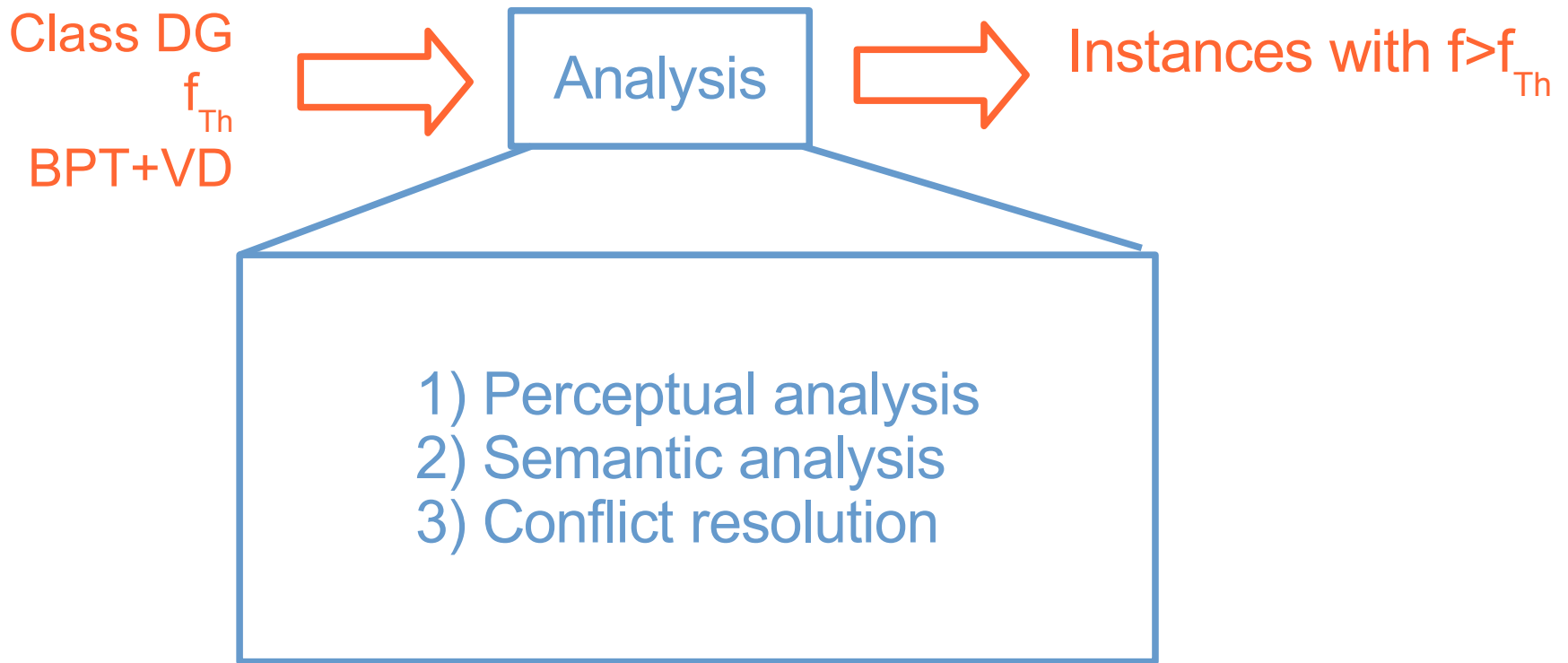
- Preanalysis is a generic and costly step.



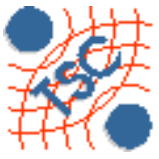


# Detection algorithm

- Analysis is decomposed in 3 basic steps.



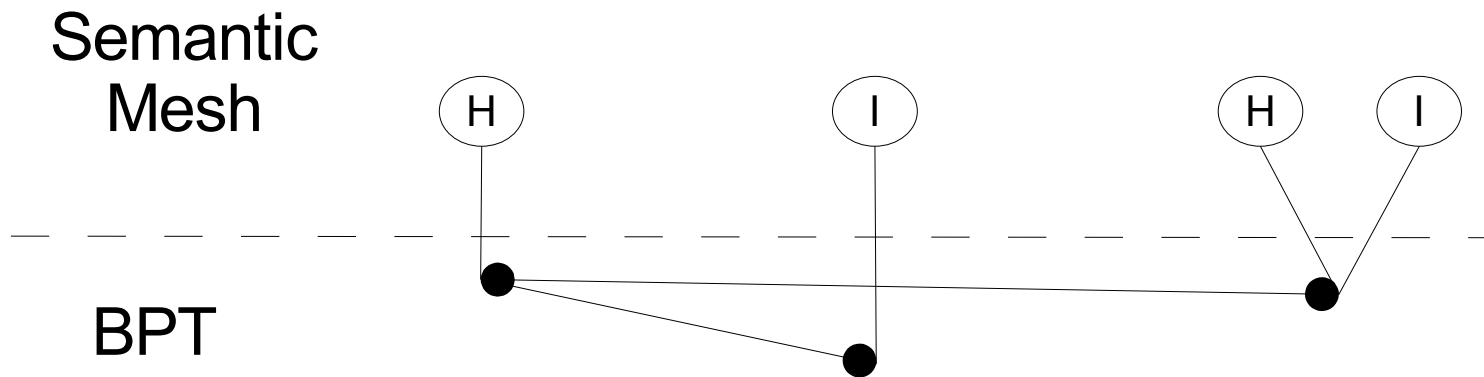
- Only instances composed by BPT nodes can be detected.



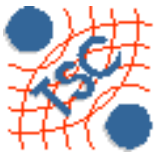
# Detection algorithm

## 1) Perceptual Analysis

Example: Detection of classes “H” and “I” based on their perceptual models



- based on VD similarity
- class-specific detectors may also be used (eg. face).



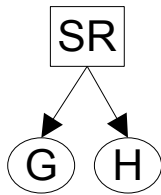
# Detection algorithm

## 2) Semantic Analysis

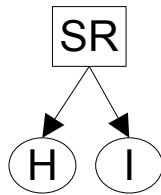
- Top-down semantic expansion

Example: Detection of class “E” based on its semantic model

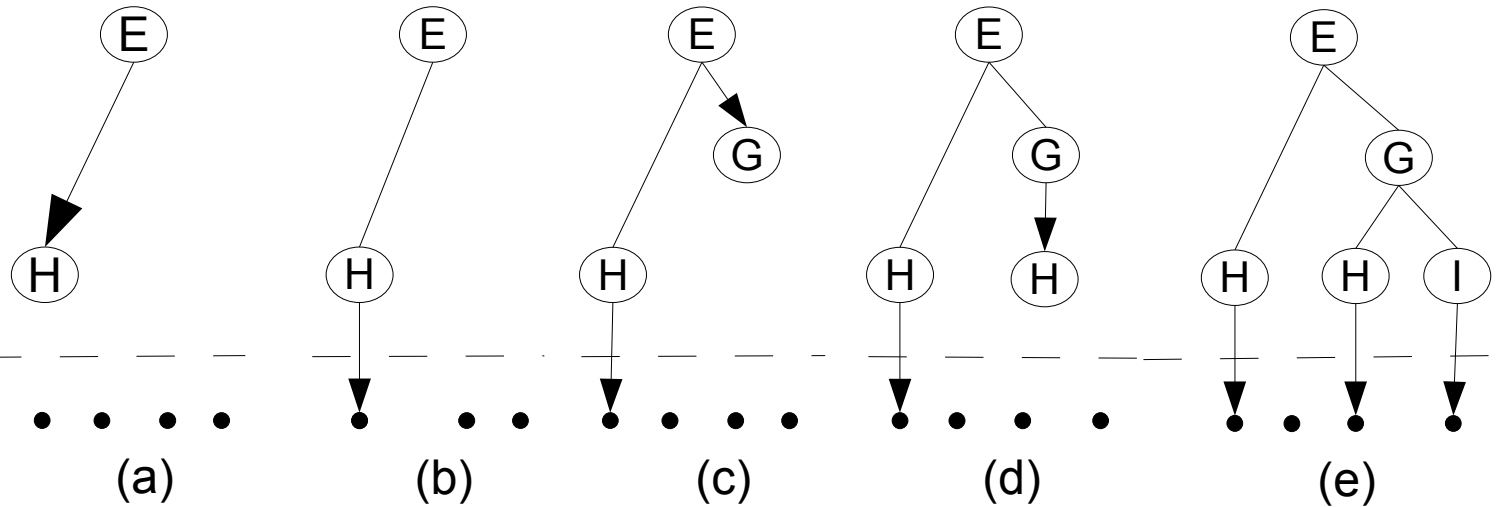
class “E” DG

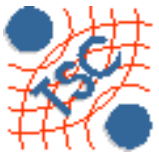


class “G” DG



Semantic Mesh





# Detection algorithm

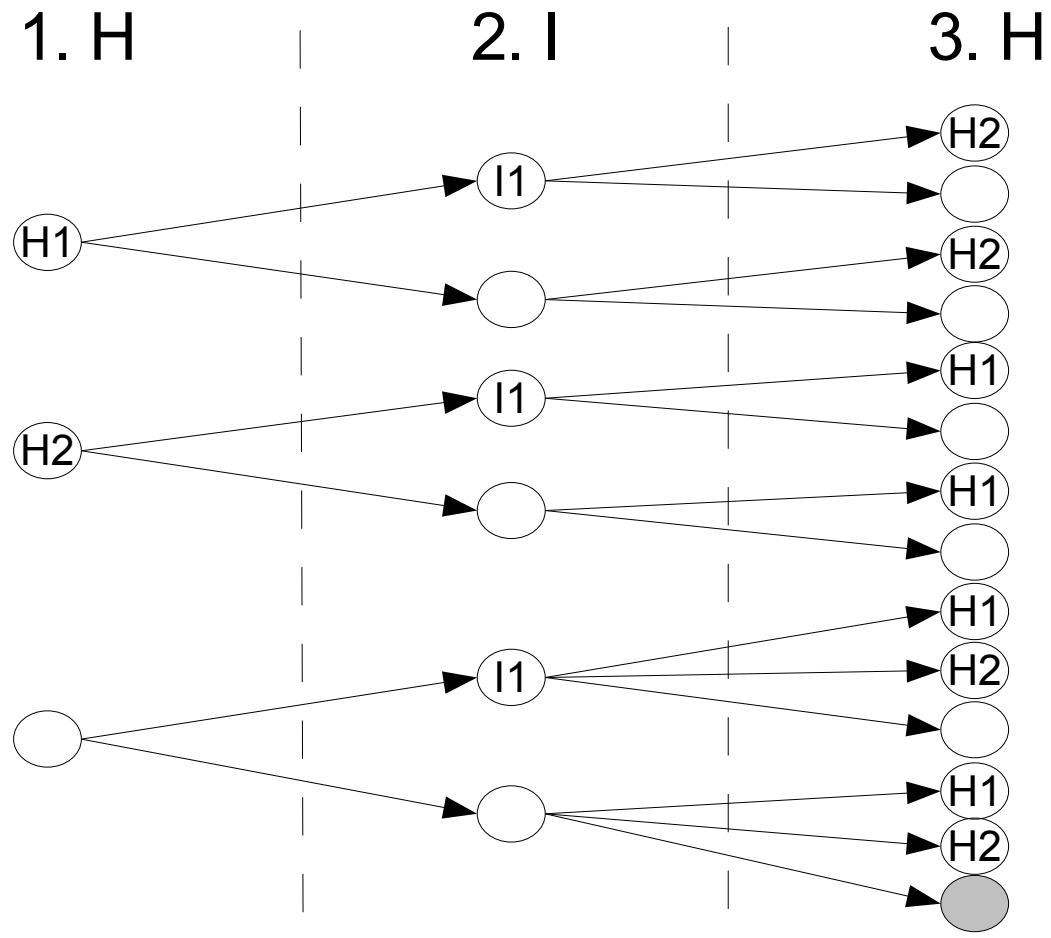
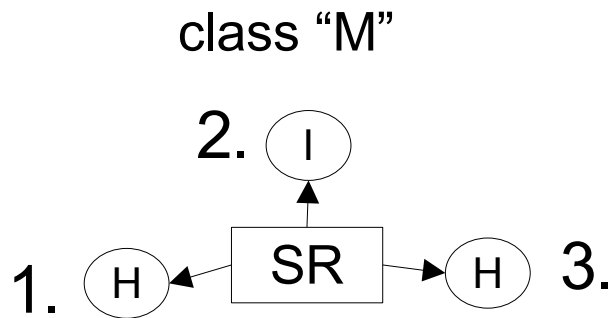
## 2) Semantic Analysis

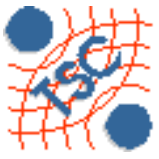
- Graph matching between DG nodes and ST nodes in the mesh.

Semantic Mesh



Description Graph





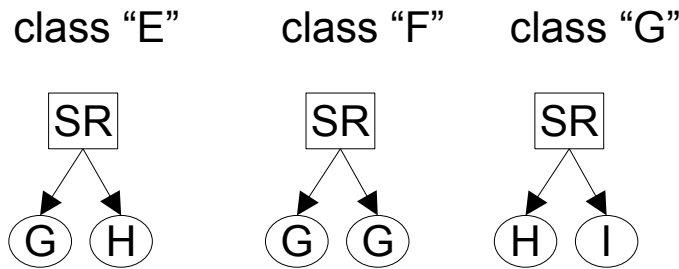
# Detection algorithm

## 2) Semantic Analysis

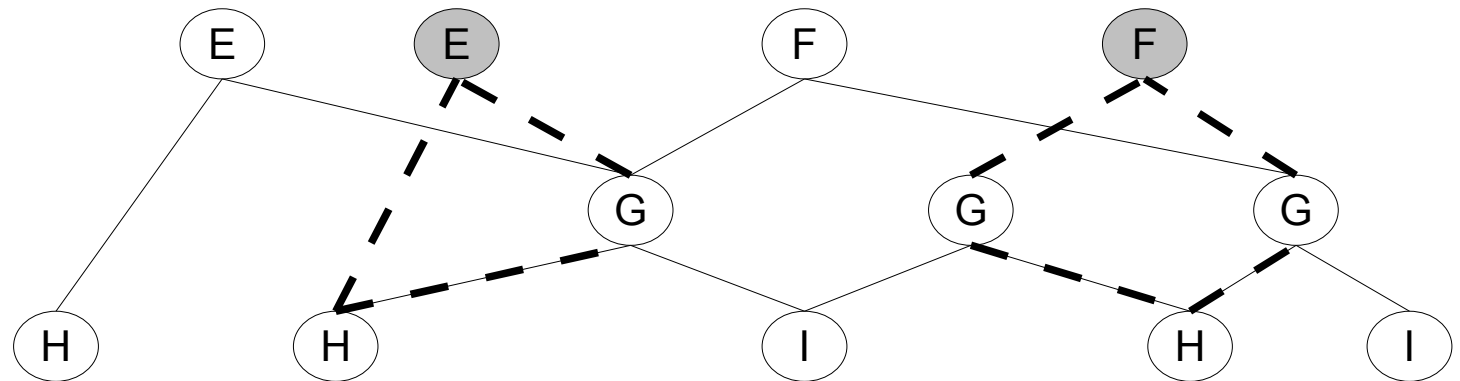
- Discard matchings that create cycles through the Mesh.
- A cycle is created when a single instance is multiply considered in the same higher semantic instance (eg. one shoe as part of two different legs for the same person).

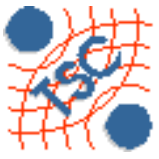
Example: Refusal of two nodes (in grey)

Description  
Graphs



Semantic  
Mesh



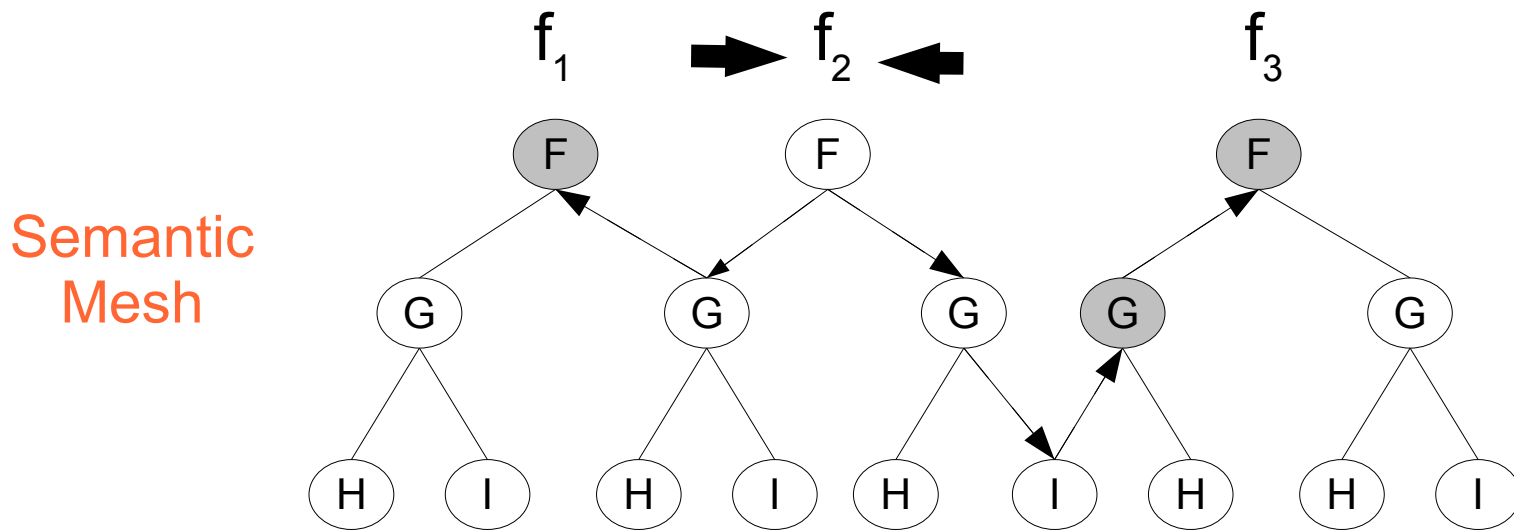


# Detection algorithm

## 3) Conflict resolution

- Each ST node can only sustain one ST node.
- Otherwise, one single instance would be part of more than one higher semantic instance (eg. 1 mouth for 2 faces)
- Keep the highest and most confident node if conflict.

Example: Conflict resolution among three potential instances of class "F".

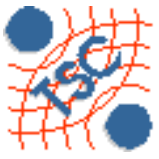




# Outline

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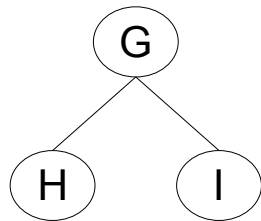


# Undirected detection

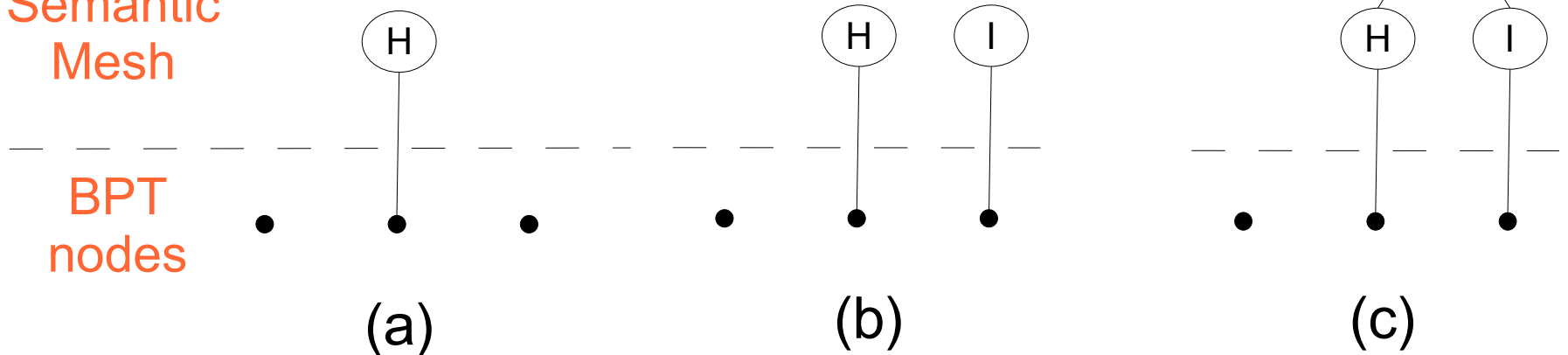
- If no previous knowledge about which class to detect, an exhaustive perceptual analysis with all models in the database may launch a bottom-up semantic expansion.

Example: Undirected detection of class “G”

Semantic Tree



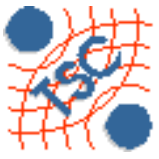
Semantic Mesh



BPT nodes





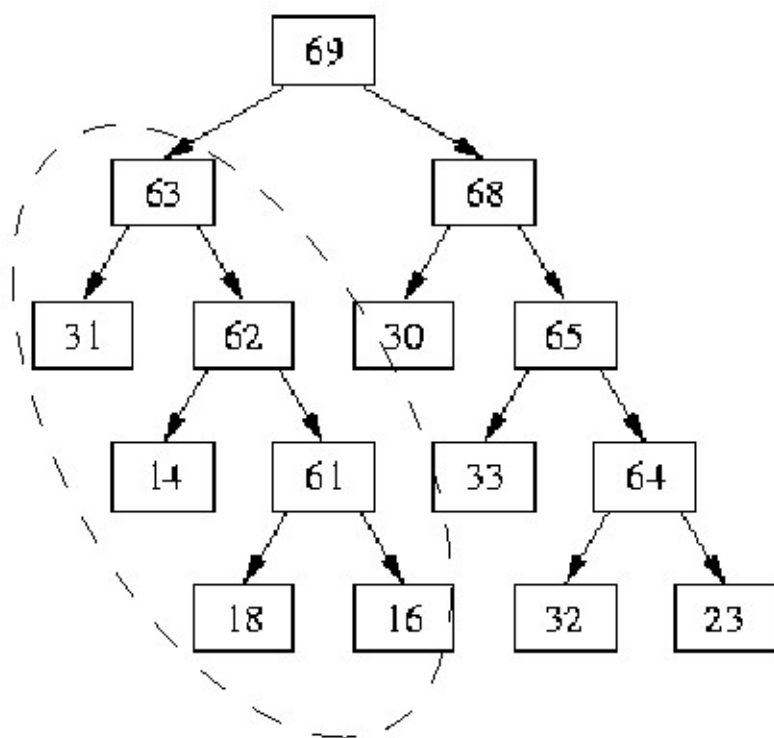


# Outline

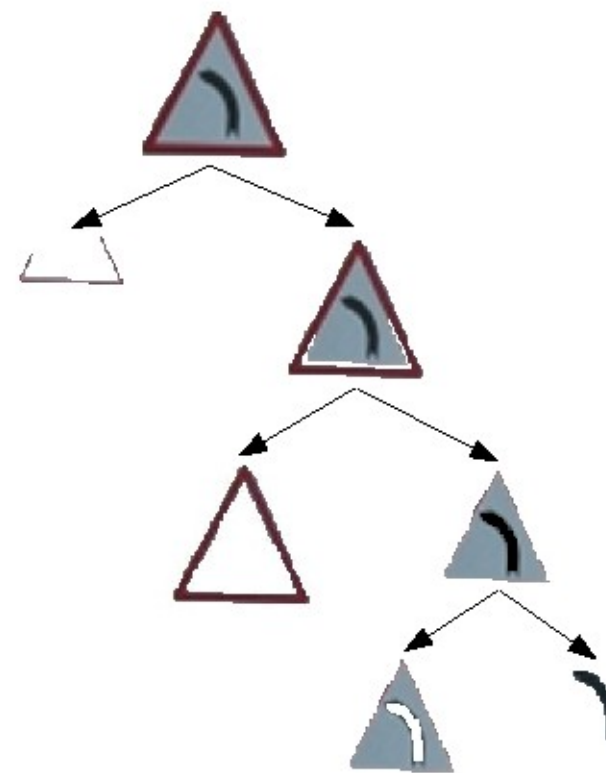
1. Introduction
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Example: Syntactic-based BPT [15]



(a)

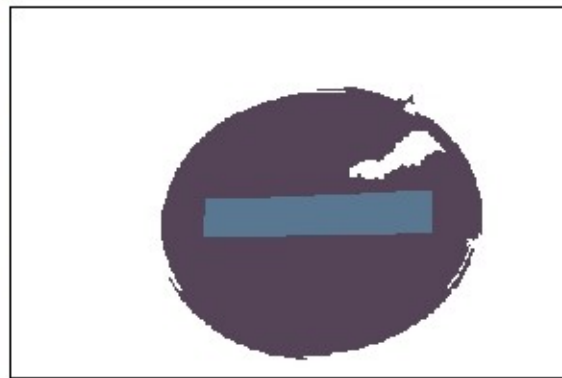
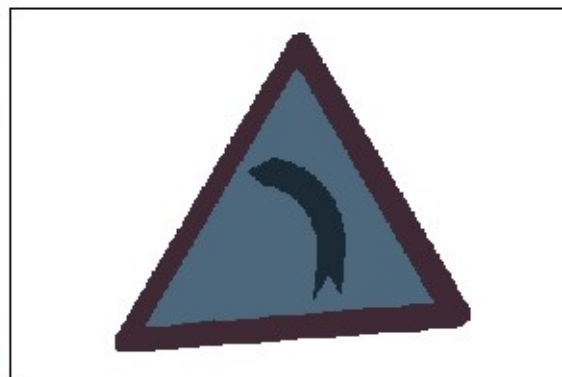


(b)

[15] C.Ferran-Bennstrom and J.R.Casas, "Object representation using colour, shape and structure criteria in a binary partition tree," ICIP, Genoa, Italy (2005).



# Examples

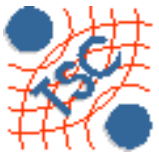


(a)

(b)

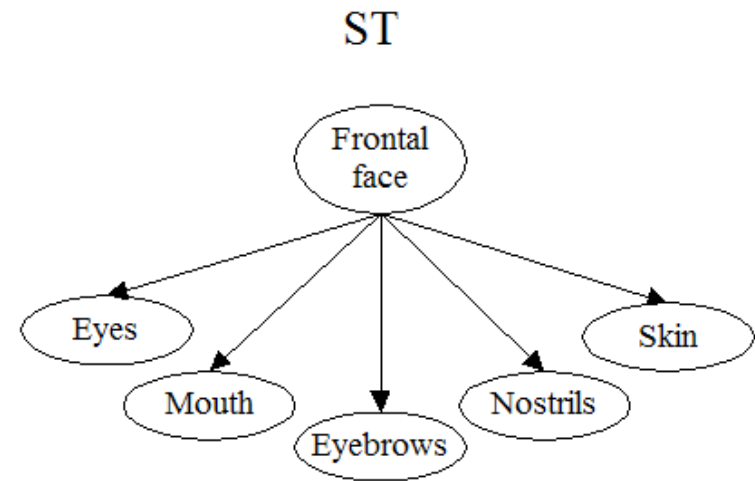
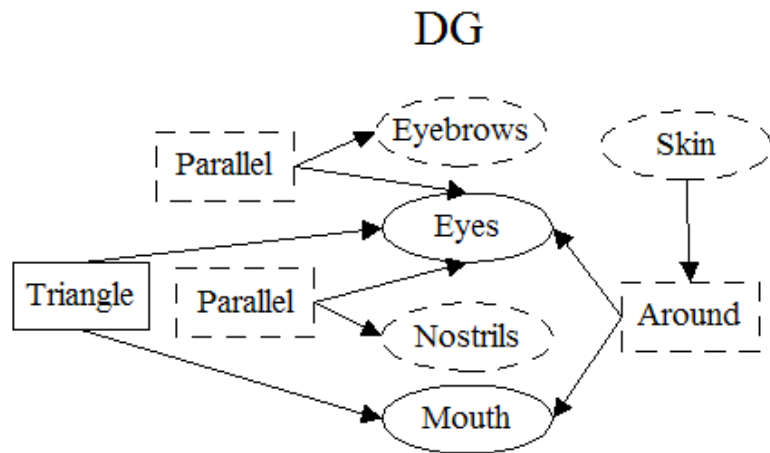
(c)





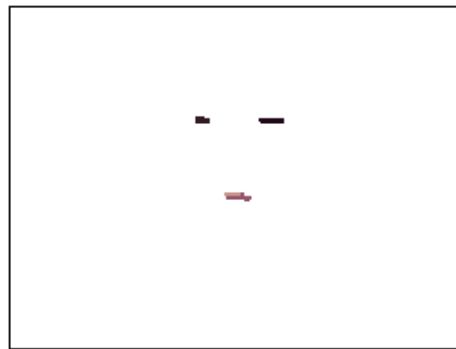
# Examples

Semantic class: Frontal face



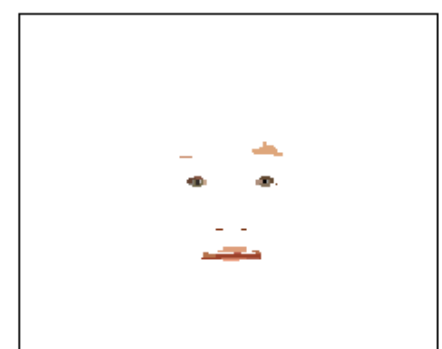
Segmentation

Detected object



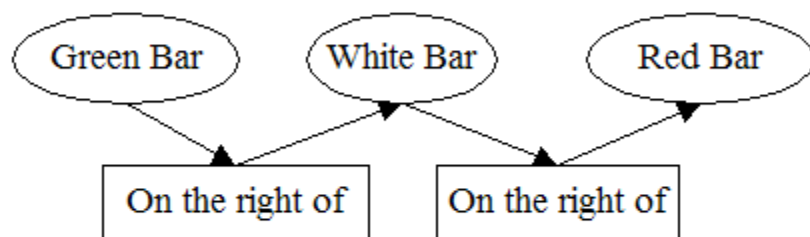
Segmentation

Detected object

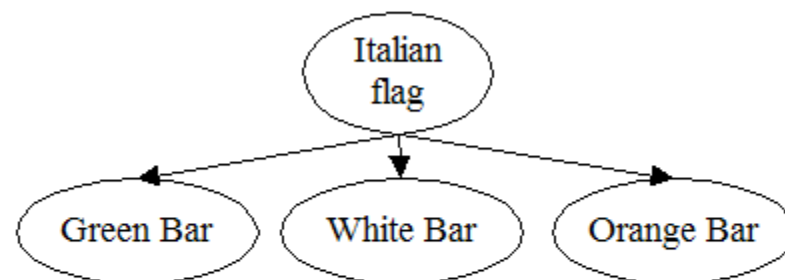


## Semantic class: Italian Flag

DG



ST

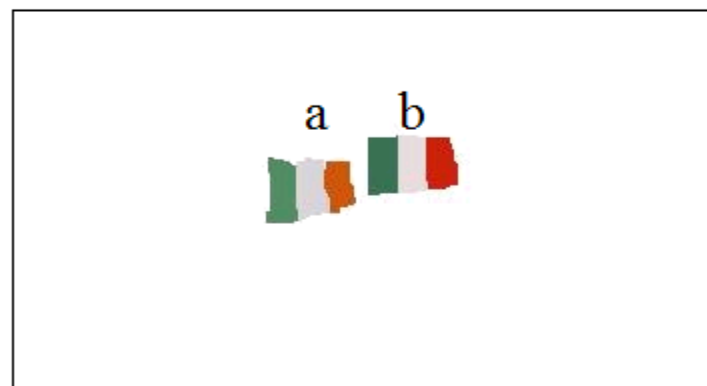


Segmentation

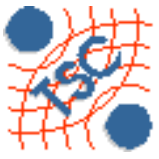


[www.eurunion.org](http://www.eurunion.org)

Detected object

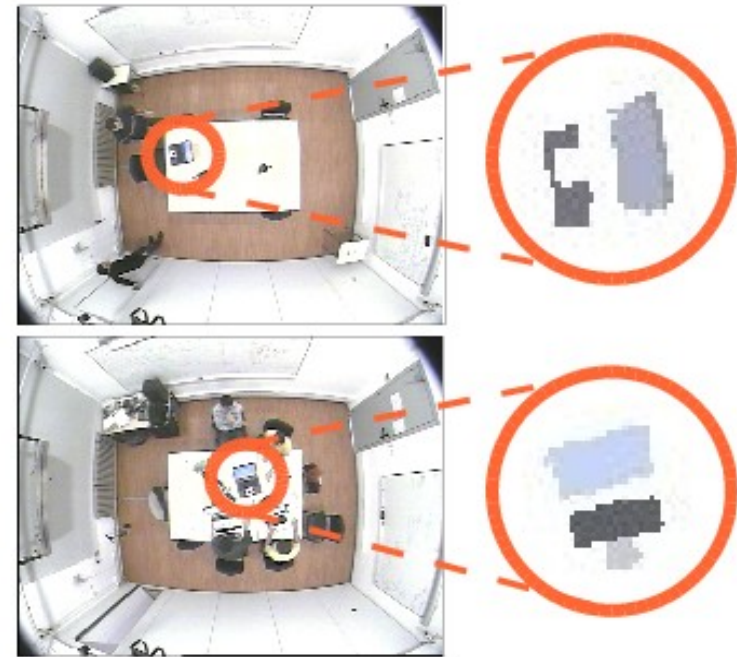
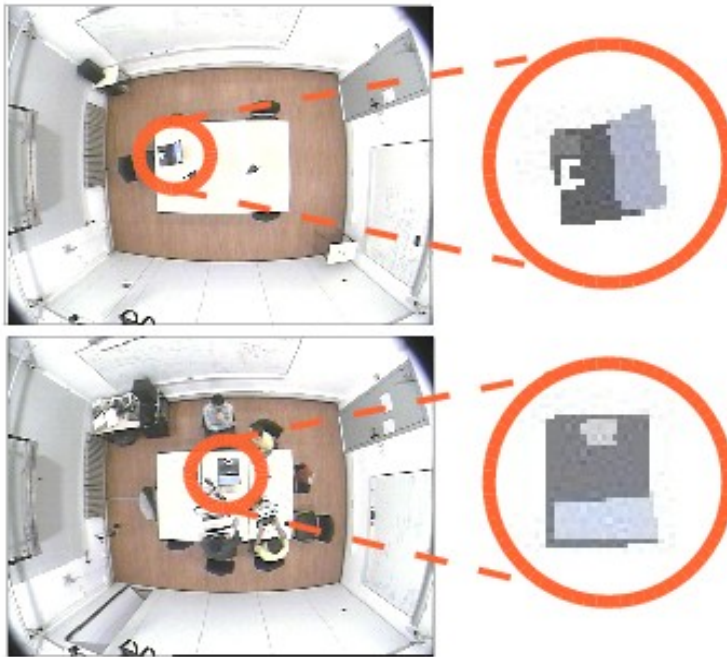
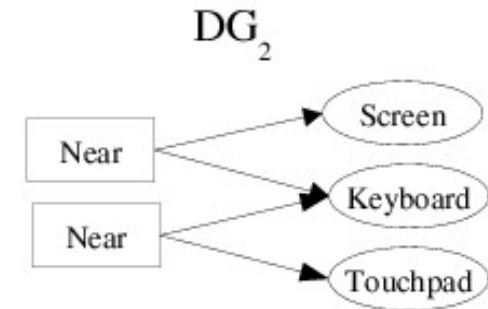
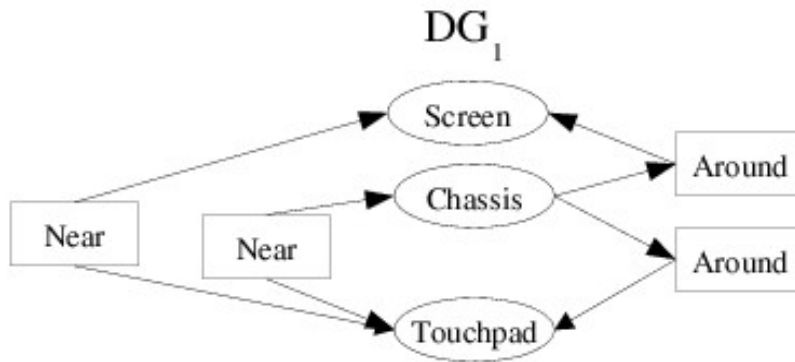


(a)  $f=0.94$ , (b)  $f=0.97$



# Examples

Semantic class: Laptop

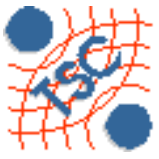




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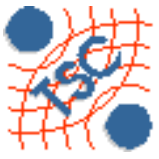




# Conclusions

- Generic approach.
- Stored preanalysis (BPT+VD) allows fast semantic retrieval.
- Human-intuitive semantic models (Description Graphs) with direct application to analysis algorithms.
- Description Graphs introduce context in analysis.
- Performance depends on models accuracy.
- Future work:
  - Fusion of SVMs feature detectors in perceptual analysis.
  - Semi-supervised semantic models creation.
  - Evaluation with annotated databases (TRECVID, ImageEval, CHIL ?)





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