

# Depth and Shape Inference (II)

**Introduction to Computational and Biological Vision**

CS 202-1-5261

Computer Science Department, BGU

Ohad Ben-Shahar

## *Edge and boundary Interpretation*

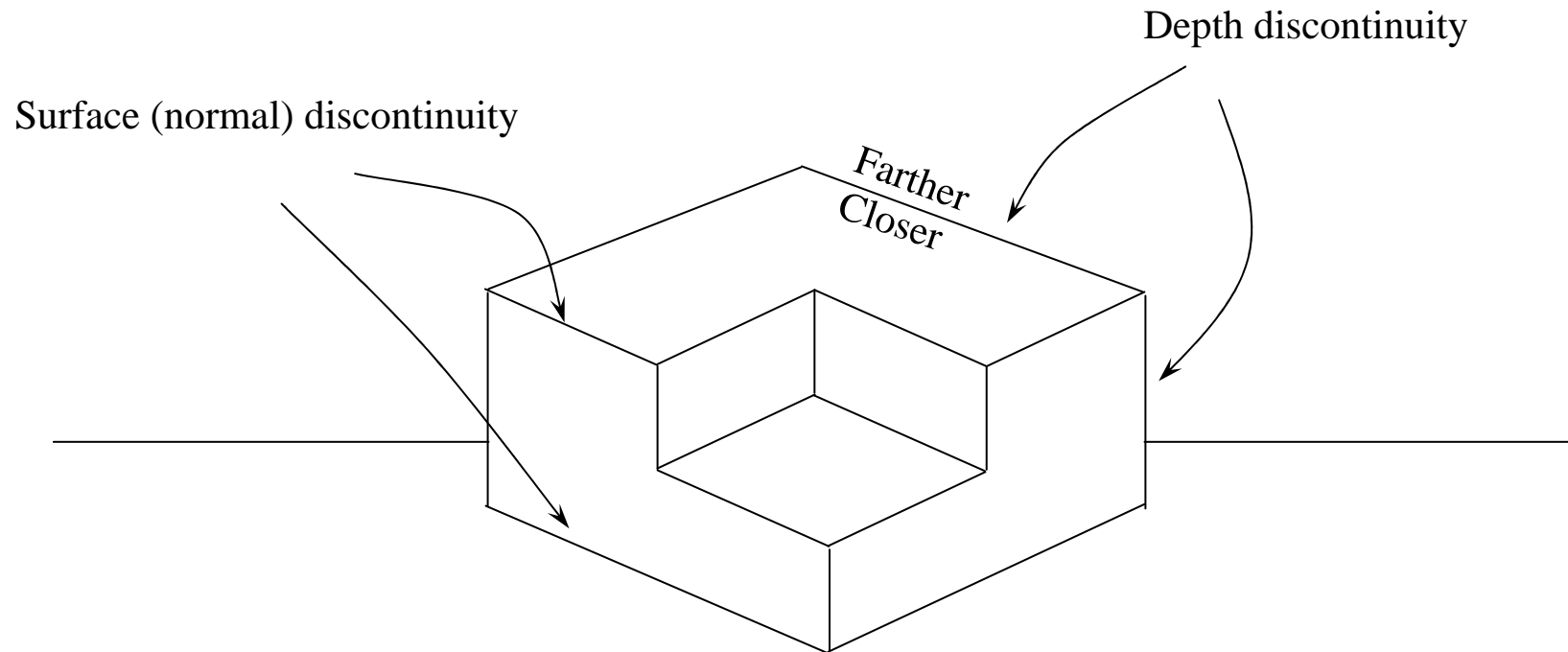
**A (desired) edge detection mapping (labeling)**

$$E[I(x, y)]: R^2 \rightarrow \Lambda = \{0,1,2,3,4,5,\dots\}$$

$$E[I(x, y)] = \begin{cases} 1 & \mathbf{(x,y) \text{ is a boundary point}} \\ 2 & \mathbf{(x,y) \text{ is a surface discontinuity point}} \\ 3 & \mathbf{(x,y) \text{ is an illumination discontinuity point}} \\ 4 & \mathbf{(x,y) \text{ is a reflectance discontinuity point}} \\ \vdots & \\ 0 & \mathbf{Otherwise (non edge point)} \end{cases}$$

## *Edge and boundary Interpretation*

**Edge/Contour interpretation = Determination of physical cause**



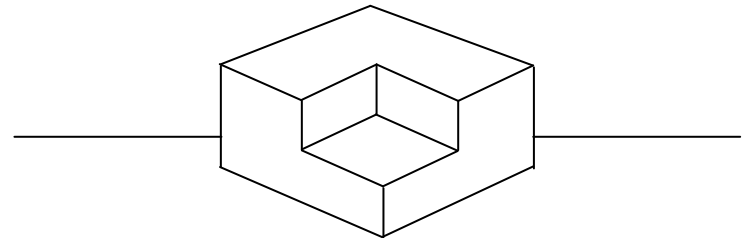
## *Edge and boundary Interpretation*

1968	<b>Guzman</b>	<ul style="list-style-type: none"><li>•The SEE program</li></ul>
1971	<b>Huffman / Clowes</b>	<ul style="list-style-type: none"><li>•Formal analysis of block world</li><li>•polygonal planar surfaces</li><li>•Depth and surface discontinuities only</li><li>•trihedral vertices</li></ul>
1972	<b>Waltz</b>	<ul style="list-style-type: none"><li>•Shadow boundaries</li><li>•Cracks</li></ul>
1974	<b>Turner</b>	<ul style="list-style-type: none"><li>•Opaque solids with limited class of smooth surfaces</li></ul>
1987	<b>Malik</b>	<ul style="list-style-type: none"><li>•Curved objects with <math>C^3</math> faces</li></ul>
•	•	•
•	•	•
•	•	•

# *Edge and boundary Interpretation*

## **Block worlds**

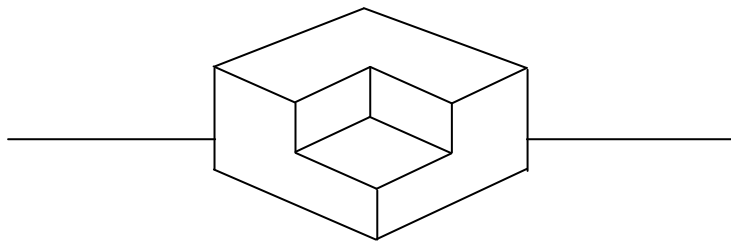
- **polygonal objects**
  - Planar faces
  - trihedral vertices
- **Allowed discontinuities**
  - Depth discontinuities
  - Surface normal discontinuities
- **Ignored discontinuities**
  - Illumination discontinuities (shadows)
  - Reflectance (pigmentation/color) discontinuities
- **General viewpoint assumption:**



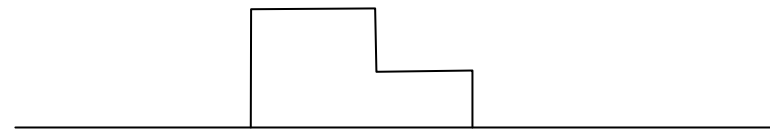
# *Edge and boundary Interpretation*

## **General viewpoint assumption**

A viewpoint is general (as opposed to accidental) if a small perturbation of it would not affect the configuration of the line drawing (no qualitative change).



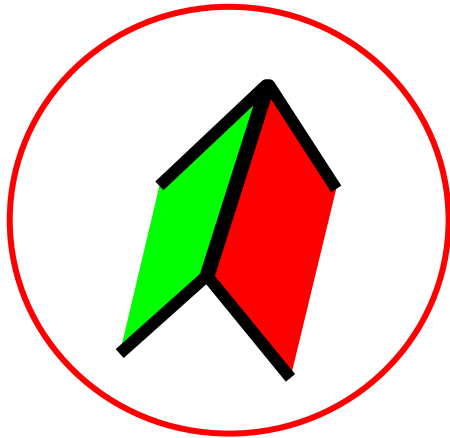
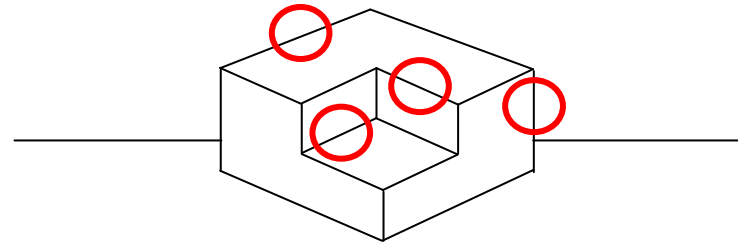
General



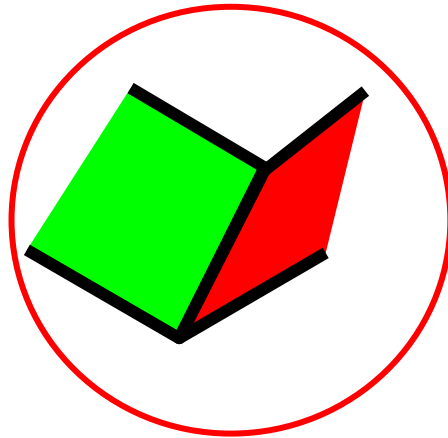
Accidental

# *Edge and boundary Interpretation*

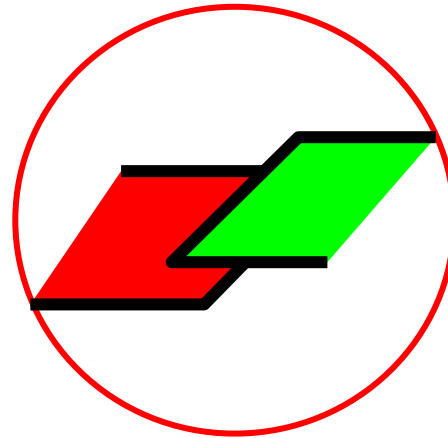
## **Edge types**



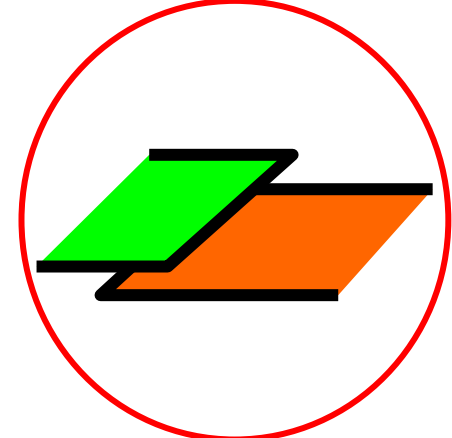
Convex  
orientation edge



Concave  
orientation edge



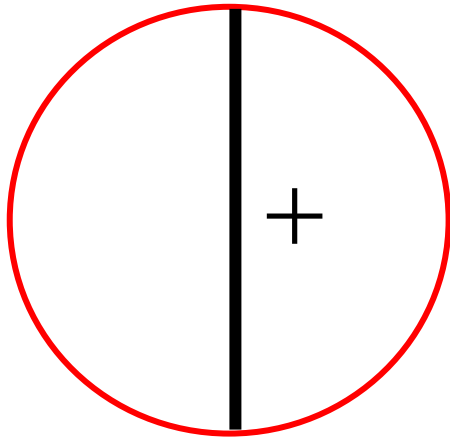
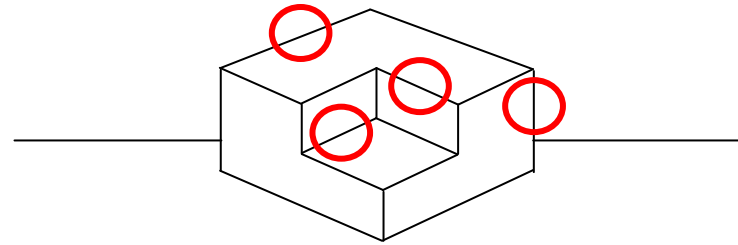
Depth edge



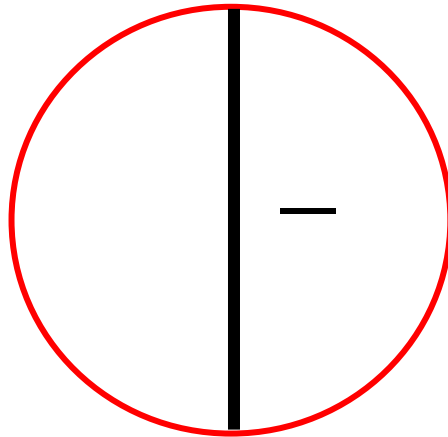
Depth edge

# *Edge and boundary Interpretation*

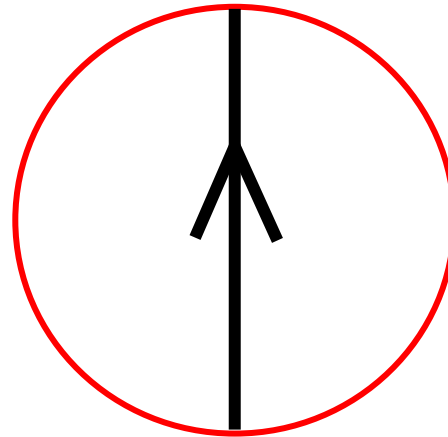
## Edge types



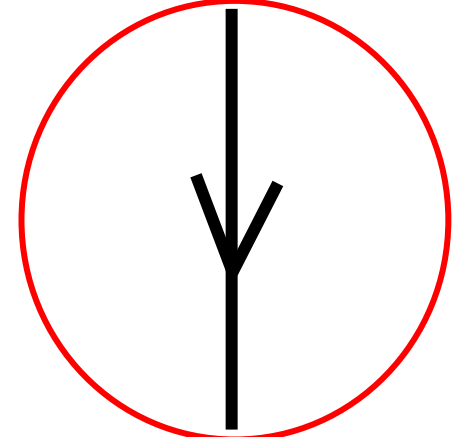
Convex  
orientation edge



Concave  
orientation edge



Depth edge

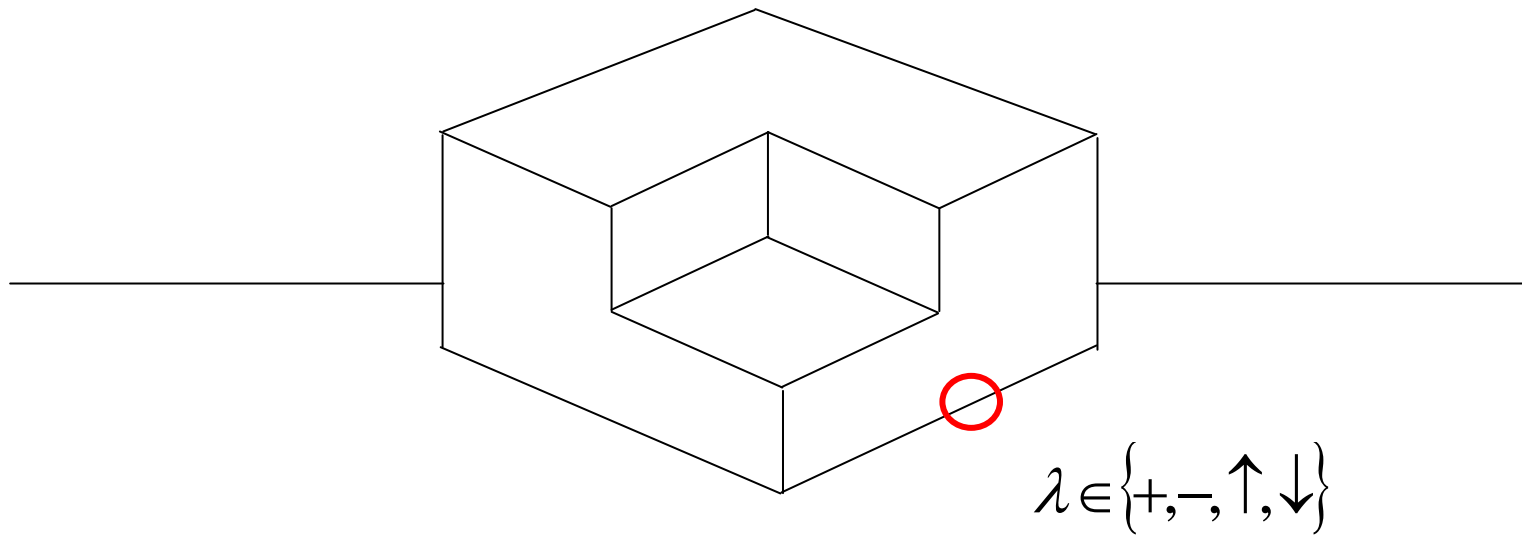


Depth edge



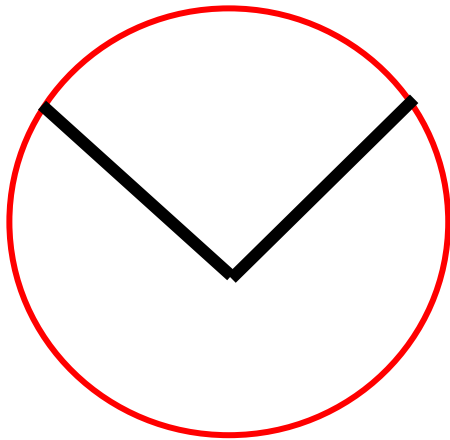
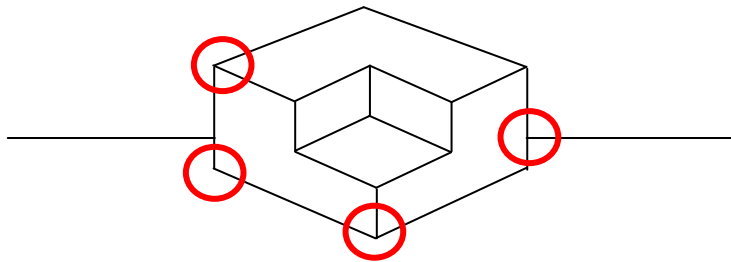
# *Edge and boundary Interpretation*

**Edge interpretation = Edge labeling**

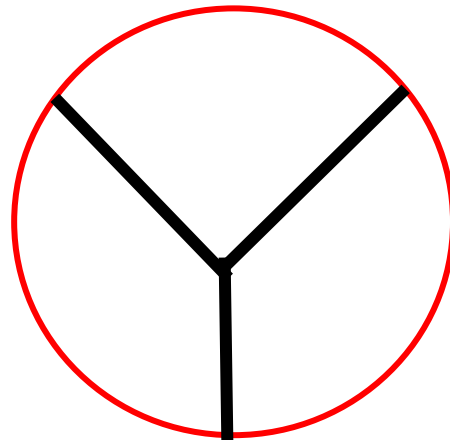


# *Edge and boundary Interpretation*

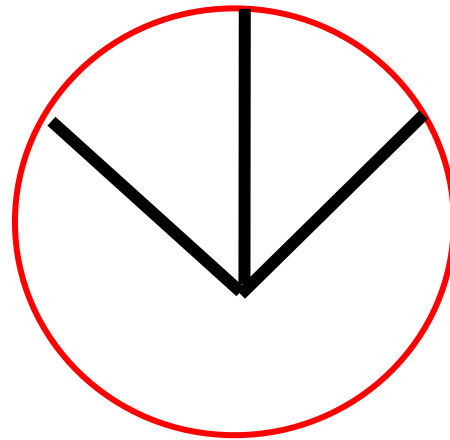
## **Edge intersections (vertices)**



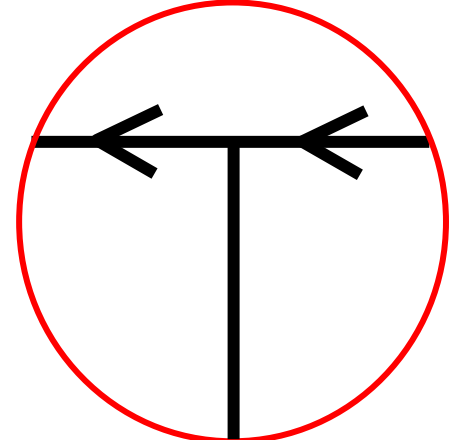
V-junction  
(L-junction)



Y-junction



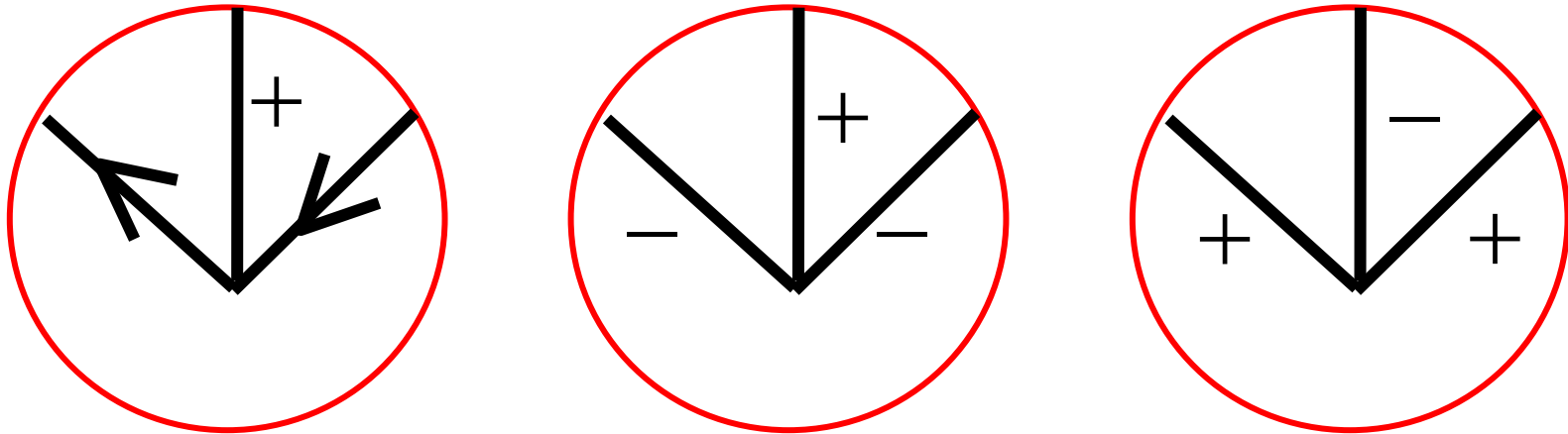
W-junction  
(arrows)



T-junction

## *Edge and boundary Interpretation*

**Physical constraints on labeling of edge intersections**

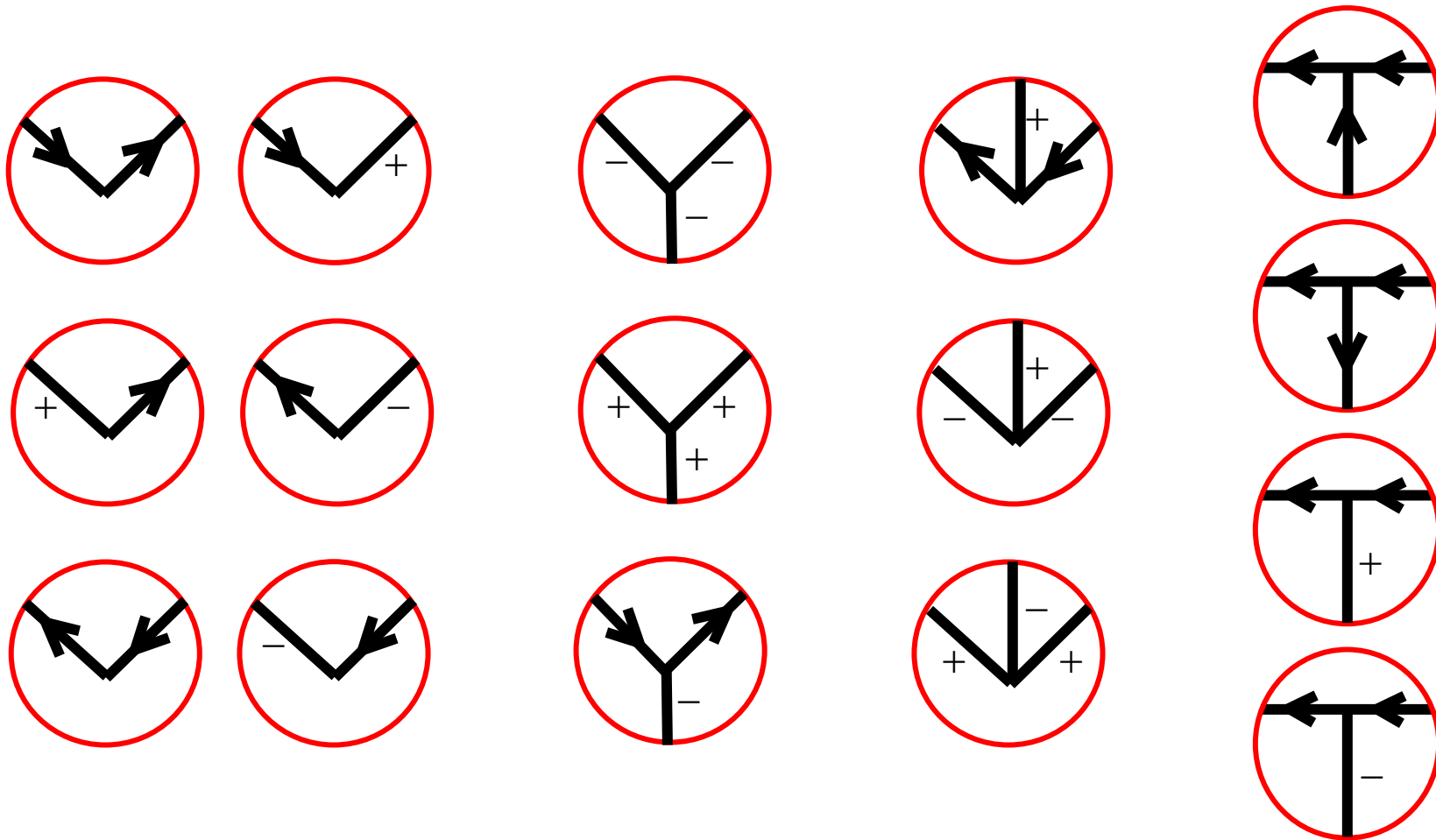


**Physical constraints on arrow junctions**

**[Huffman 1971, Clowes 1971]**

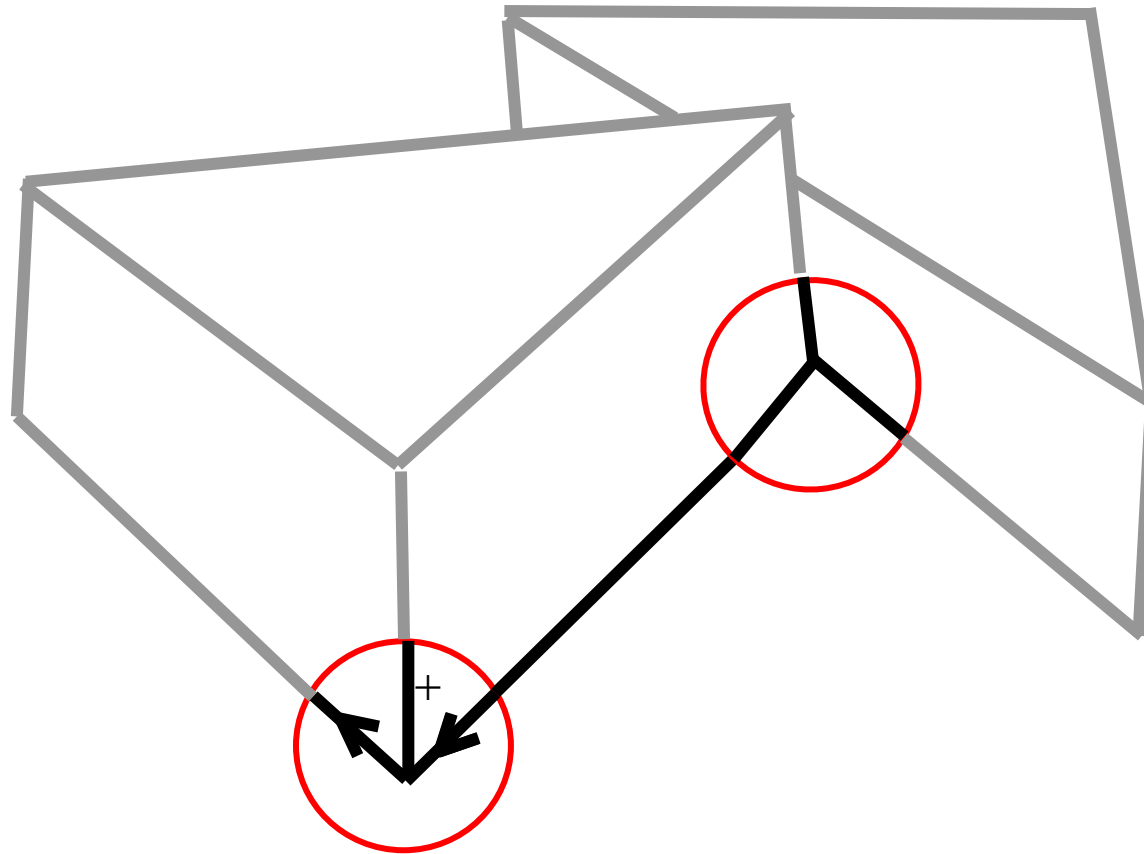
# *Edge and boundary Interpretation*

**Huffman and Clowes complete catalog (1971)**



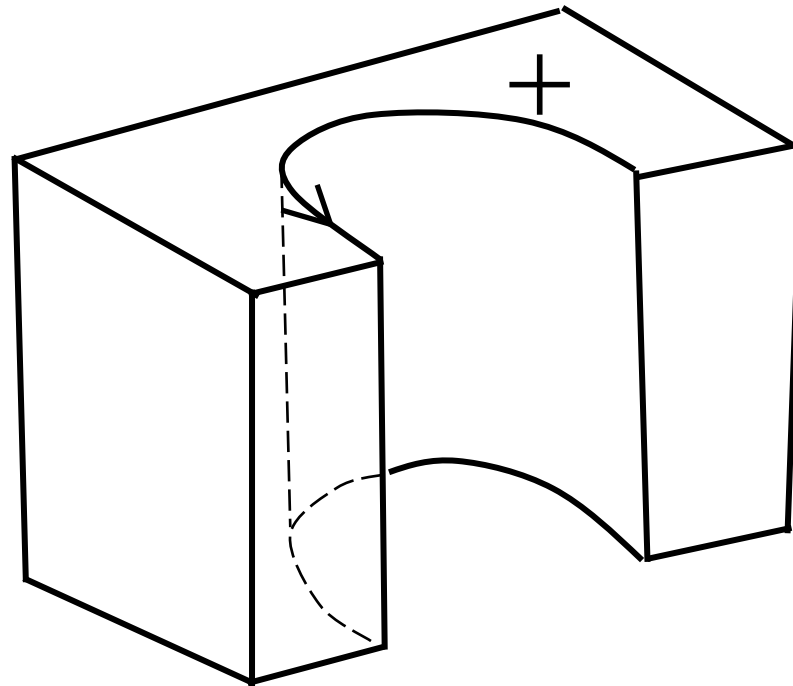
# *Edge and boundary Interpretation*

**Constancy of interpretation along edges**



## *Edge and boundary Interpretation*

**Constancy of interpretation along edges**

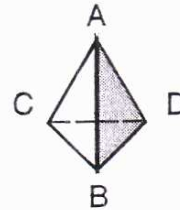


**Not valid for curved objects**

# *Edge and boundary Interpretation*

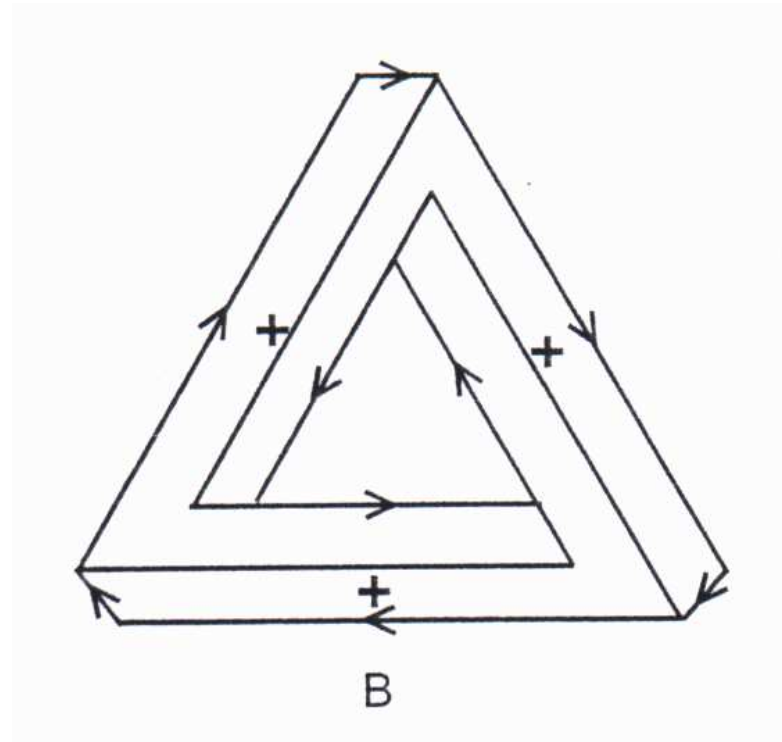
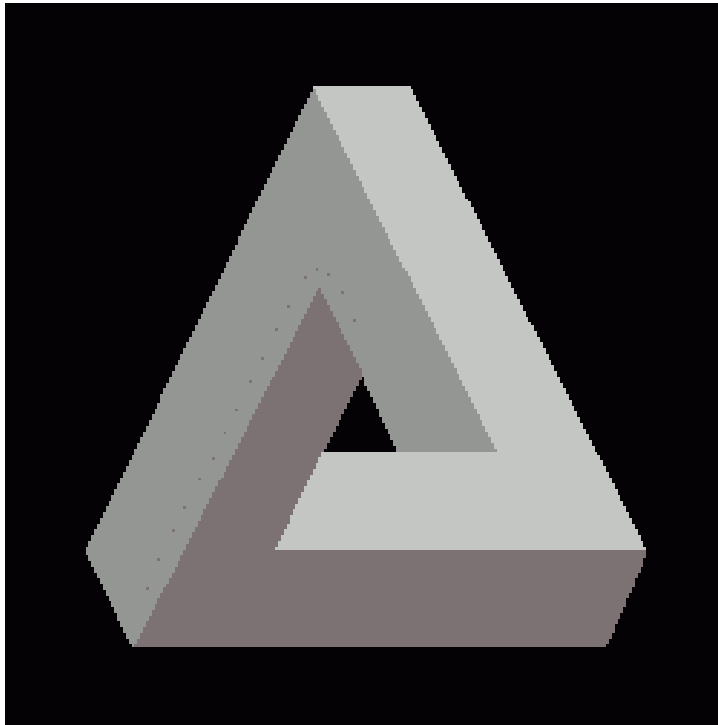
## **Using constraints to label line drawings**

Unlabeled  
drawing



## *Edge and boundary Interpretation*

**Consistent labeling is a necessary condition**



**...but not a sufficient one**



## *Edge and boundary Interpretation*

### **Consistent line drawing labeling via sequential search and backtracking**

1. Form a graph representation  $G=(V,E)$  of the line drawing with vertices as nodes line drawing edges as graph edges
2. Assume some (arbitrary) ordering between edges  $E=\{e_1, e_2, \dots, e_n\}$
3. Set  $i=1$
4. Label  $e_i$  with the next untried label from  $\{+,-,<,>\}$
5. Using the catalog, check consistency of the new label with all adjacent labeled edges.
6. If consistent then increase  $i$  and go to step 4  
else backtrack

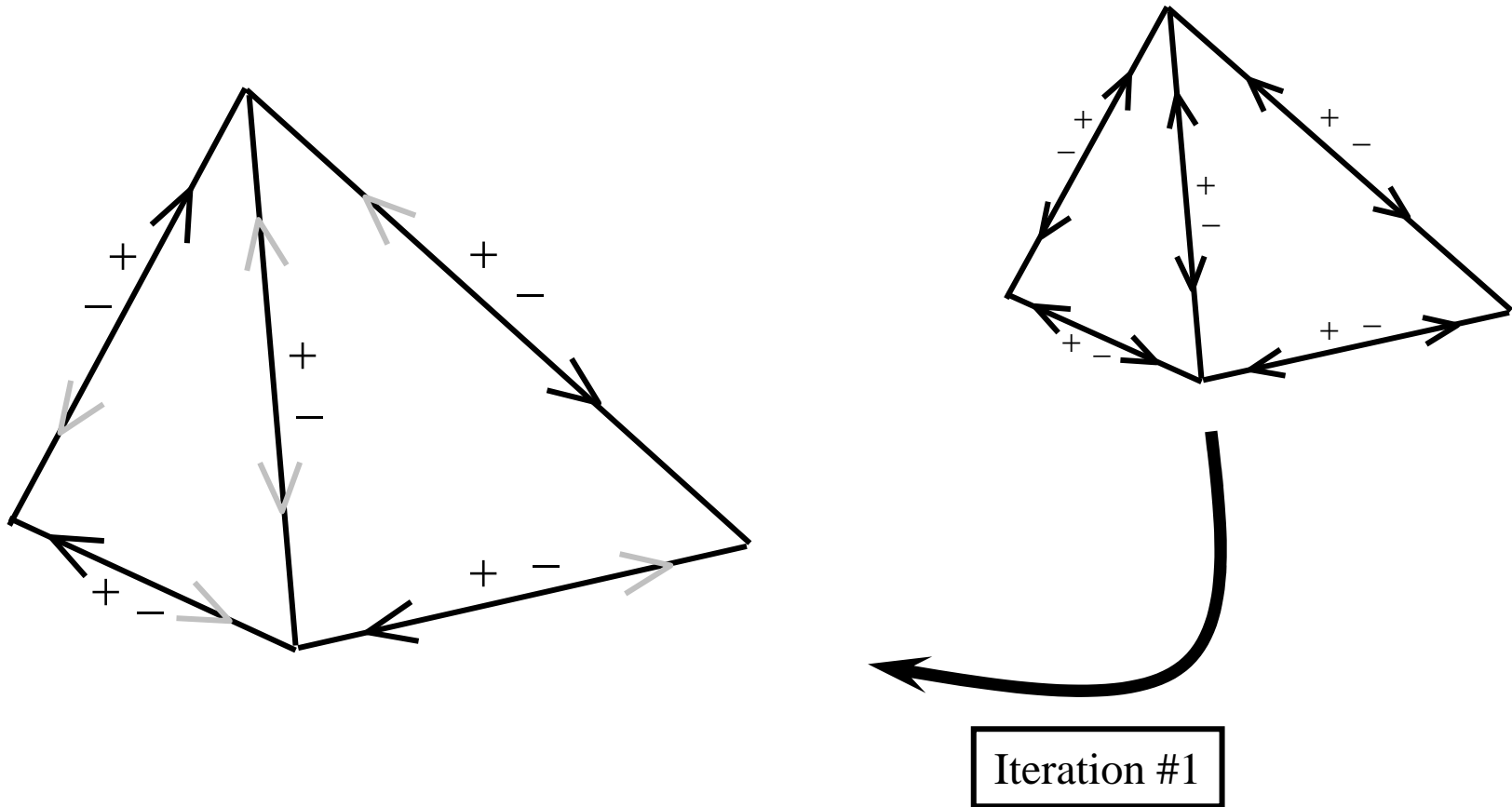
## *Edge and boundary Interpretation*

### **Consistent line drawing labeling via relaxation labeling**

1. Initial the label set for each line drawing label to  $\{+,-,<, >\}$
2. Repeat at all edges concurrently until no label set decreases in size
  - If label  $L$  at edge  $e$  cannot form a consistent junction using available labels at edges intersecting  $e$  in a common vertex, filter  $L$  from  $e$ 's label set

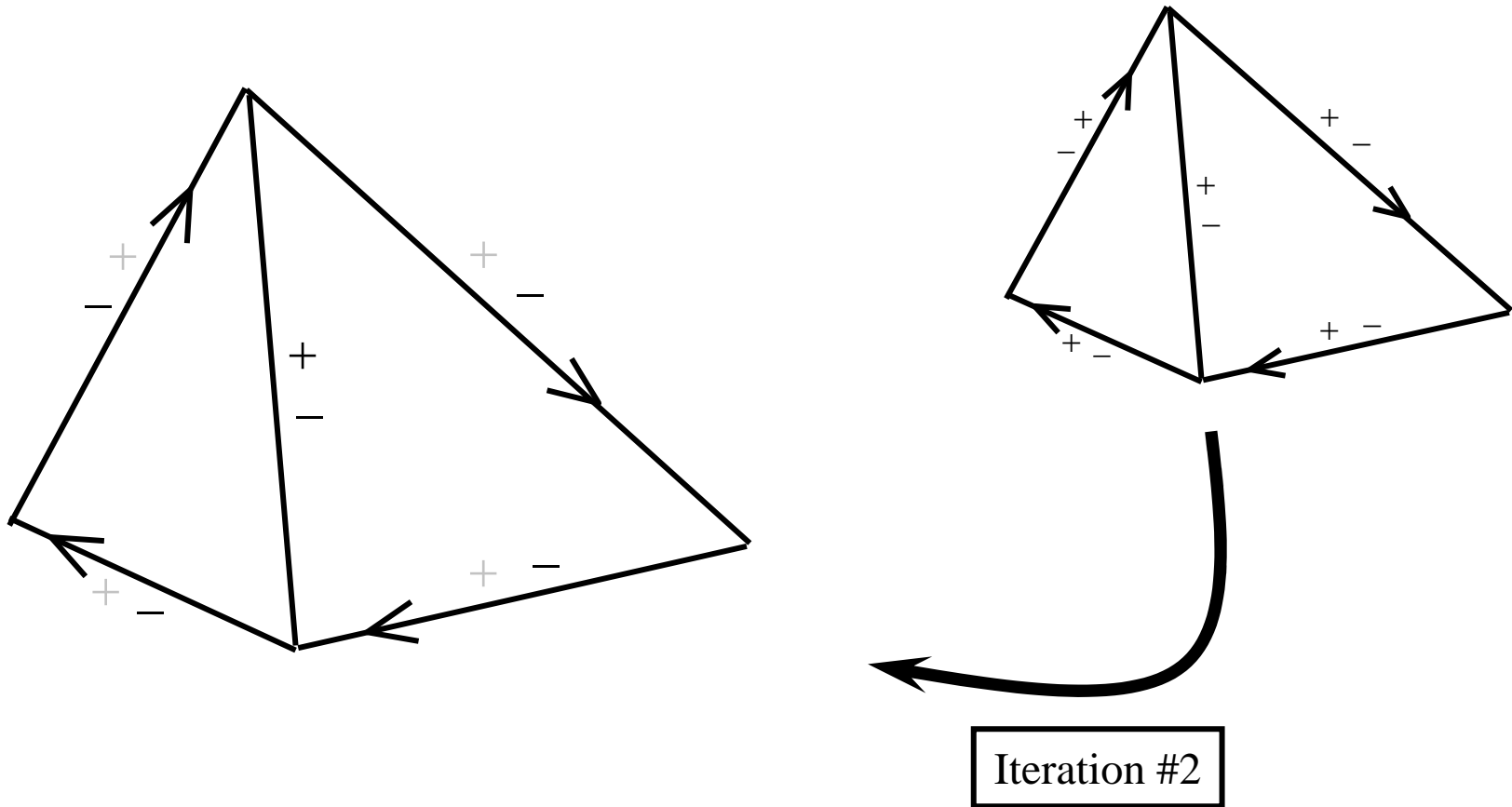
# *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**



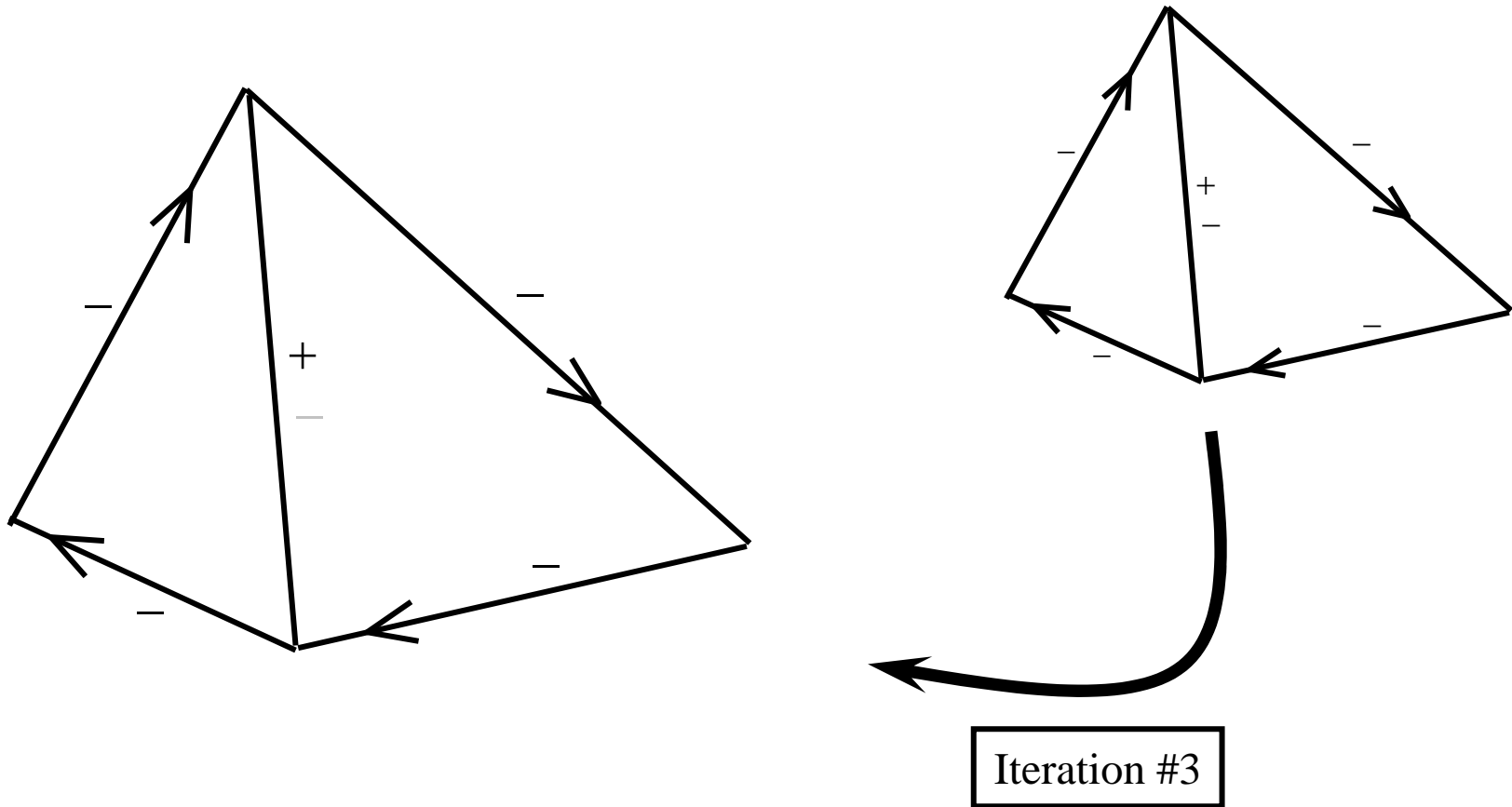
# *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**



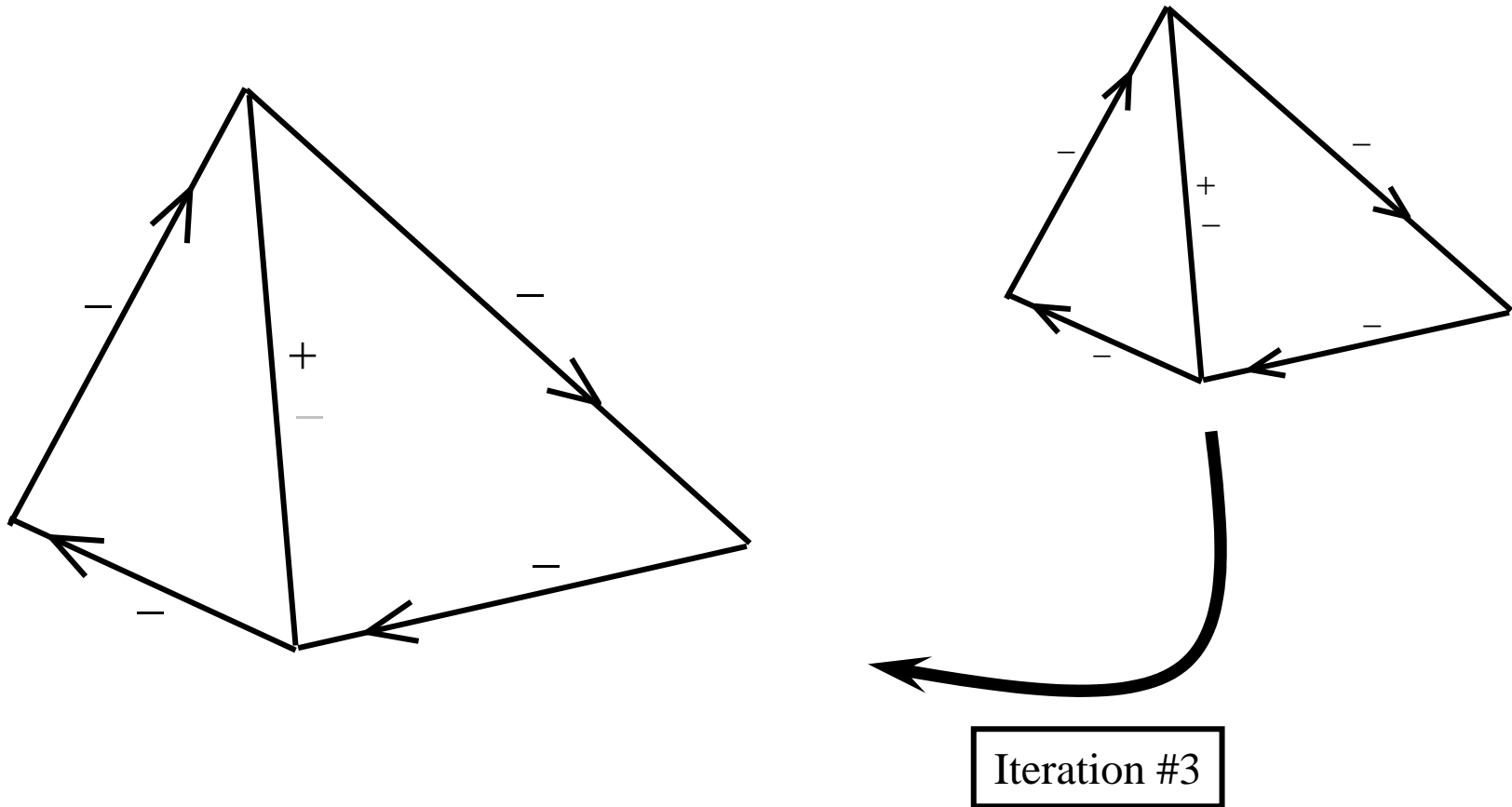
## *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**



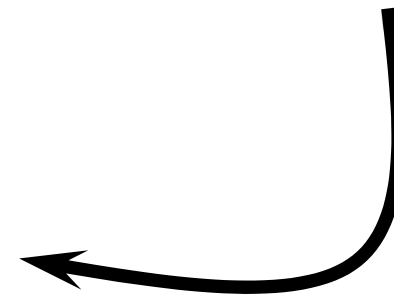
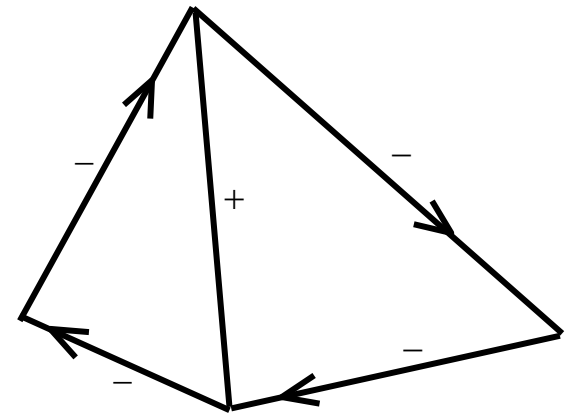
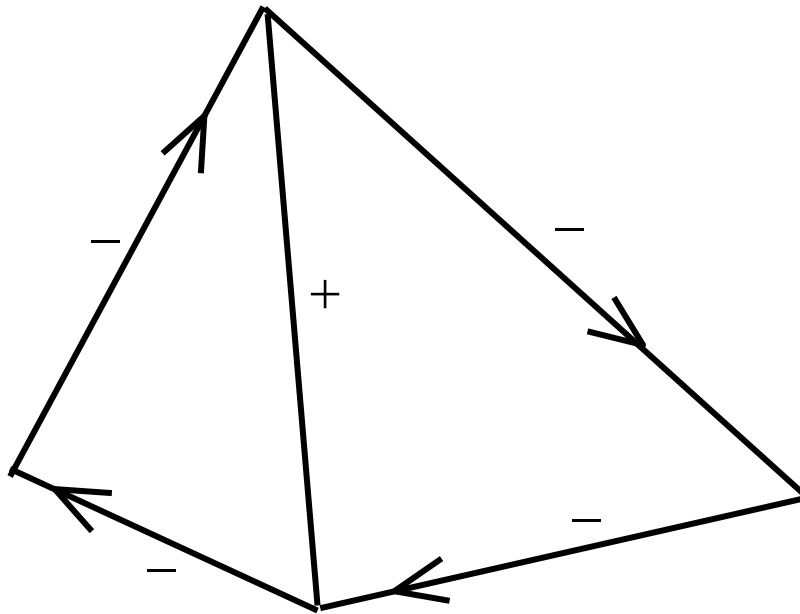
## *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**



# *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**

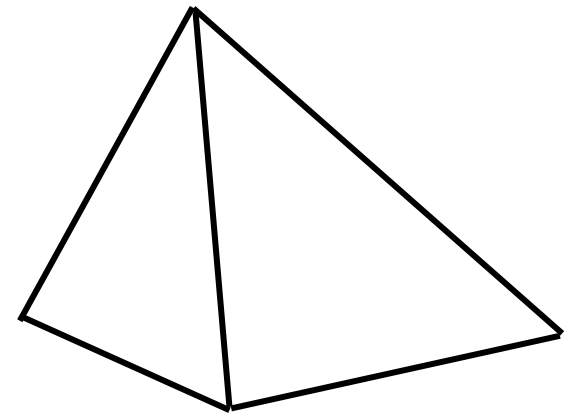
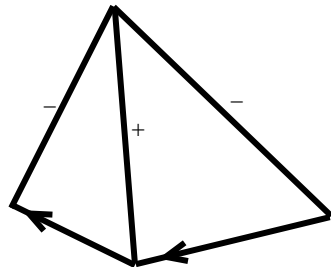
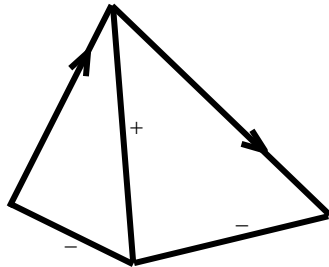
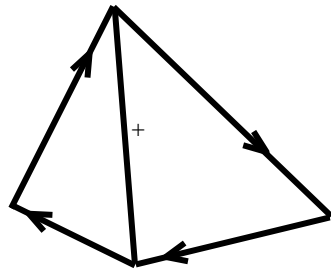


Iteration #4

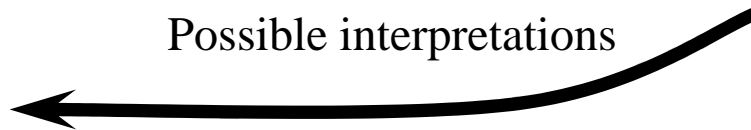
Convergence state!!

# *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**



Possible interpretations





## *Edge and boundary Interpretation*

### **Consistent line drawing labeling via relaxation labeling**

$B = \{b_1, \dots, b_n\}$  set of **objects** to be labeled

$\Lambda = \{1, 2, \dots, m\}$  set of possible **labels**

$p_i^0(\lambda)$  the measured **confidence** that  $b_i$  should be labeled  $\lambda$ .

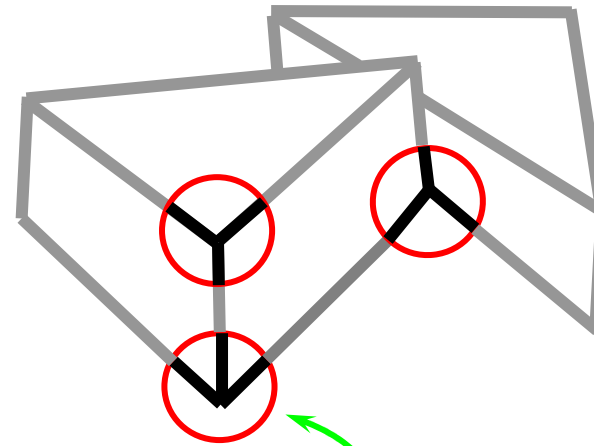
$$p_i^0(\lambda) \geq 0$$
$$\sum_{\lambda=1}^m p_i^0(\lambda) = 1 \quad \forall i$$

$r_{ij}(\lambda, \mu) \iff$  the strength of **compatibility** between the hypotheses " $b_i$  has label  $\lambda$ " and " $b_j$  has label  $\mu$ "

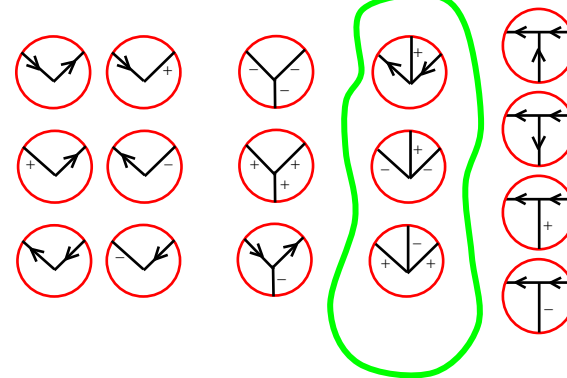
# *Edge and boundary Interpretation*

## **Consistent line drawing labeling via relaxation labeling**

Nodes = line drawing intersections



Labels = Vertex catalog



## *Edge and boundary Interpretation*

**Consistent line drawing labeling via relaxation labeling**

