

Visuelle Perzeption für Mensch-Maschine Schnittstellen

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Basics: Computer Vision & Image Understanding

WS 2012/13

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- The purpose of neo-cortex is three fold

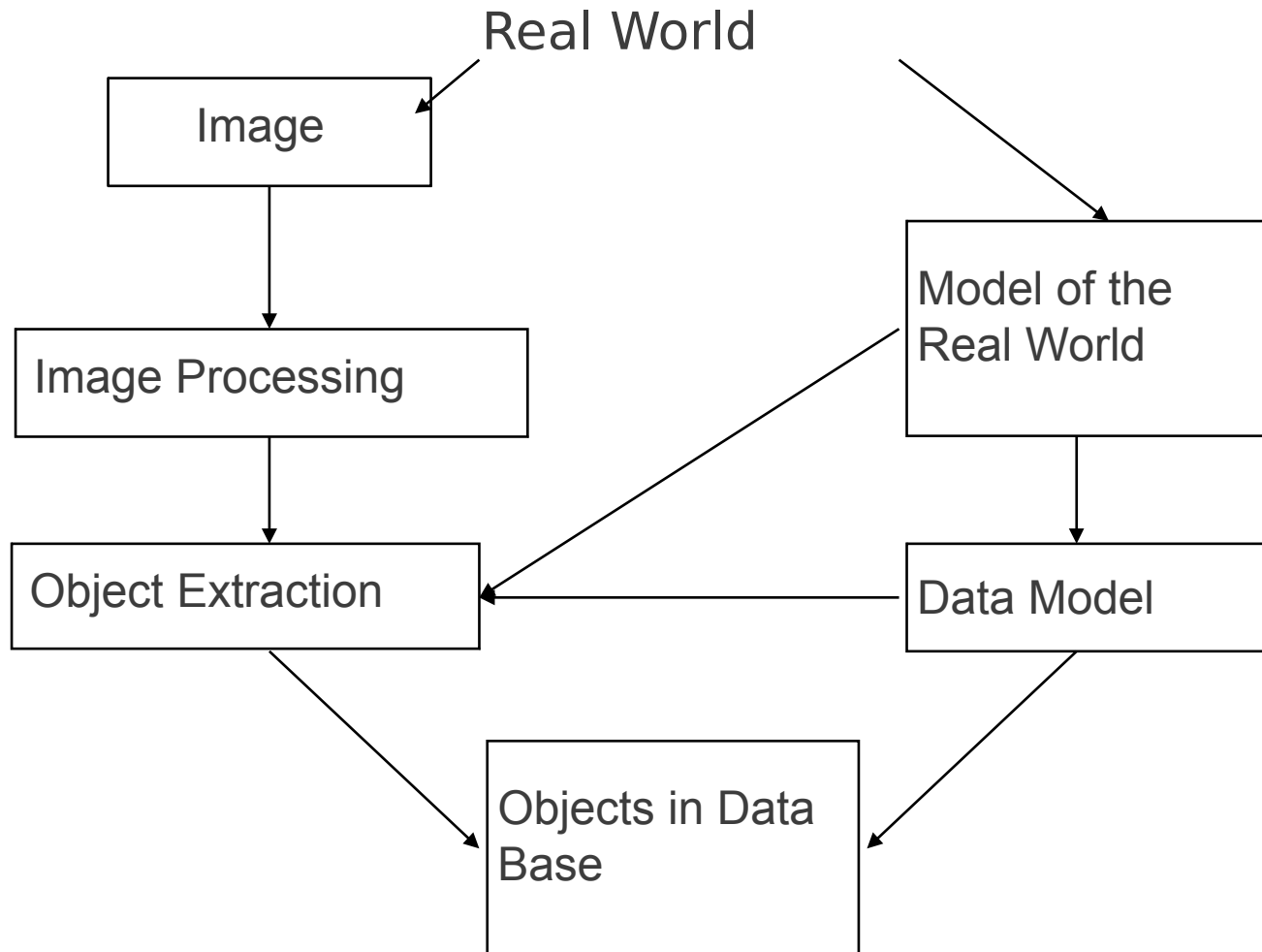
to RECOGNIZE

OBJECTS

OBJECTS

OBJECTS

Objects from Digital Images





CV: R



Poseidon and the Mermaid, by David M. Weimer, 1990. This India-ink drawing is ambiguous: It may be perceived either as Poseidon, the Greek god of the sea, or as a mermaid. The mermaid's tail fin is Poseidon's moustache. (Courtesy, David M. Weimer.)

Introduction

Image Understanding: Definition

Generation of an
explicit, meaningful description
of **physical objects**
in one or several **images**
at a certain point in **time** or period of time
of the imaged **scene**
with the help of computers.

- - Physical objects are in the scene.
 - Images of the scene are taken as input.
 - Explicit description of the scene is the result.
- Aim: complete automation

Introduction

Image Understanding: Object

- **Main questions:**
 - Why objects?
 - What are objects?
- **Holistic view:**
 - Everything is a whole.
- **Discrimination of objects:**
 - Creatures differentiate among important things
 - to improve their survival capabilities.
- **Object:**
 - Homogeneous area of the scene

Introduction

Image Understanding: Concepts

- **Scene:**

Part of time and space in the **real world**.

Static: 3D (e.g. interior, building and environment,

- landscape, country, planet, universe, inside of humans)
- Dynamic: 3D + time
- Also known as **object space**

- **Image:**

2D projection of the scene

- Intensity image (active: radar, microwave, passive: mono-/multi-spectral)
- Depth image

Introduction

Knowledge-based object extraction

- **Object extraction:**

- Is based on what we **know** about an object

- What kind of characteristics/details are there?
 - What is the difference with respect to other objects?
 - What are the relations to other objects?

- Object model

Object model depends on human cognition of the world;
i.e., the result of the automatic object extraction should be identical to the interactive (human) interpretation.

- This does not mean that the methods used have to be the same!

Formal representation of knowledge

Techniques of artificial intelligence

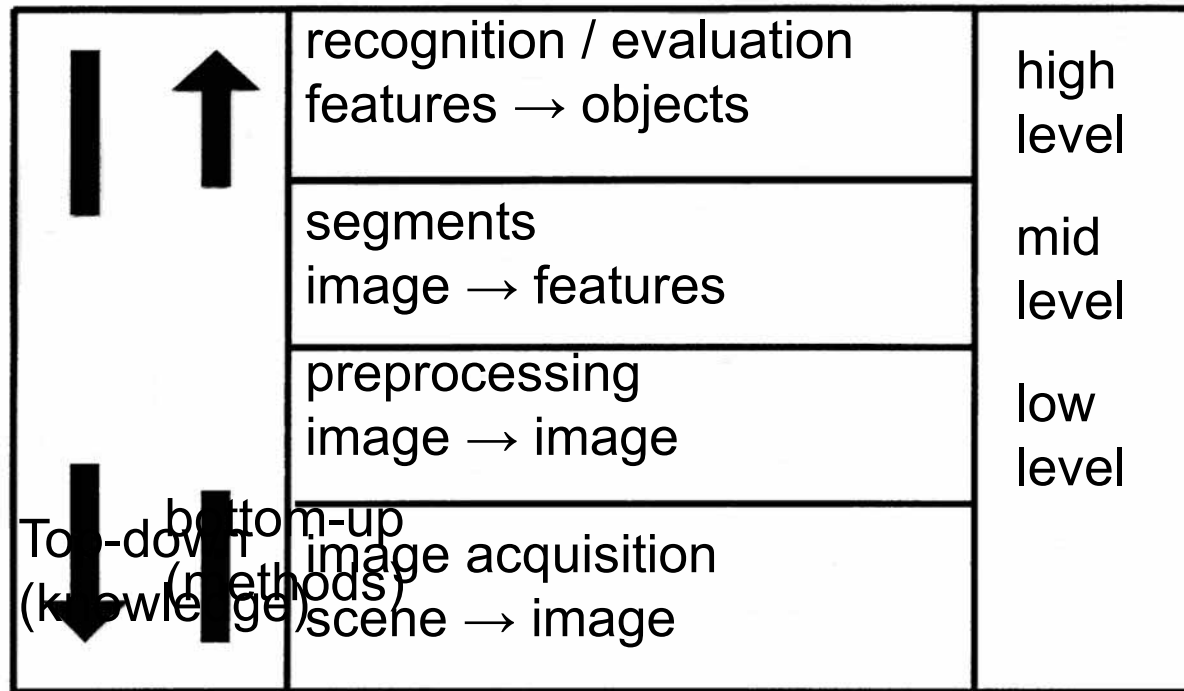
Utilization of Model:

Standard Approach to Image Understanding

- Problem: Given are
 - Formal representation of the model
 - Image(s) of the scene
 - \Rightarrow Compute instances from (instantiate) concepts of the representation.
- Operations:
 - Extract characteristics (invariants) from images (description)
 - Project concepts on the characteristics
 - (prediction)
 - Compare characteristics with the representation (matching)

Utilization of the Model:

Standard Approach: Levels



■ Image formation

(Input: scene, result: image)

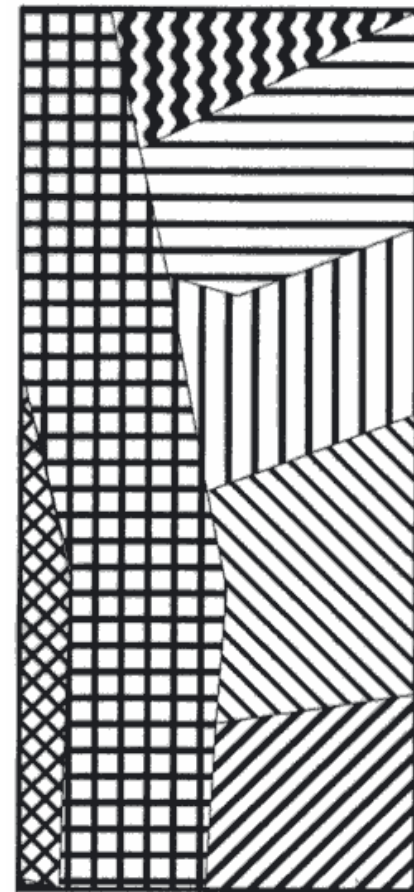
- Digital data (e.g. CCD-camera, Landsat TM, MRI,CT, SAR)
 - **Scanner**

Utilization of Model

Standard Approach: Levels

Preprocessing (low-level; iconic)

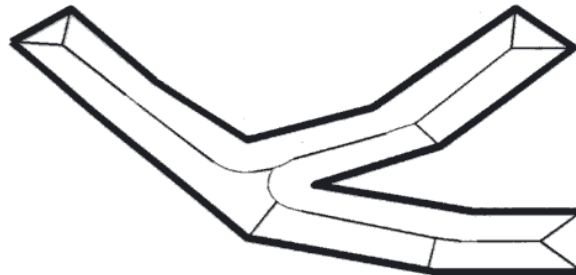
- (Input: image, result: image)
- Image enhancement (visual image quality;
 - e.g. contrast improvement, change of LUT)
 - Image restoration (physical image quality:
 - e.g. removal of noise/disturbances, blur)
 - Segmentation (mid-level)
- (Input: image, result: features)
- For area (2D) objects: Subdividing pixels
- into a set of non-overlapping, non-empty
- **regions** filling the image plain without any
- gaps (features: contours)



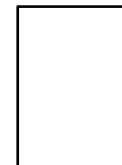
Utilization of Model

Standard Approach: Levels

- Segmentation (contd.)
- Conditions for creation of **regions**:
 - e.g. same color value, same texture or hatching.
 - In case of linear objects the **centerlines** are the **features**.



- Recognition/evaluation (high-level)
- (input: attributes, results: objects)
 - Explicit knowledge about attributes and relations is used to match features and objects.
 - Example: Contour of a region gains meaning “house”,
 - if it does not exceed a certain area size and is composed of
 - straight lines oriented perpendicularly to each other.



Utilization of Model:

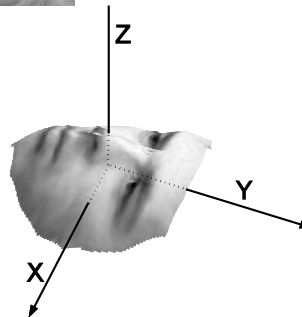
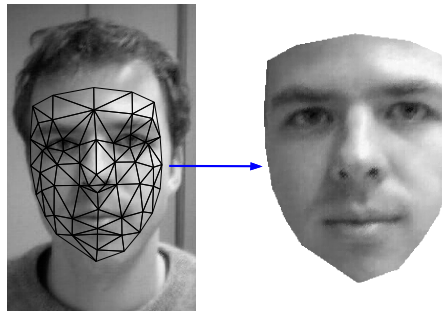
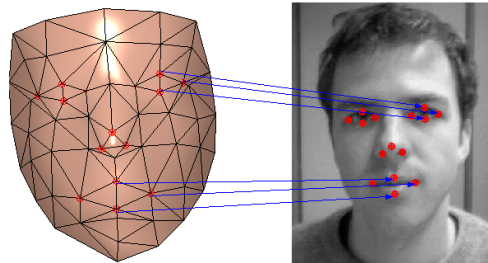
Standard Approach: Procedure

- Bottom-up (data driven; based on methods)
 - Recognize objects starting with processing the image.
- Top-down (model driven; based on knowledge)
 - Project model on image and search for components.
- Mixed mode
 - Switch between bottom-up and top-down procedure.

Problem: When should we switch?

Example- Top-down

Head Pose Estimation



Example- Bottom-Up

Road Extraction

Module 1

Initial road segments:

- hypotheses for road axes:
bright lines in low resolution
- hypotheses for road sides:
parallel edges enclosing homogeneous region in high

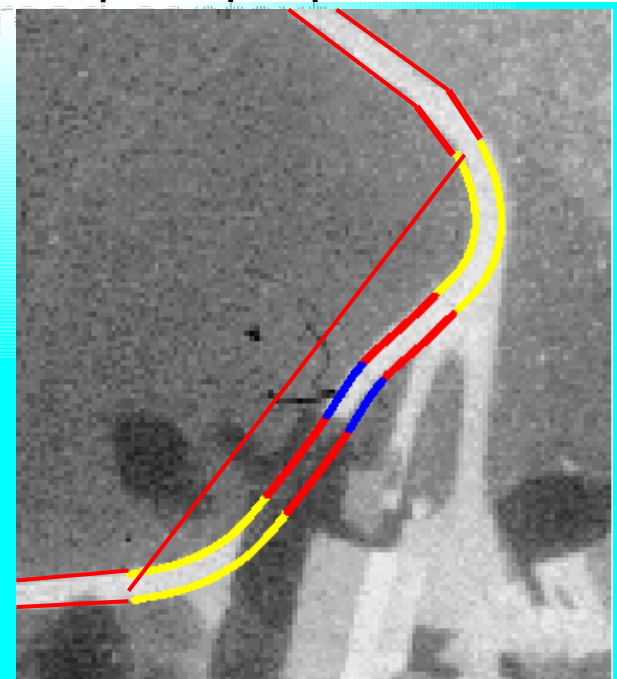
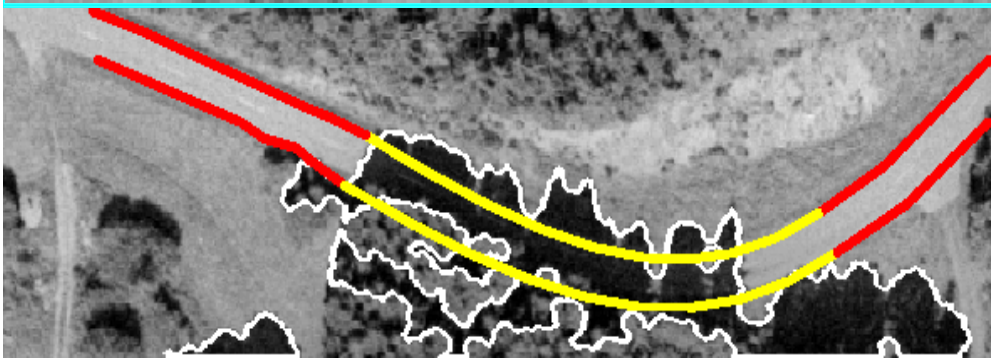
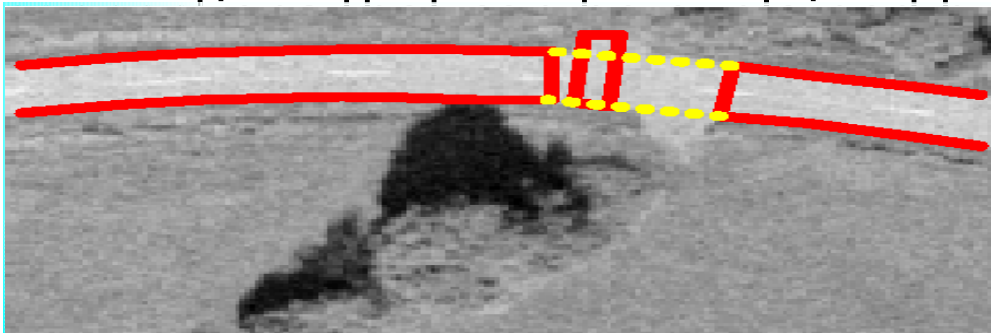


Extraction

Module 1

Connections between road segments:

- 1) perceptually evident connections (short, similar gray value statistics)
- 2) geometrically possible connections (verification by zip-lock ribbon snakes)
- 3)

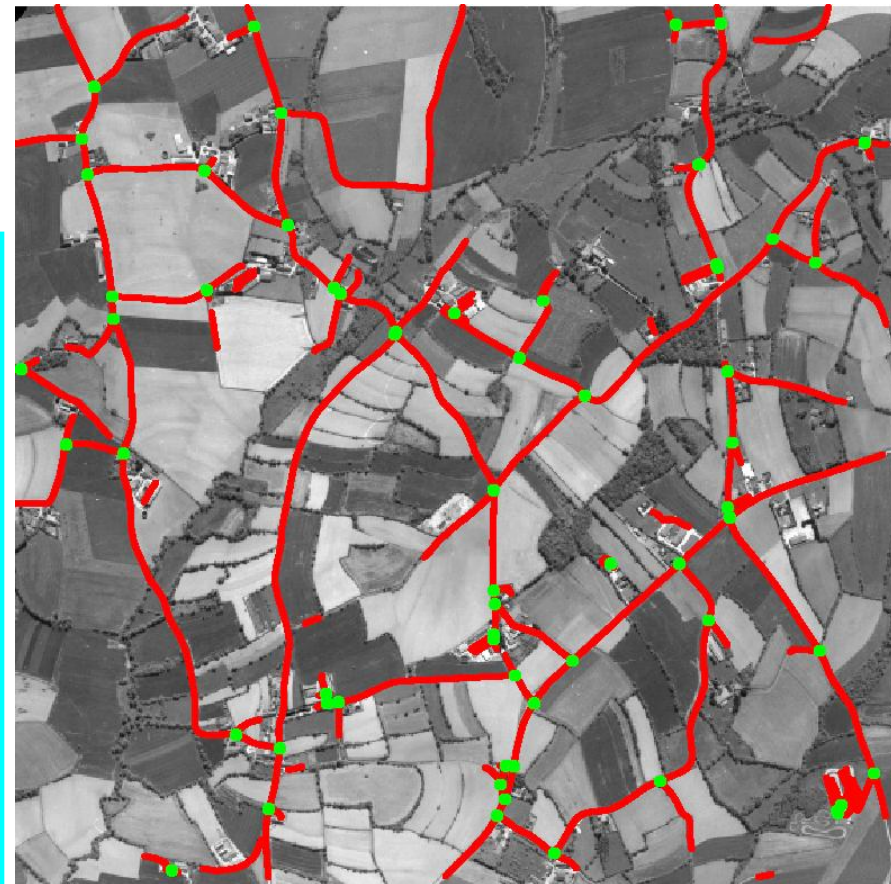
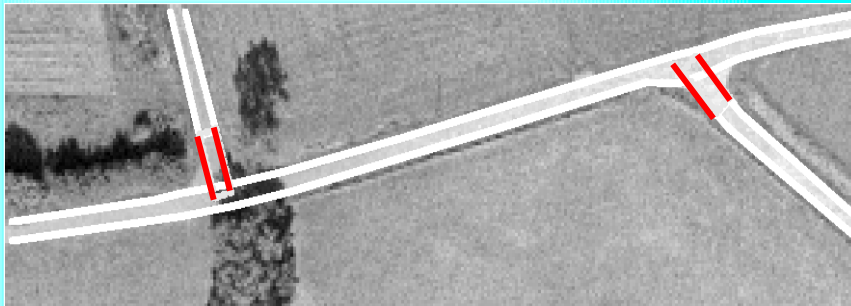


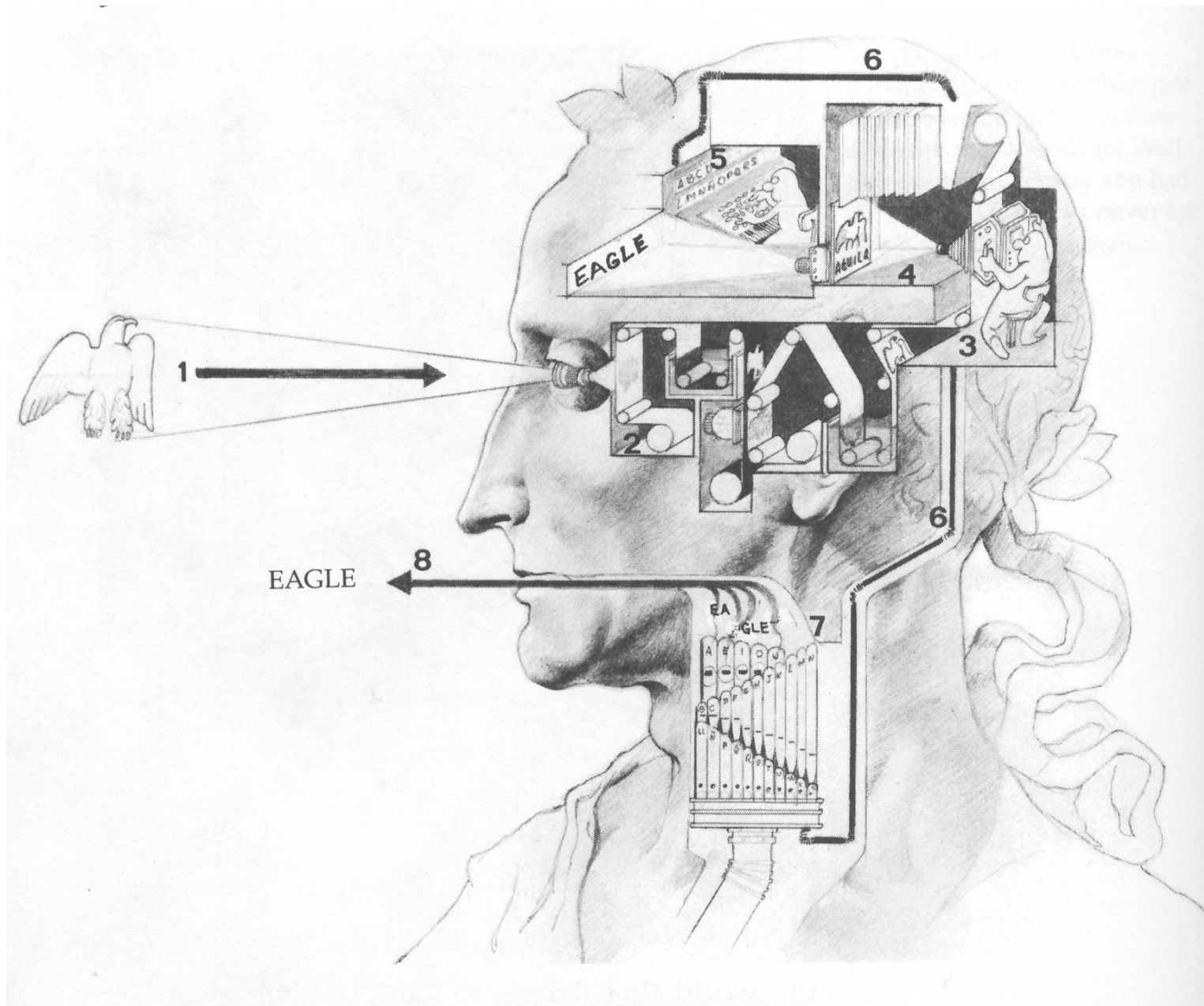
Extraction

Module 1

Junctions:

- 1) extend ends of road segments
- 2) check gray value statistics
- 3) check context





Math is the Doctrine of the Patterns

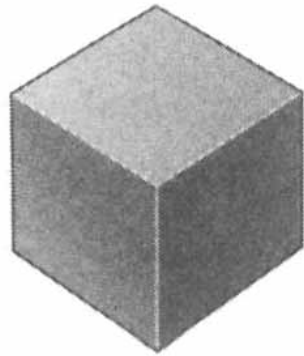
- W. W. Sawyers (1955). Prelude to Mathematics. London: Penguin Books:
- ...we may say, “Mathematics is the classification and study of all possible patterns.” Pattern is here used in a way that not everybody may agree with. It is to be understood in a very wide sense, to cover almost *any kind of regularity that can be recognized by the mind*. Life, and certainly intellectual life, is only possible because there are certain regularities in the world. A bird recognizes the black and yellow bands of a wasp; man recognizes that the growth of a plant follows the sowing of seed. In each case, a mind is aware of pattern. (p. 12; highlighted in the original)

Mathematics:

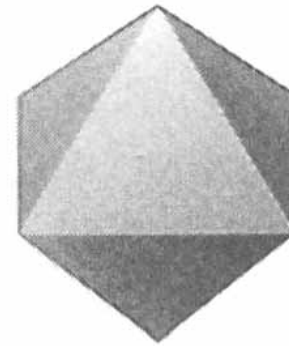
The Science of Patterns

Andrew Gleason in the 1984 October issue of the Bulletin of the American Academy of Arts and Sciences:

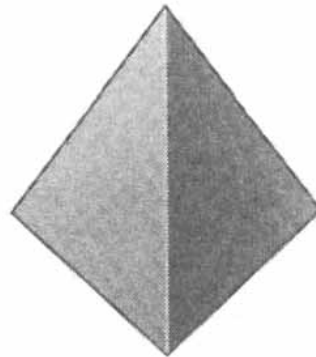
- ▶ Mathematics is a science of order in terms of regularities and patterns. Aim of mathematics is the identification and description of such orders, kinds of orders and coherences, which exist between those various kinds of order.
- ▶ In: Keith Devlin: The Math Gene. J.G. Cotta, Stuttgart 2001.



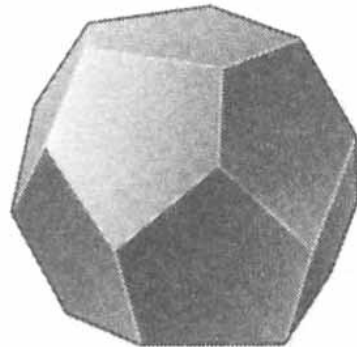
cube



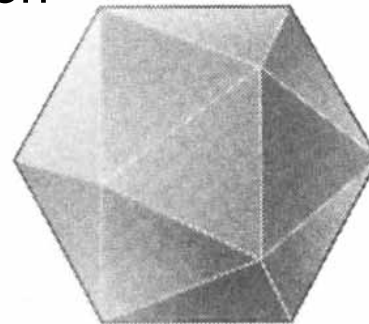
octahedron

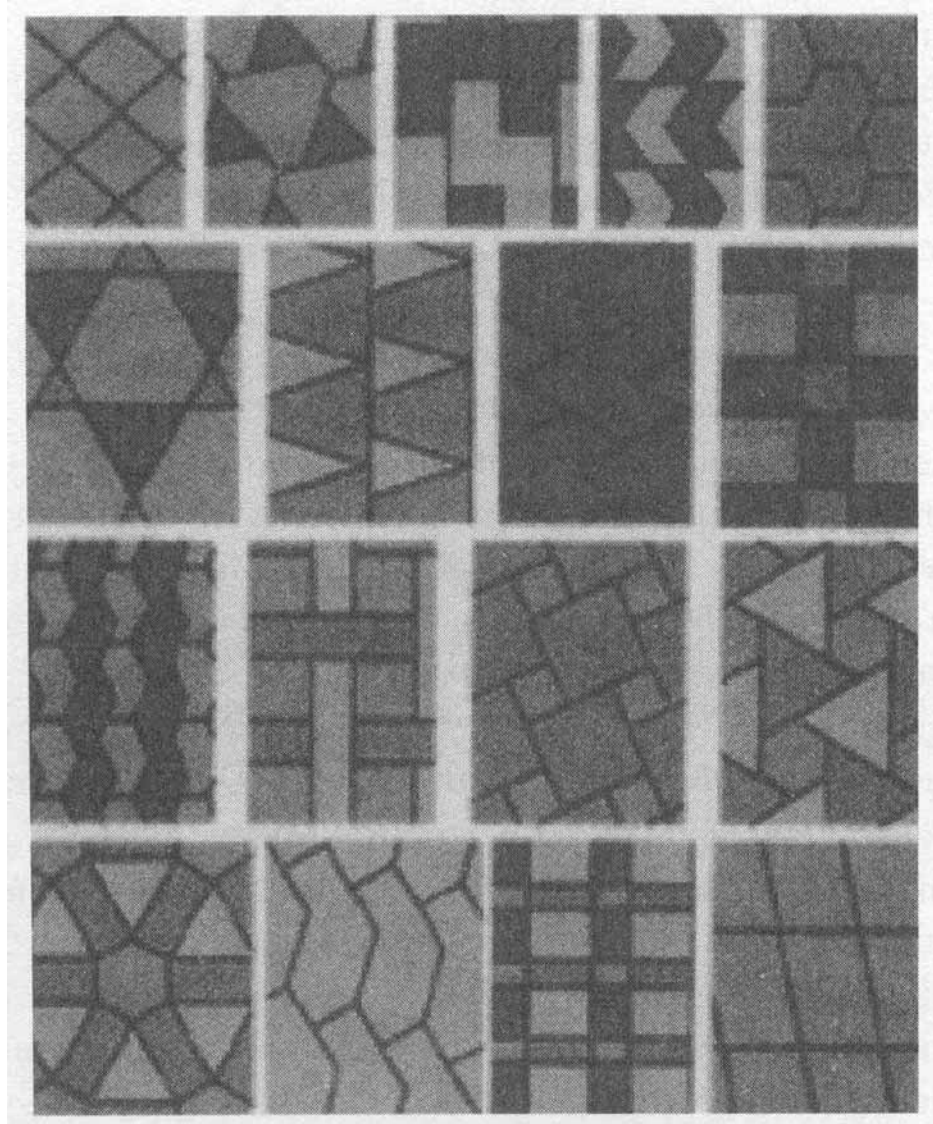


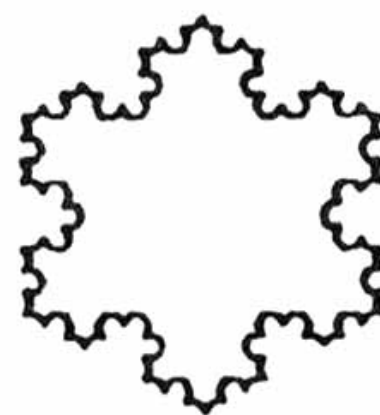
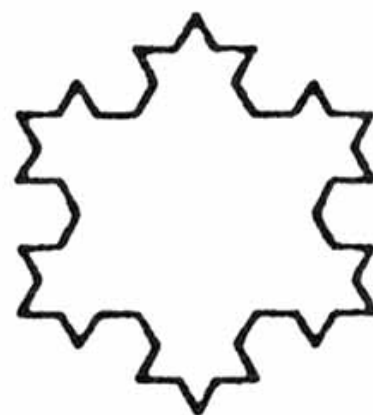
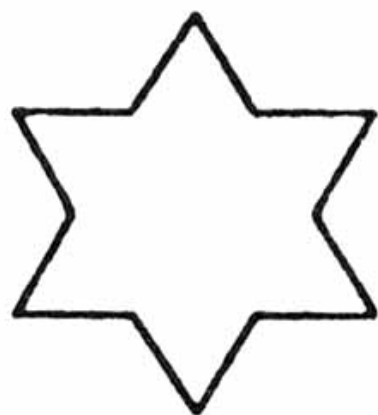
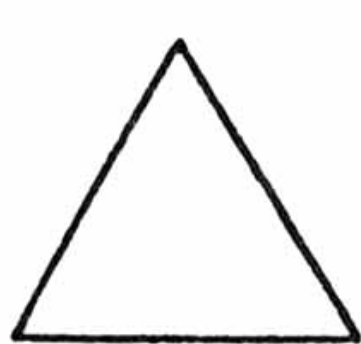
tetrahedron



dodecahedron



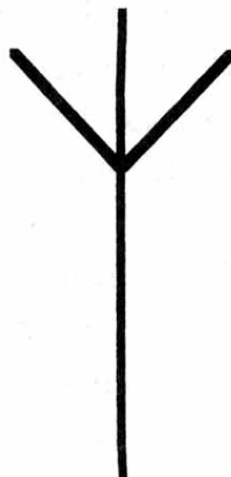




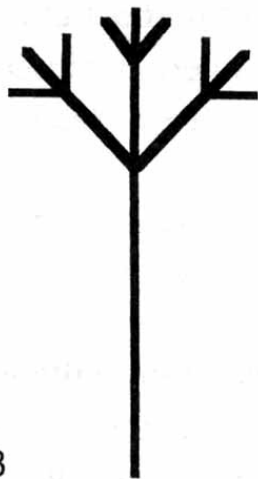
1



2



3



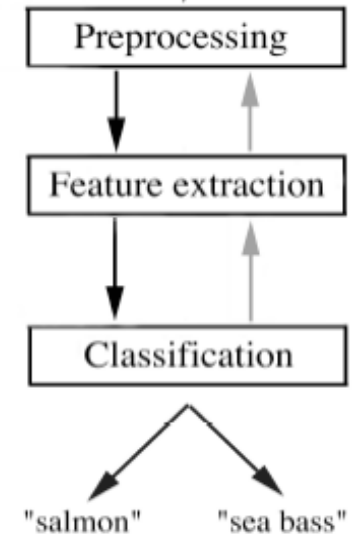
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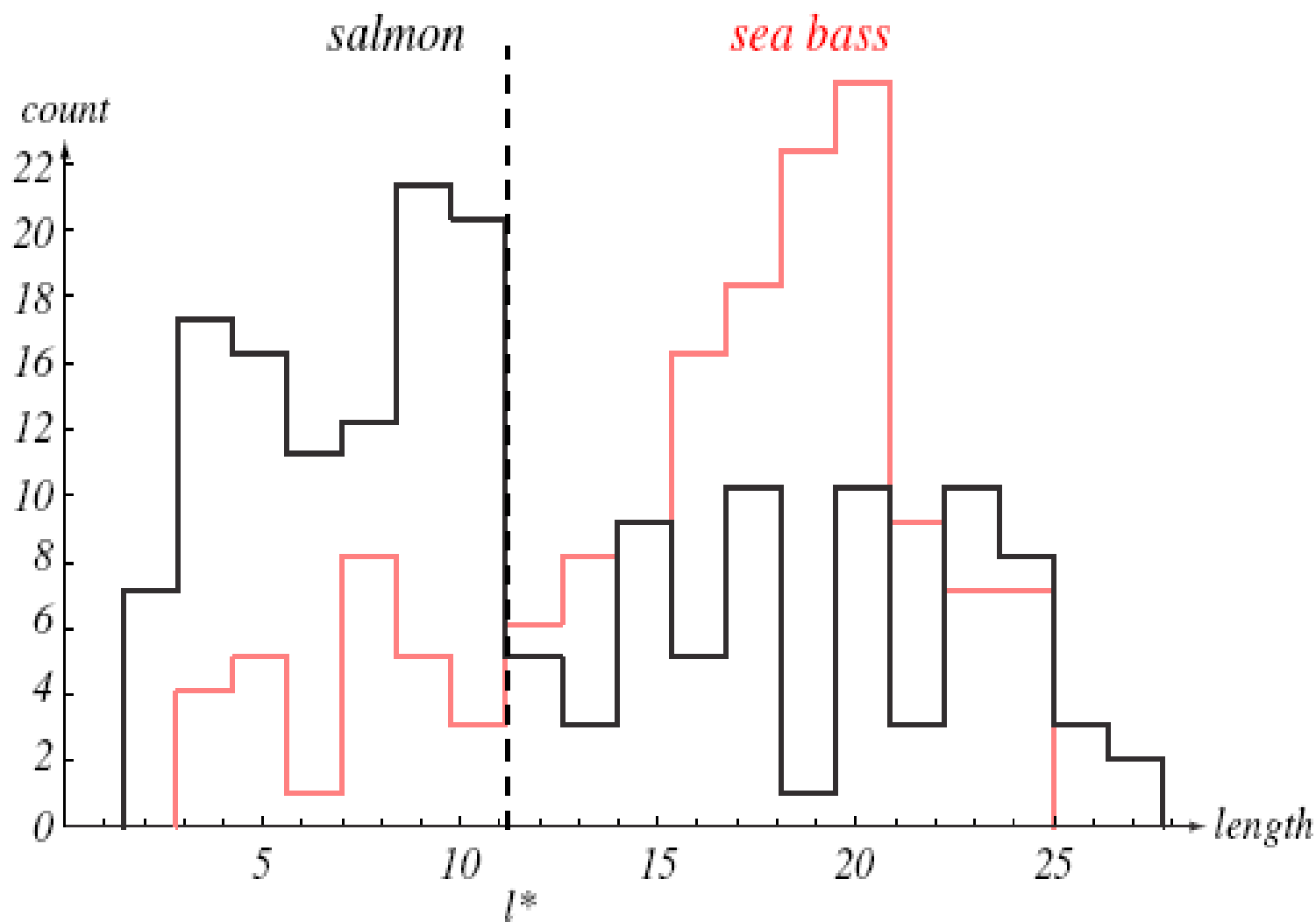


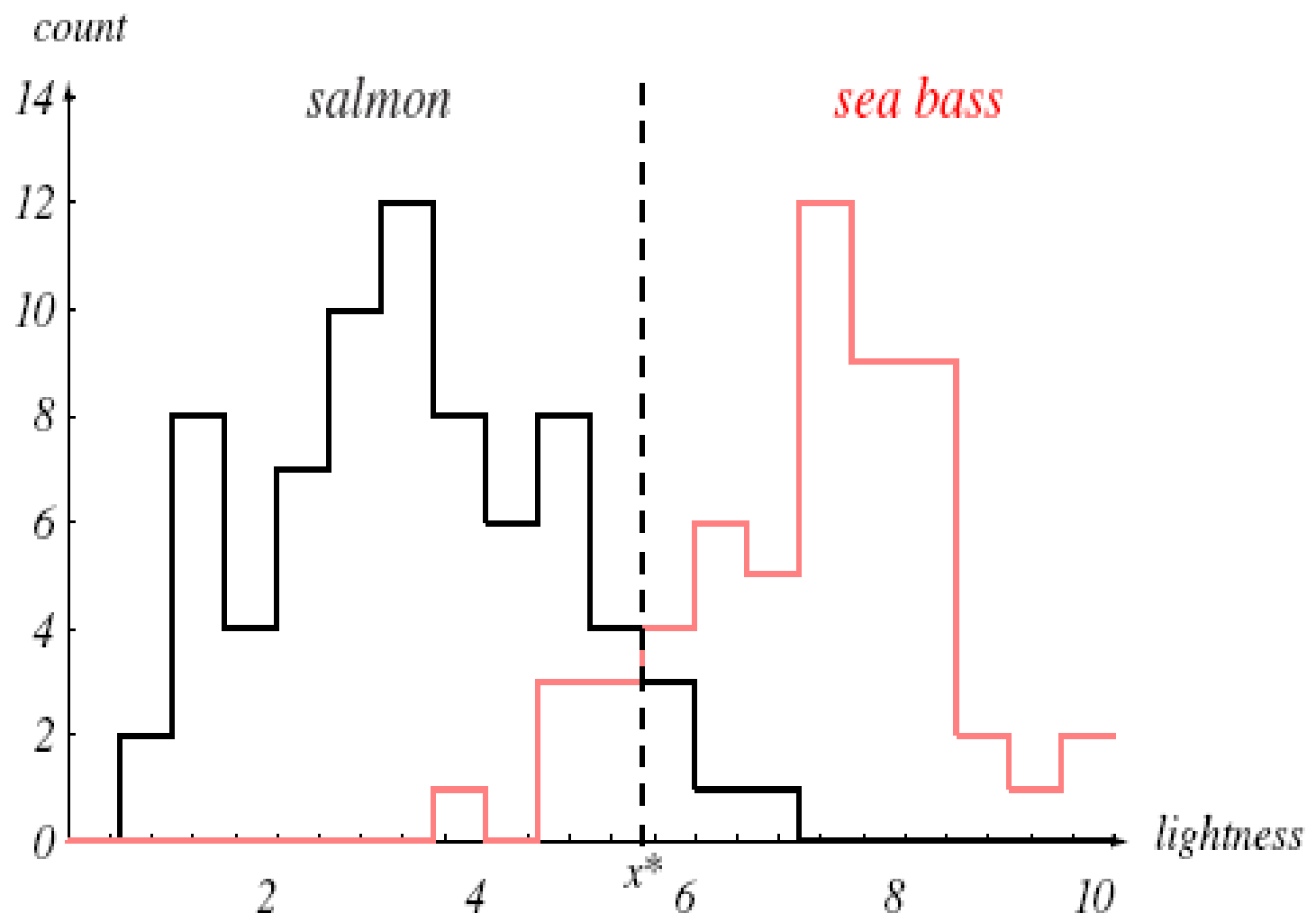


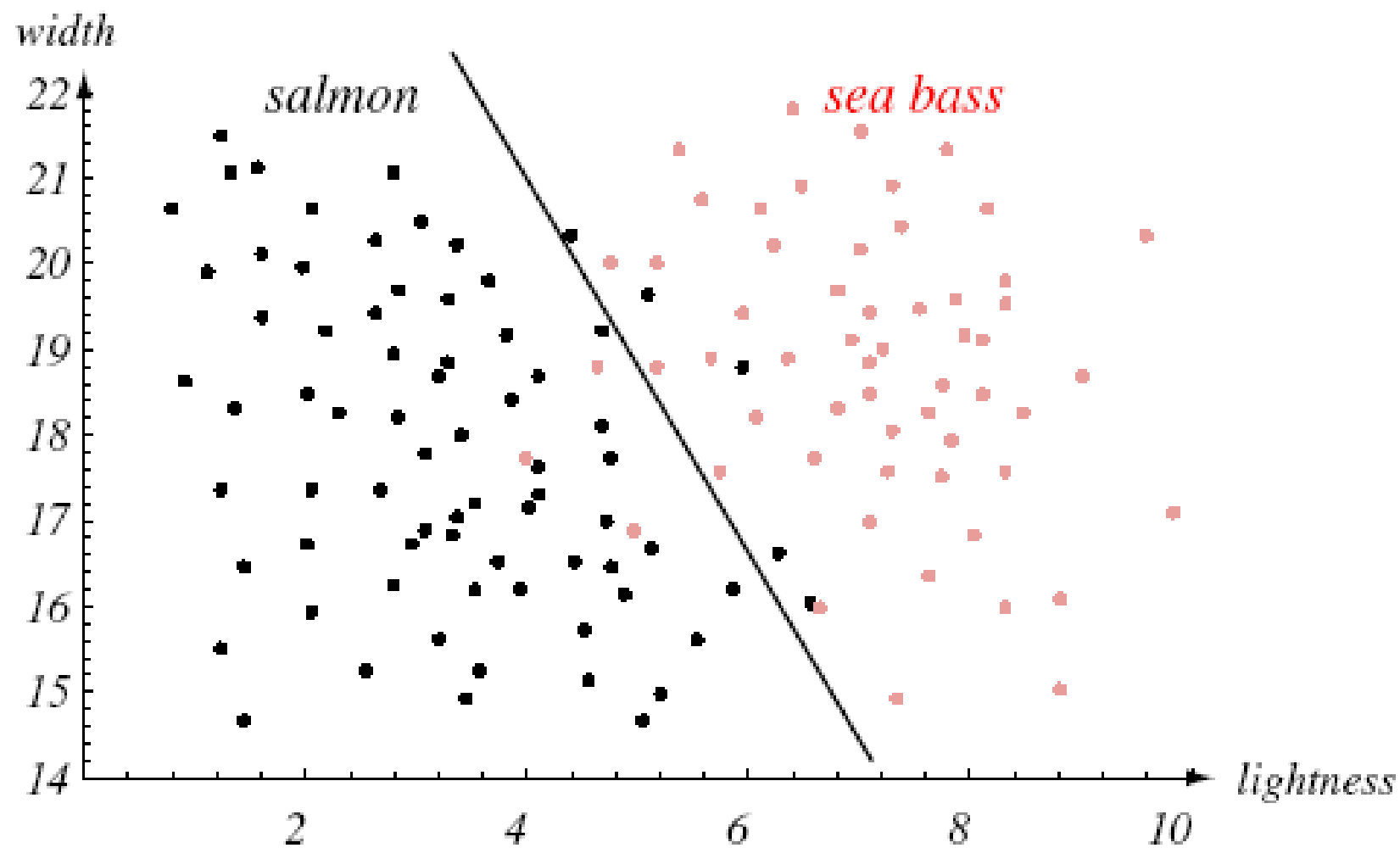


Pattern Recognition









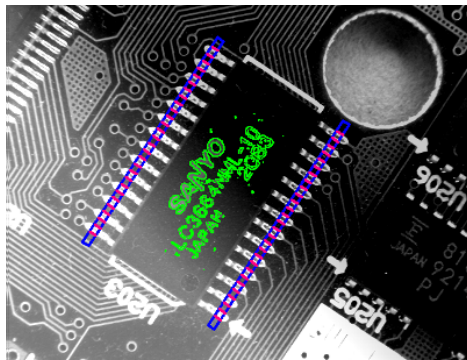


Real-Time Object Recognition:

Definition and Motivation

- Definition of object recognition
 - Determination of the location of a 2D-object in the image
 - Location of the object is described by:
 - Object position
 - Object orientation
- Prerequisite for many applications in industries, e.g.:

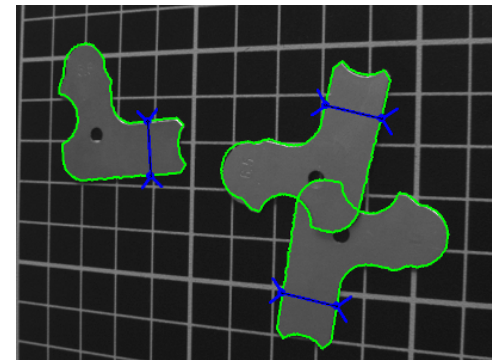
semiconductor inspection



print image quality control



„Pick-and-Place“



Object Recognition Procedure

- Procedure is composed of three components
 1. Camera calibration and rectification
 2. Robust with respect to perspective distortion
 3. Recognition of inflexible objects
 4. Robust with respect to occlusion, disturbances, brightness fluctuation and noise
 5. Accurate
 6. Real-time compliant
 7. Recognition of composed objects

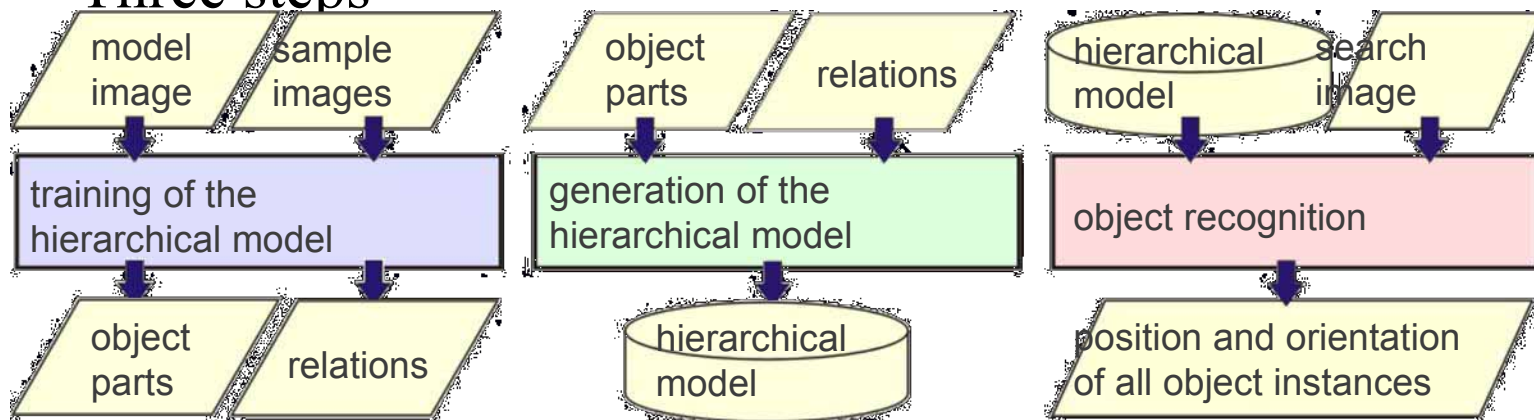
Recognition of composed objects

Recognition of inflexible objects

Camera calibration and rectification

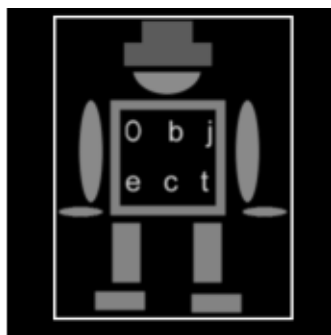
Recognition of Composed Objects

Three steps

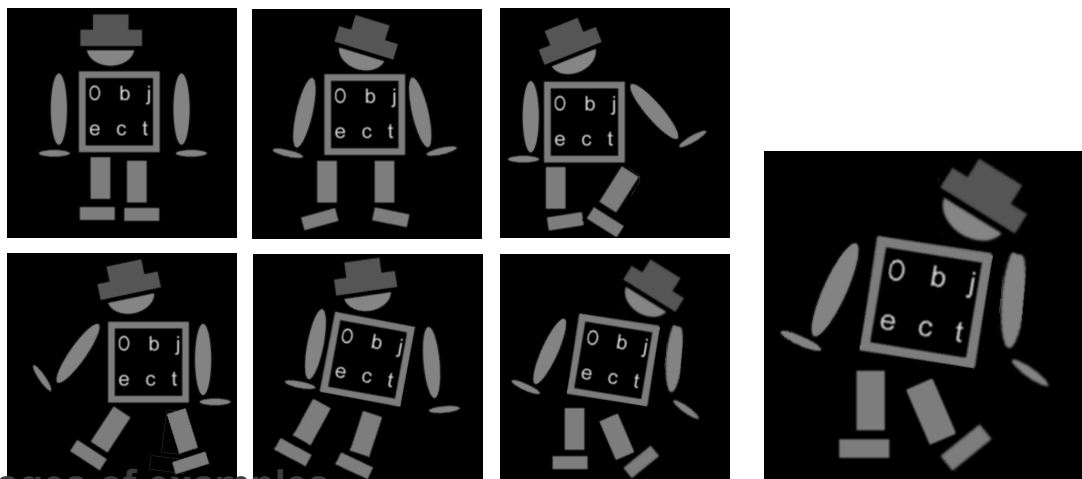


Example

Image of model

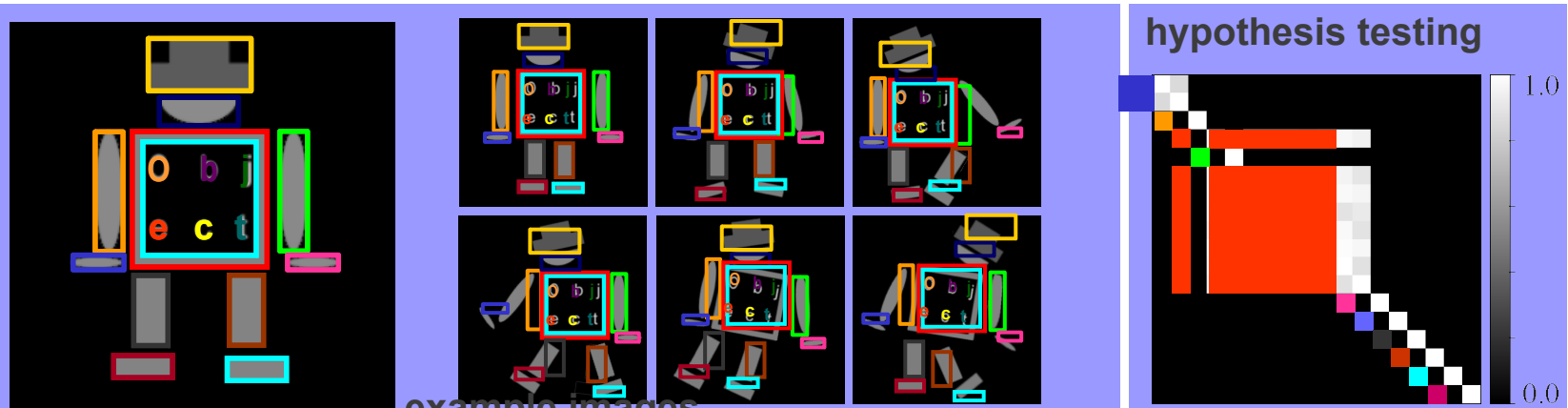


Images of examples

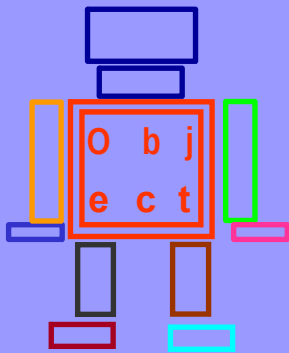


Step 1: Training of a Hierarchical Model

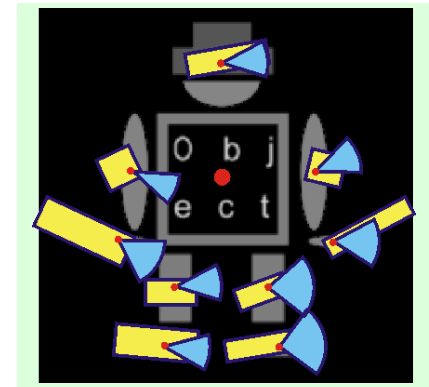
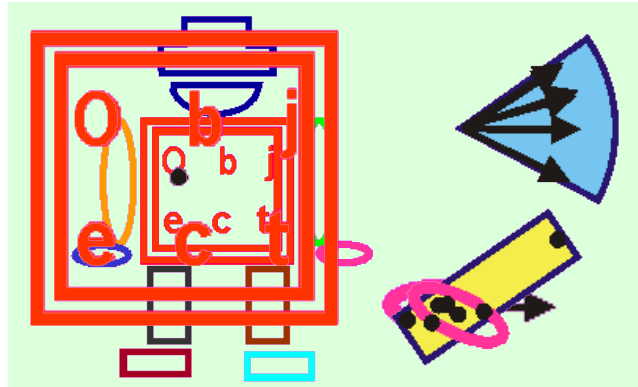
- Determination of un-deformable object parts



Clustering



■ Determination of relations



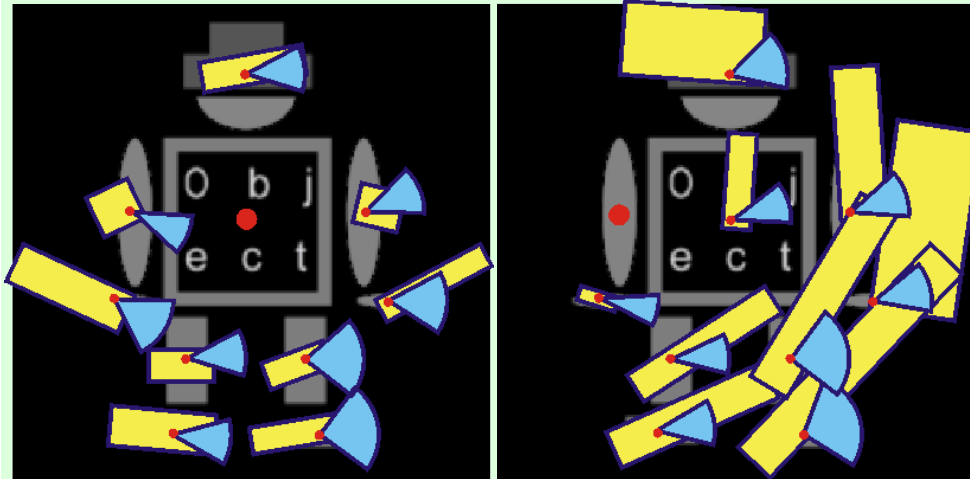
Step 2: Generation of the Hierarchical Model

- Goal: Minimization of computation time during object recognition
- Idea:
 - Only **one** object part is extracted from the image
 - Remaining object parts are extracted recursively

Quantization of the search

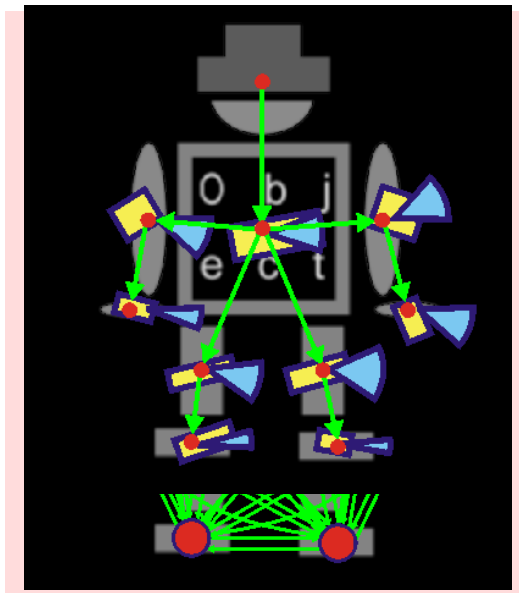
■ efforts $\Omega_{i,\phi}$

$$\Omega_{i,\phi} = \phi(\rho\epsilon\lambda\alpha\tau\iota\omicron\nu\sigma, \dots)$$



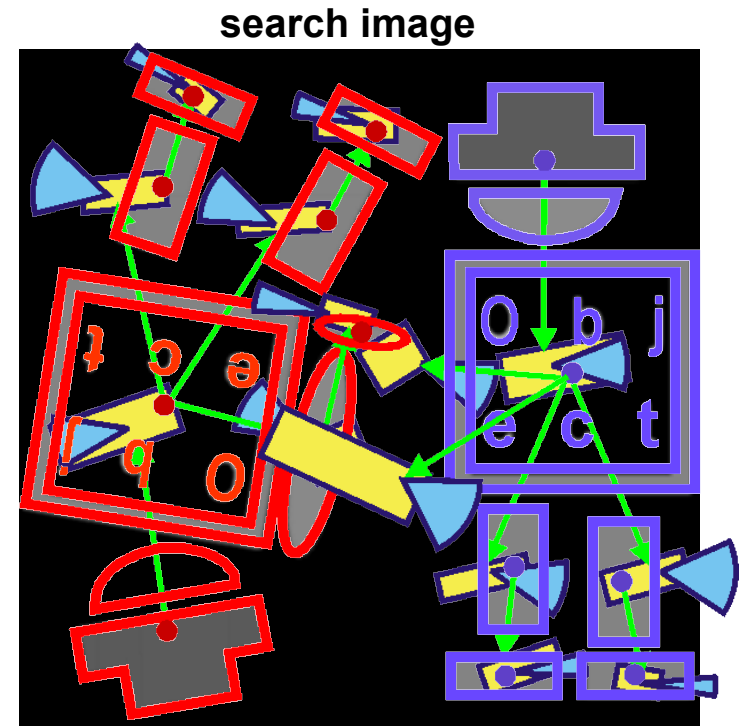
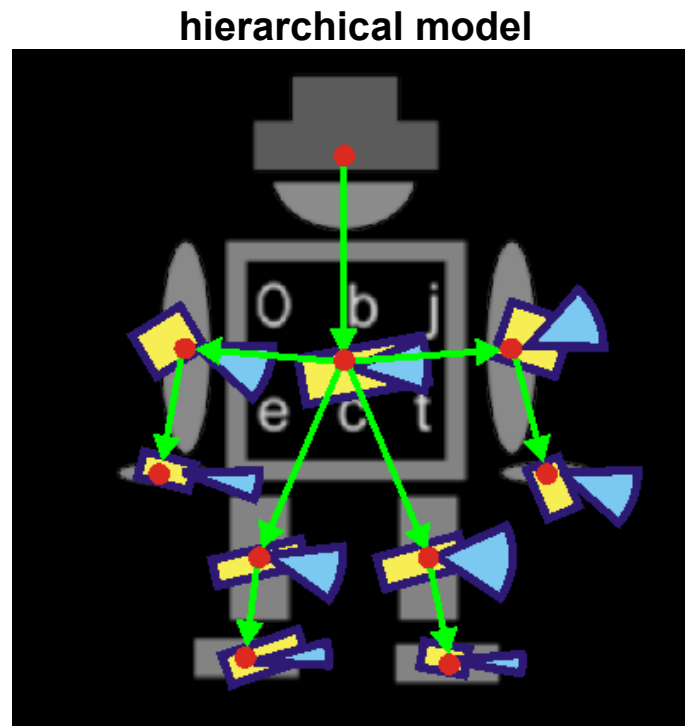
■ Optimization of search

$$\sum \Omega_{i,j} \rightarrow \min$$



Step 3: Object Recognition

- Hierarchical search

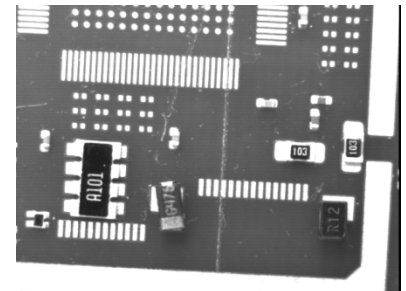
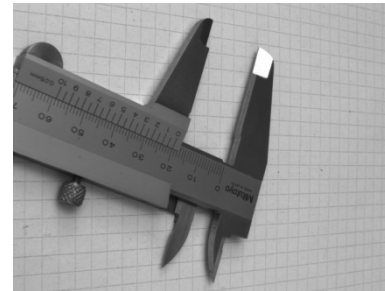
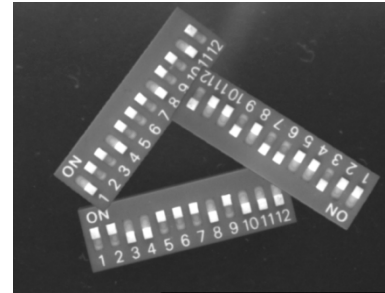


- Advantages in comparison with independent extraction of object parts

- Real-time feasibility (z.B. here: 20 ms instead of 310 ms)
- Inherent correspondence analysis

Examples

- Gas Pipe Pliers
- DIP-Switch
- Minimum Durability
- Sliding Caliper
- Comparison:
-



Recognition
of fixed
objects

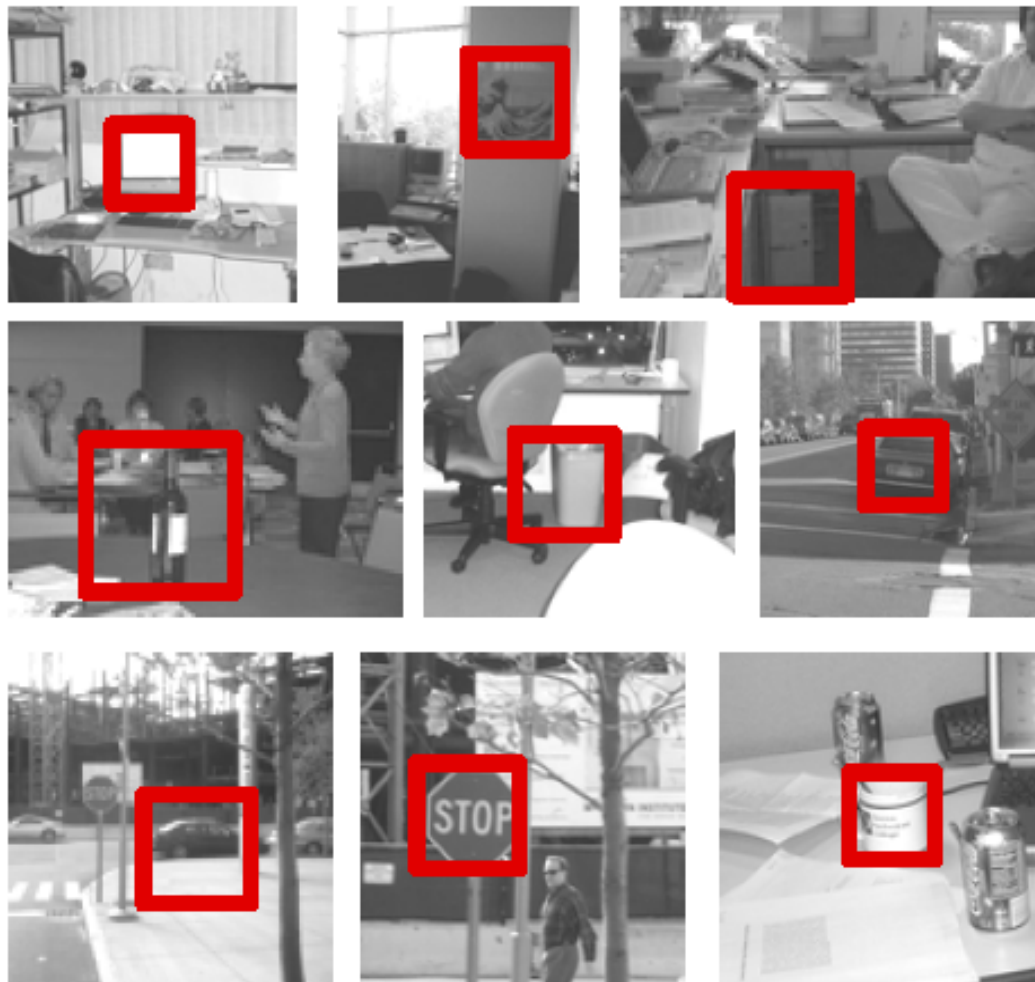
Recognition
of composed
objects



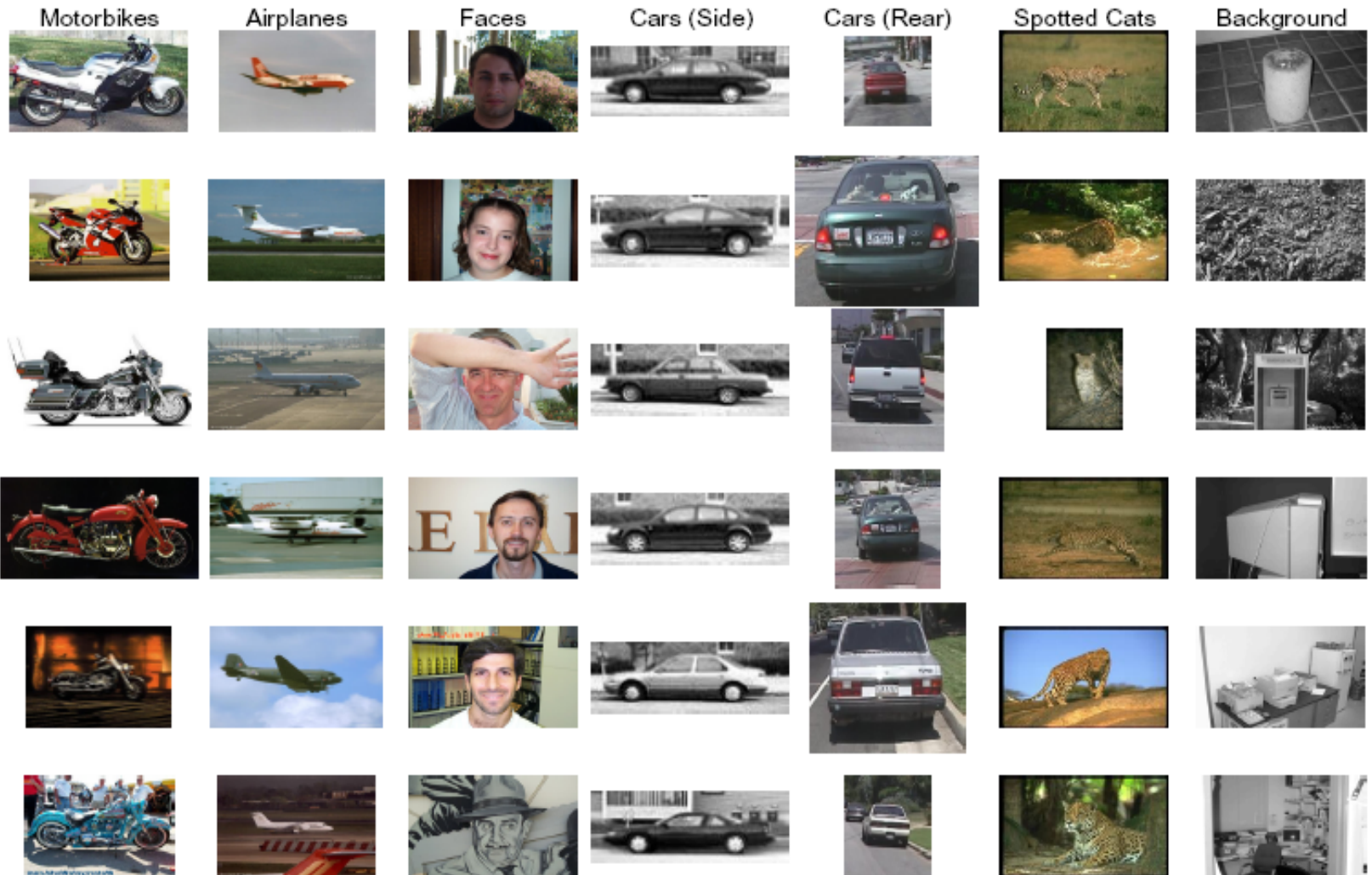
Object Categorization: Two Object Categories



Objects and Clutter/Context



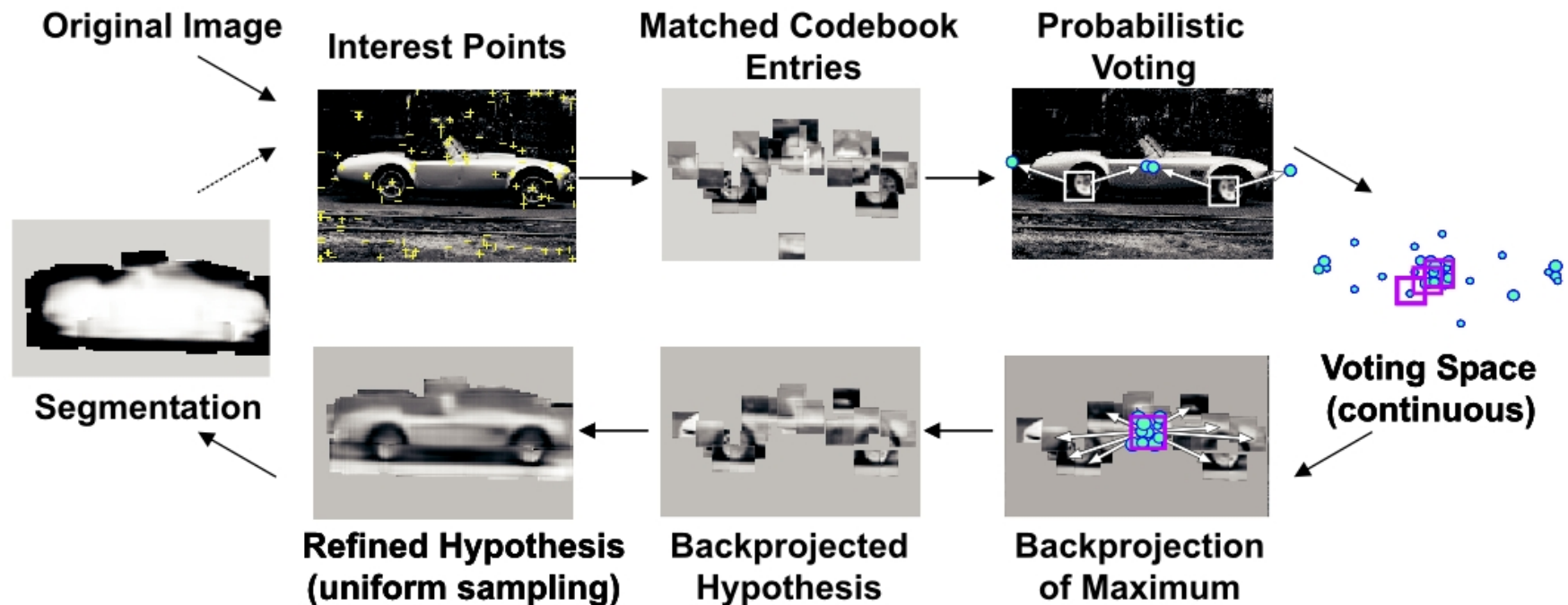
Different Object Categories and “In-Category” Variations



Problems/Challenges/Topics

- Object parts
- Geometry / mutual position of parts
- Automatic identification of (new) object categories
- Geometric normalization / identification of control pts.
- Invariants: gray value, scale, affine/projective transf.
- Unsupervised Training under clutter
- Size of training sets
- Variability of appearance: category, parts
- Variability of shape: deformations, also: position of parts
- Handling of occlusions
- Extraction of salient features: points, edges, regions
- “Transformation of image to numbers”: feature vector
- Grouping of features
- Classification: Bayesian decision theory
- Model and estimation of model parameters
- Which features to use for which object categories?
- Learning: improvement of learned model parameters
- Automatic procedure: generic approaches

An Approach to Object Categorization (Leibe, 2004)



It's a miracle that curiosity survives formal education

(Albert Einstein)

