

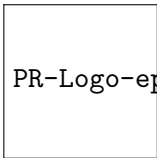
# Pattern Recognition Lecture

## “Summary, Applications, and Conclusions”

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# Topics

No	Topic
01	Introduction and Outline
02	Classifiers Based on Bayes Decision Theory
03	Linear Classifiers
04	Nonlinear Classifiers
05	Feature Selection
06	Feature Generation I
07	<del>Feature Generation II</del>
08	Template Matching
09	Context-Dependent Classification
10	<del>Supervised Learning: The Epilogue</del>
11	Clustering: Basics Concepts
12	Clustering Algorithms I: Sequential Algorithms
13	Clustering Algorithms II: Hierarchical Algorithms
14	Clustering Algorithms III: Schemes Based on Function Optimisation
15	Summary, Applications, and Conclusions

**Adaptive Learning of Context  
for Pattern Recognition**

# Overview

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# Basic Stages of Pattern Analysis

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# Scientific Methods for Pattern Recognition

## Example


- Generic Appearance-Based Statistical Object Recognition

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# Industrial Systems for Pattern Recognition

## Example

- Automatic Sorting of Aluminium Alloys



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## Properties

- Concrete Application Domain
- Problem-Specific Features

# Adaptive Learning for Pattern Recognition

## **Development Phase**

- Generic System for Pattern Recognition
- Multiple Sensors, Features, and Classifiers

# Adaptive Learning for Pattern Recognition

## **Development Phase**

- Generic System for Pattern Recognition
- Multiple Sensors, Features, and Classifiers

## **Supervision Phase**

- Application for a Concrete Task
- Labelling of Misclassified Patterns by a Supervisor
- Adaptive Optimisation of the Processing Chain

# Adaptive Learning for Pattern Recognition

## **Development Phase**

- Generic System for Pattern Recognition
- Multiple Sensors, Features, and Classifiers

## **Supervision Phase**

- Application for a Concrete Task
- Labelling of Misclassified Patterns by a Supervisor
- Adaptive Optimisation of the Processing Chain

## **Recognition Phase**

- Further Application without Supervision

# Basic Stages of Pattern Analysis

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# Semantic Gap in Image Understanding

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# Overview

# Research Areas

## **Multimodal Object Recognition and Scene Analysis**

- Origin: University of Erlangen-Nuremberg
- Finalised: Appearance-Based Statistical Object Recognition
- Ongoing: Object Recognition in Multimodal Sensory Data
- Ongoing: Skeleton-Based Representation of Articulating Objects
- Ongoing: Matching of 3D Objects Based on 3D Curves
- Ongoing: Adaptive Learning of Context for Object Recognition

# Research Areas

## **Semantic Multimedia Analysis and Retrieval**

- Origin: Queen Mary, University of London
- Finalised: Content-Based Video Retrieval
- Ongoing: Classification of Environmental Organisms in Microscopic Images
- Ongoing: Event Detection in Video Data
- Ongoing: Adapting to User Preferences based on Relevance Feedback

# Research Areas

## **Behavioural Biometry and Medical Image Processing**

- Origin: University of Koblenz-Landau
- Finalised: Spatial Reasoning for Medical Image Understanding
- Ongoing: Depression Screening Based on Multi-Sensory Smartphone Data
- Ongoing: Ontology-Based Medical Image Processing

# Overview

# Training Phase

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# Turntable and Camera Arm

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# Turntable and Camera Arm

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# Object Pose

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# Hand-Held Camera

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# Hand-Held Camera

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# Pose Parameter Reconstruction

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# Grey Level Images

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## 2D Local Feature Vectors

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## 2D Feature Extraction with Wavelet Transform

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# Colour Images

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## 6D Local Feature Vectors

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## Object Area

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Object Area  $O = O(\phi, \mathbf{t})$

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# Statistical Object Modelling

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# Statistical Background Modelling

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# Statistical Object Model

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# Statistical Object Model - Summary

$$\Omega_{\kappa} \longrightarrow \mathcal{M}_{\kappa} = \mathcal{M}_{\kappa}(\phi, \mathbf{t})$$

1. Object Area

$$O_{\kappa} = O_{\kappa}(\phi, \mathbf{t})$$

2. Densities for Object Features

$$p(\mathbf{c}_m) = p(\mathbf{c}_m | \mu_m, \sigma_m, \phi, \mathbf{t})$$

3. Densities for Background Features

$$p(\mathbf{c}_m) = p_b$$

# Context Modelling

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# Training Phase Completed

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# Recognition Phase

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## Single-Object, One Image

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# Classification and Localisation Algorithm

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# Single-Object, Multiple Views

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# Multi-Object Scenes without Context

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# Multi-Object Scenes with Context

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# Recognition Phase Completed

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# Experiments and Results

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# Image Database 3D-REAL-ENV

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# Training Images

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# Test Images HomBack

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# Test Images LessHetBack

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# Test Images MoreHetBack

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## Single-Object, One Image

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# Classification and Localisation Rates

Distance of Training Views 4.5°	Classification			Localisation		
	Hom. Back.	Less Het. Back.	More Het. Back.	Hom. Back.	Less Het. Back.	More Het. Back.
Gray Level	100%	92.2%	54.1%	99.1%	80.9%	69.0%
Colour	100%	88.0%	82.3%	98.5%	77.8%	73.6%



# Single-Object, Multiple Views

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## Multi-Object, Without Context

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# Multi-Object, With Context

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# Evaluation Completed

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# Adaptive Learning for Object Recognition

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- Ongoing: Ontology-Based Medical Image Processing

# Existing Collaborations

## **Multimodal Object Recognition and Scene Analysis**

- Prof. Ryszard Tadeusiewicz, AGH Krakw
- Prof. Longin Jan Latecki, Temple University in Philadelphia
- Prof. Walter Kropatsch, Vienna University of Technology
- Prof. Andreas Kolb, University of Siegen
- Prof. Rolf Lakaemper, Temple University in Philadelphia
- Prof. Dietrich Paulus, University of Koblenz-Landau
- Prof. Zygmunt Pizlo, Purdue University
- Prof. Frank Deinzer, University of Applied Sciences Würzburg

# Existing Collaborations

## **Semantic Multimedia Analysis and Retrieval**

- Prof. Grzegorz Nalepa, AGH Krakw
- Prof. Volker Blanz, University of Siegen
- Prof. Stefan Rüger, The Open University
- Prof. Christoph Ruland, University of Siegen
- Prof. Kuniaki Uehara, Kobe University
- Prof. Beihai Zhou, University of Technology Beijing

# Existing Collaborations

## **Behavioural Biometry and Medical Image Processing**

- Prof. Jarek Krajewski, University of Wuppertal
- Prof. Elmar Nöth, University of Erlangen-Nuremberg
- Prof. Steffen Staab, University of Koblenz-Landau
- Prof. Veit Braun, Neurosurgery Department, Jung-Stilling Hospital Siegen

# Long-Term Scientific Vision

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