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## Website

The website for this course can be reached via

<http://kogs-www.informatik.uni-hamburg.de/~neumann/HBD-WS-2004/>

You will find PDF copies of the slides and possibly other useful information related to the course.

The website will be updated each week on Friday.

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## Introduction: What is High-level Vision?

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## What is Computer Vision?

*Computer Vision is the academic discipline dealing with task-oriented reconstruction and interpretation of a scene by means of images.*

<b>scene:</b>	<b>section of the real world</b> stationary (3D) or moving (4D)
<b>image:</b>	<b>view of a scene</b> projection, density image (2D) depth image (2 1/2D) image sequence (3D)
<b>reconstruction and interpretation:</b>	<b>computer-internal scene description</b> quantitative + qualitative + symbolic
<b>task-oriented:</b>	<b>for a purpose, to fulfill a particular task</b> context-dependent, supporting actions of an agent

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## What Is High-level Vision?

*High-level vision is the task of "understanding" a scene beyond single-object recognition. Typical examples are traffic scene understanding for driver assistance, inferring user intentions in smart-room scenarios, recognizing team behavior in robocup games, discovering criminal acts in monitoring tasks.*

### Characteristics:

- Interpretations involve several objects and occurrences.
- Interpretations depend on temporal and spatial relations between parts of a scene
- Interpretations describe the scene in qualitative terms, omitting geometric details.
- Interpretations include inferred facts, unobservable in the scene.
- Interpretations are based on conceptual knowledge and experience about the world.

"Scene understanding" means roughly the same as "high-level vision".

## Examples for High-level Vision (1)



high-level  
vision means  
understanding  
every-day  
occurrences

Garbage collection in Hamburg (1 frame of a sequence)

We want to recognize parts, activities, intentions, spatial & temporal relations

## Examples for High-level Vision (2)



High-level vision  
is silent movie  
understanding

Buster Keaton in "The Navigator"

We want to recognize episodes, the "story", emotions, funnyness

## Some application scenarios for high-level vision

- street traffic observations (long history)
- cameras monitoring parking lots, railway platforms, supermarkets, nuclear power plants, ...
- video archiving and retrieval
- soccer commentator
- smart room cameras
- autonomous robot applications  
(e.g. robot watchmen, playmate for children )

## Characteristics of High-level Scene Interpretation Tasks

- interpretations typically involve several interrelated objects
- spatial and temporal relations are important
- interpretations may build on common sense knowledge
- application scenarios are highly diverse
- domains may be very large
- learning and adaptation may be required
- reliability and complexity management may become important issues
- economical application development requires generic approach

## Cognitive Computer Vision

High-level vision is strongly related to "cognitive vision", a term created for vision comparable to human vision:

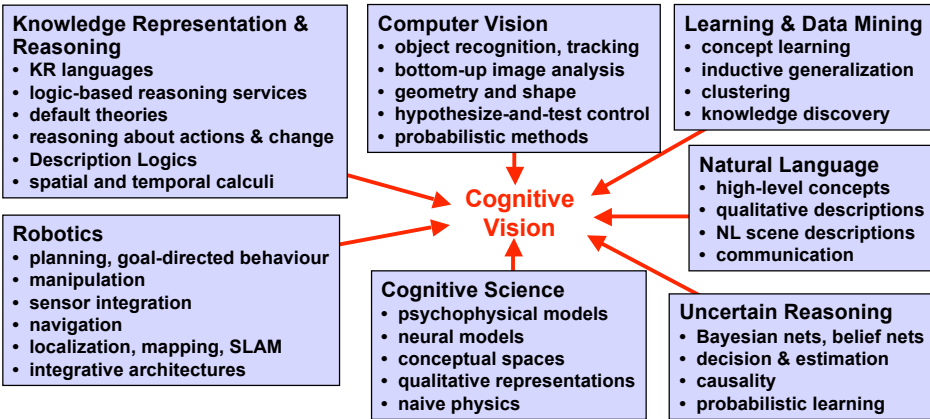
*Cognitive computer vision is concerned with integration and control of vision systems using explicit but not necessarily **symbolic models** of **context, situation and goal-directed behaviour**. Cognitive vision implies functionalities for **knowledge representation, learning, reasoning** about events & structures, recognition and categorization, and goal specification, all of which are concerned with the **semantics** of the relationship between the **visual agent** and its environment.*

Topics of cognitive vision:

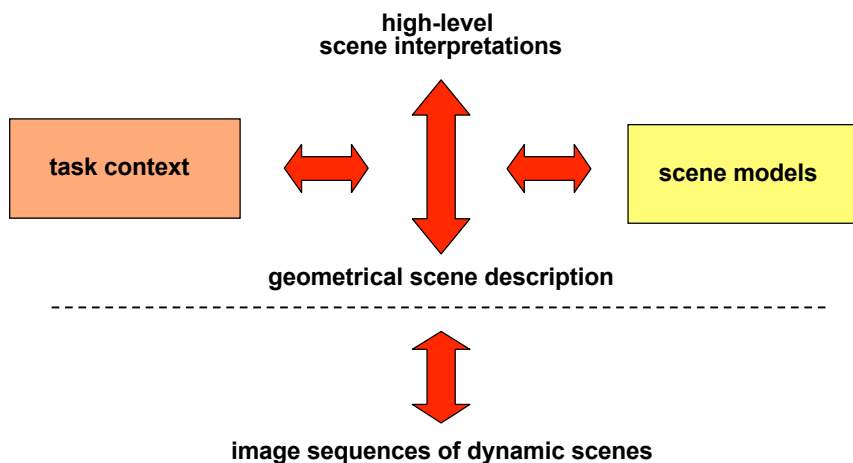
- integration and control
- explicit models
- not necessarily symbolic
- context
- situation
- goal-directed behaviour
- knowledge representation
- learning
- reasoning
- recognition
- categorization
- goal specification
- visual agent

## Multidisciplinary Contributions to Cognitive Vision

Cognitive Vision research requires multidisciplinary efforts and escape from traditional research community boundaries.



## Basic Structure of High-level Scene Interpretation



## Representation Levels for High-level Scene Interpretation



## Context and Task Dependence

Interpretations may depend on

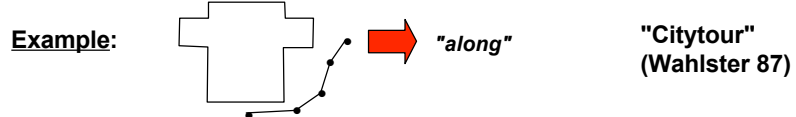
- domain context
- spatial context
- temporal context
- intentional context
- task context
- communicative context
- focus of attention
- a priori probabilities

Constructing an interpretation is not a mapping from image data into interpretation space.

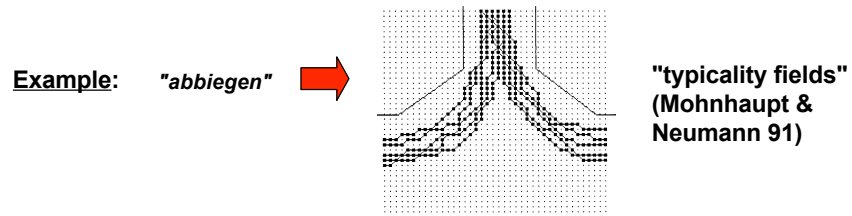


## Signal-symbol Problems (1)

### Mapping from quantitative into qualitative representations

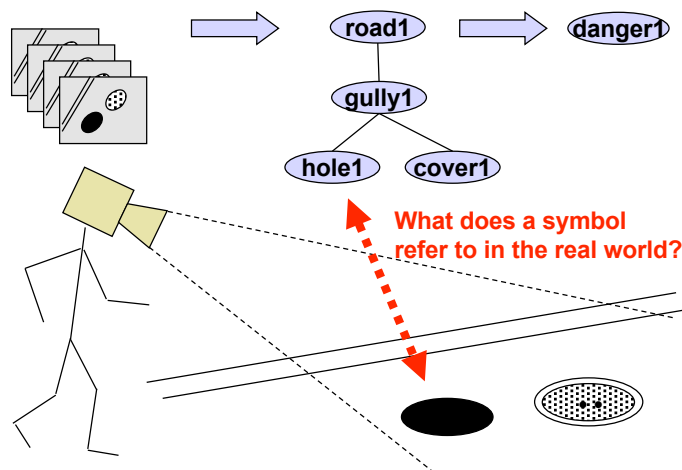


### Mapping from qualitative into quantitative representations



## Signal-symbol Problems (2)

### Symbol grounding



## Signal-symbol Problems (3)

### Grounded symbolic reasoning

Deductions from symbolic knowledge about a scene should not only be correct w.r.t. to the underlying logic but also w.r.t. to common sense.

**Examples:**

- (implies (and house (some near lake)) mosquito-house)
- (instance house1 house)
- (instance lake1 lake)
- (related house1 lake1 near)
- (instance house1 (not (mosquito-house)))
- => inconsistent!

- (instance house1 house)
- (instance cup1 cup)
- (related house1 cup1 inside)
- => inconsistent???



## Uncertainty Problems (1)

### Fuzzyness of concepts

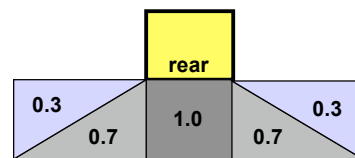
Many high-level concepts have unsharp boundaries.

"behind" "overtake" "meet"

=> mapping into logical propositions may be problematic

- Fuzzy set theory offers "degree of applicability"

- Probability theory offers statistical measures for language use

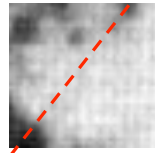
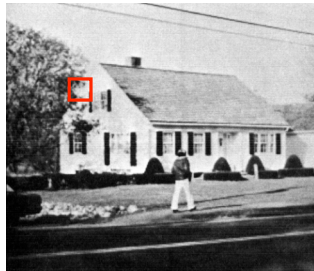


Fuzzy definition of behind

## Uncertainty Problems (2)

### Uncertainty of data

#### Example: Object boundaries



house boundary is not discernible

Image interpretation is fundamentally ill-defined

## Uncertainty Problems (3)

### Exploring multiple hypotheses

Answers from several disciplines:

- graph matching
- heuristic search
- optimization theory
- logic theories
- probability & utility theory
- case-based reasoning
- neural networks
- particle physics  
(and others)

Mixed bottom-up and top-down interpretation strategies  
have been rarely explored

## Uncertainty Problems (4)

### Cultural clash between logical and probabilistic reasoning

Probabilistic methods are not yet seamlessly integrated with logical calculi

Interesting recent developments:

- First-order probabilistic inference (Poole 03)
- Probabilistic relational models (<http://dags.stanford.edu/PRMs/>)

Example for reasoning in image interpretation:

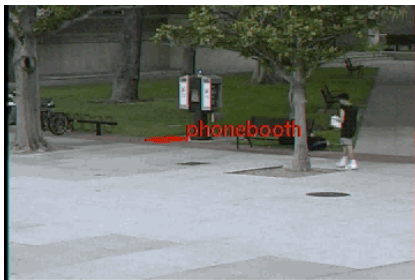
(from Kanade's invited lecture at IJCAI-03:  
"Computer Vision: AI or Non-AI Problem?")

car on left side of street  
(uncertain orientation of car)

japanese signs => left-hand traffic

} orientation of car resolved

## A State-of-the-art Example of Scene Interpretation



recognizing assaults



recognizing thefts at  
a phonebooth