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## Seminar: Tutorielle Systeme

**Veranstalter:** Helmut Horacek, Magdalena Wolska

**Ort und Zeit:** Mi., 16-18 Hörsaal 3, Geb. E1.3  
(Vorbesprechung und Anmeldung 24.10.)

**Kursseite:** <http://www.coli.uni-sb.de/courses/its-ws0708>  
<http://www.ag.s.uni-sb.de/~horacek/tutor-nl.html>

**Beschreibung:** In dieser Veranstaltung werden intelligente tutorielle Systeme in Bezug auf die Verwendung natürlichsprachlicher Interaktion behandelt (Analyse, Generierung, Dialog, tutorielle Strategien, ... )

**Vorträge wahlweise in Deutsch oder Englisch (Englisch präferiert)**

**Gemeinsame Veranstaltung mit Computerlinguistik**

**Leistungspunkte je nach anwendbarer Studienordnung (siehe Kursseite)**

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## Organization

**Those who did not receive an Email by Magdalena Wolska:**

**Please write us an email, to get your address right!**

**Those who are not scheduled for talks yet:**

**Please write us an email about your preferences within 1 week!**

**We will publish the schedule on the website**

**In case of too high demand, we will arrange extra lectures**

**We will mail you access information for the preprint of the book**

**BSc/MSc Informatik and CuK Students:**

**Please register by 1.12. in <http://frweb.cs.uni-sb.de/03.Studium/011.HISPOS>!**

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# What is an intelligent tutoring system (ITS)?

## *Tutoring task*

**Categories of human tutoring:**

**Classroom, one-to-one tutoring**

## *Features of intelligent tutors*

**Not just a collection of instances of tutor reactions**

**Abstraction into descriptions of tutorial settings**

**Mechanisms that mimic aspects of human tutoring**

**Reasonable handling of unexpected student reactions**

**Features met by some tutoring systems:**

**Mixed initiative, interactive learning, instructional modeling, self-improving**

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# Why building and using intelligent tutoring systems?

## *Benefits of tutoring*

**Teaching is necessary to acquire knowledge and skills**

**Constructivist teaching – learning unique for each individual**

**Students may make mistakes, query processes, monitor their own progress**

**Inquiry and social discussion**

**essential for critical thinking, problem solving and reasoning**

## *Motivation for ITS*

**Overcoming the bottleneck of human tutors**

**Availability of expertise and teaching material**

**But: operationalization of tutoring capabilities increasingly difficult**

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# GUIDON – the first intelligent tutoring system

## *Domain of tutoring*

**Teaching medical knowledge**

**Classification and problem solving**

## *Size of the system*

**400 domain rules**

**200 tutoring rules**

## *Main achievement as an ITS*

**Explicit separation of domain knowledge and pedagogical knowledge**

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## A tutoring session with Ms. Lindquist (algebra tutor)

- T1:** Hello. (After presenting a 'bike-trip' problem).  
Please write an expression for the total time the trip took. (symbolize)
- S1:** Help! (The tutor breaks down the problem into steps)
- T2:** Let me ask an easier question. Please compute the time actually on the bikes if instead the speed was 20 miles per hour, the time of the break was 2 hours, and the distance ridden was 100 miles?
- S2:** 7
- T3:** Correct. What math did you do to get that 7?
- S3:**  $2+5$  (Student does not completely articulate)
- T4:** Okay. But how did you get the 5? (similar to T3)
- S4:**  $100/20$
- T5:** Correct. Now lets try this again, what math did you do to get the 7?  
(same question as T3 but inserting the phrase 'lets try this again')
- S5:**  $2+100/20$  (correct articulation)
- T6:** Correct. Now write your answer of ' $2+100/20$ ' using the variables given in the problem. (generalize like T4 from previous example)
- S6:**  $b+m/s$
- T7:** Correct.
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## Some tutoring skill incorporated in Ms. Lindquist

### *Teaching techniques – implementing human strategies*

**Partitioning/simplifying the problem**

**Elaborating instantiations**

**Combining and abstracting partial solutions**

### *Communicative behavior*

**Encouraging attitude**

**Accepting partially correct answers**

**Emphasizing discourse coherence**

### *Innovations*

**Feedback not based on explicit buggy rules**

**Chains of hints as progressively more explicit messages**

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# IMPORTANCE OF NATURAL LANGUAGE

## *Empirical investigations*

**Natural language communication makes tutoring effective**

**[Moore 2000]**

**Presenting reasoning structures in natural language increases subjects' performance**

**[Di Eugenio et al. 2002]**

**Natural language evaluative arguments convey object preferences more effectively**

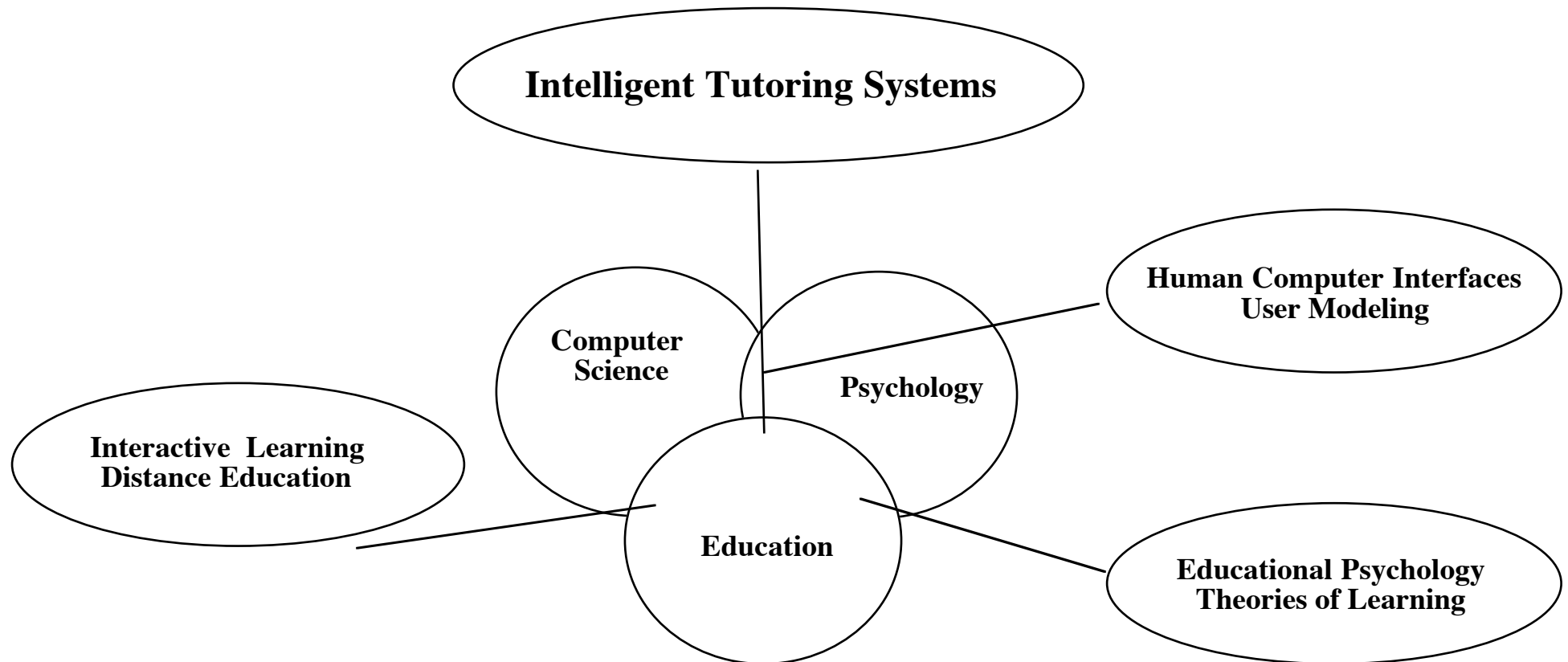
**[Carenini, Moore 2001]**

**Preference of natural language variant shown to be *statistically significant***

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# Building an ITS is an interdisciplinary activity



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# Components of an ITS

*Domain module*

*Student module*

*Tutoring module*

*Communication module*

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## Knowledge relevant for an ITS (1)

### *Domain knowledge*

**Model of expert knowledge**

**Topics, subtopics, definitions or processes**

**Skills needed to generate algebra equations, administer medications, ...**

### *Student knowledge*

**Describes how tutor reasons about a student's presumed knowledge**

**Represents each student's mastery of the domain**

**(acquired skills, time spent on problems, hints requested, possible misconceptions, correct answers, preferred learning style)**

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## Knowledge relevant for an ITS (2)

### *Tutoring knowledge*

**Teaching strategies: methods for providing remediation, examples, ...**

**Reasoning about the use of materials, feedback, and testing**

**(empirical observations, learning theories, technology-enabled)**

### *Communication knowledge*

**Methods for communication – graphical interface, animated agents, dialog**

**Communication motivates and supports students**

**Ensures that a tutor follows a student's reasoning**

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# Cognitive science techniques

## *Model-tracing tutors*

**Model of the domain used to interpret student actions and solution paths**

**Cognitive representation of tasks, mostly a result of careful task analysis**

**Tutor traces a student's implicit execution of the encoded rules**

**Assumes that all problem solving steps can be identified and explicitly coded**

**Assumes that student performs the same reasoning as encoded in the rules**

## *Constraint-based tutors*

**Pedagogically significant states expressed as constraints**

**Constraints represent the application of a piece of declarative knowledge**

**Detect and correct student errors which appear as violated constraints**

**Constraints represent states the student should satisfy, not the paths involved**

**Applied in intractable domains, domains that cannot be fully articulated**

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# Teaching strategies

## *Didactic strategy*

**Student's problem solving accompanied by piece-wise explanations**

**Student in some sense navigates in a normative problem-solving space**

## *Socratic strategy*

**Student's problem solving is guided and supported by hints**

**Aims at enabling a student's knowledge construction**

**Socratic teaching generally considered superior:**

**Long term benefits achieved, harder for students (takes more time)**

**Support knowledge transfer (applying skills to related tasks and domains)**

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## Communication of tutors – a classification

### *Mixed-initiative dialog*

**Only few NL tutors support full mixed initiative dialog**

### *Single-initiative dialog*

**Limited discourse context considered**

### *Directed dialog*

**Tutor controls the dialog, prompts students for explicit information, ...**

### *Finessed dialog*

**Dialog simulated through menu-based input, logical forms, ...**

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## Two excerpts of sessions with the geometry tutor

**S1:** Angles are equal.

**T1:** Are any two angles congruent? What tells you that there are two congruent angles?

**S2:** Angles in a triangle are equal.

**T2:** That is a bit imprecise. Are ALL angles in ALL triangles congruent?

**S3:** Angles in an isosceles triangle are equal.

**T3:** Correct, except to: are all three angles in an isosceles triangle congruent?

**S4:** Base angles in an isosceles triangle are equal. (correct)

...

**S5:** They are 180

**T5:** Could you be more specific? Who are *they*? And what tells you they are 180?

**S6:** The angles are 180

**T6:** You are heading in the right direction, but you need to state this rule more precisely. First, where does the 180 come from? Are all angles 180?

**S7:** The angles in a triangle are 180.

**T7:** You are awfully close. But is each angle measure equal to 180? Precisely what is 180?

**S8:** The sum of the angles in a triangle are 180. (correct)

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## Issues in the communication of tutors

### *Dialog strategies*

**Only few NL tutors support full mixed initiative dialog**

### *NL analysis*

**Limited discourse context considered**

### *NL generation*

**Tutor controls the dialog, prompts students for explicit information, ...**

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# The role of emotion in tutoring

## *Recognising the mood of the student*

**Interpreting sequences of student actions**

**(some even monitor facial expressions)**

**Selecting/adapting system actions to boredom, frustration, enthusiasms, ...**

## *Teaching environments*

**Use of animated agents**

**Examining the effects of various forms of agents**

## *Preventing misuse*

**Gaming – just clicking to get maximum feedback in minimal time**

**Cheating – producing absurd or off-the-topic contributions**

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# Evaluating tutoring systems

## *Techniques*

**Specifying conditions to be tested**

**Experiments with a featured group and a control group**

**Computing the effect of the difference – statistically significant?**

## *Problems*

**Experiments are expensive – picking most important properties**

**Capturing system/teaching properties to be tested**

## *Examples*

**Geometry curriculum with ITS significantly better than traditional form**

**Linguistically adequate presentations improve performance significantly**

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## ITS as a scientific field

### *Research community*

**Annual conferences since 20 years, approx. 200 participants**

**A dedicated journal, presence in related conferences and journals**

### *Domains of application*

**Facilitating learning in groups (classroom)**

**Ono-to-one tutoring in physics, mathematics, programming, formal design ...**

### *Success*

**Significantly improved learning with ITS**

**Cognitive tutors for algebra and geometry in use in more than 1300 US schools**

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## The DIALOG project (SFB 378)

### *Goal*

**Participating in a flexible natural language tutorial dialog**

**Empirically investigating dialogs in teaching mathematical proofs**

### *Architecture – modular design*

*Learning environment* – getting acquainted with some lesson material

*Mathematical proof assistant* – checks appropriateness of student's utterances

*Proof manager* – maintains representation of constructed proof object

*Natural language processing* – NL expressions interleaved with formulas

attempts the interpretation of imprecise, ambiguous and faulty utterances

*Dialog manager*– maintains state of dialog and determines system reaction

including an embedded hinting algorithm

*Knowledge resources* – domain and pedagogical knowledge (hint taxonomy)

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# WIZARD-OF-OZ EXPERIMENT 1

## *Goal*

**Collecting a corpus on tutorial dialogs in the naive set domain**

**Testing tutorial strategies developed**

## *Experiment phases*

**Preparation and pre-test on paper**

**Tutoring session mediated by *Wizard-of-Oz* tool**

**Post-test on paper and evaluation questionnaire**

## *Tasks to prove*

**(1)  $K((A \cup B) \cap (C \cup D)) = (K(A) \cap K(B)) \cup (K(C) \cap K(D))$**

**(2)  $A \cap B \in P((A \cup C) \cap (B \cup C))$**

**(3) If  $K(B) \supseteq A$ , then  $K(A) \supseteq B$**

## *Experience gained*

**Socratic strategy not as effective as hoped (long-term effects unexplored)**

**Distracted by lengthy clarification subdialogs resolving low-level issues**

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## WIZARD-OF-OZ EXPERIMENT 2

### *Goal*

**Collecting a corpus on tutorial dialogs about relations (a more advanced topic)**  
**Exploring human hinting strategies in a socratic style**

### *Experiment phases*

**Getting acquainted with the domain and environment on the computer**  
**Tutoring session mediated by *Wizard-of-Oz* and editing tools**  
**Evaluation questionnaire**

### *Tasks to prove*

(1)  $(R \circ S)^{-1} = R^{-1} \circ S^{-1}$

(2)  $(R \cup S) \circ T = (R \circ T) \cup (S \circ T)$  (for relations  $R, S$  and  $T$  over a set  $M$ )

(3)  $(R \cup S) \circ T = (T^{-1} \circ S^{-1})^{-1} \cup (T^{-1} \circ R^{-1})^{-1}$

### *Experience gained*

**Mistakes of various kinds (see the categories on the next slides)**  
**Tutor reactions addressing errors opportunistically**

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## INTERPRETATION OF SLOPPY EXPRESSIONS

- (1)  $A \cup B$  must be in  $P((A \cup C) \cap (B \cup C))$ , since  $(A \cap B) \cup C \supseteq$  of  $A \cap B$
- (2) If  $A$  is a subset of  $C$  and  $B$  a subset of  $C$ , then both sets together must also be a subset of  $C$

Relations ambiguous between *element* and *subset*, resp. *union* and *intersection*

- (3)  $K((A \cup B) \cap (C \cup D)) = (K(A \cup B) \cup K(C \cup D))$ , De Morgan Rule 2 applied to both complements
- (4)  $A \cap B$  on the left side is  $\in$  of  $C \cup (A \cap B)$ , which is extended only by  $C$

Intended referents not mentioned explicitly, scopus preferences apply

Metonymic interpretations required

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# DOMAIN ONTOLOGY

## *Domain knowledge representation*

**Complete logical definitions represented in  $\lambda$ -calculus**

**Inheritance used to percolate shared information, *no* hierarchical organization**

**Only proof-relevant knowledge expressed**

*Discrepancy to linguistic requirements*

## *Discrepancy bridged through intermediate representation*

**Imposing hierarchical organization**

**Linking *vague* and *general* terms to domain terms**

**Additionally modeling *typographic* features (markers, orderings)**

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# ANALYSIS PHASES

## **Preprocessing and parsing**

**Mathematical expressions substituted with default lexical entries**

**Syntactic parsing and building linguistic meaning representation**

**Domain and discourse interpretation (using the semantic lexicon)**

**Symbolic representation built and passed to the proof manager**

**Consulting the tutoring manager with results obtained**

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## EXAMPLES REVISITED

- (1)  $A \cup B$  must be in  $P((A \cup C) \cap (B \cup C))$ , since  $A \cap B \in$  of  $(A \cap B) \cup C$   
only ELEMENT interpretation is *relevant*, SUBSET is *incorrect*
- (2) If  $A$  is a subset of  $C$  and  $B$  a subset of  $C$ , then both sets together must also be a subset of  $C$   
only UNION interpretation is *relevant*, INTERSECTION merely *correct*
- (3)  $K((A \cup B) \cap (C \cup D)) = (K(A \cup B) \cup K(C \cup D))$ , De Morgan Rule 2 applied to both complements  
only separate rule application possible, not their composition, thus disambiguated
- (4)  $A \cap B$  on the left side is  $\in$  of  $C \cup (A \cap B)$ , which is extended only by  $C$   
judged as *incorrect*, since argument types clash with ELEMENT relation
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## HANDLING ERRORS – CORPUS EXAMPLES

<i>Example formula</i>	<i>Error category</i>
(1) $P((A \cup C) \cap (B \cup C)) = PC \cup (A \cap B)$	3
(2) $(p \cap a) \in P(a \cap b)$	2
(3) $(x \in b) \notin A \quad K(A) \supseteq x$	2
(4) $P((A \cap B) \cup C) = P(A \cup B) \cup P(C)$	1
(5) $P(A \cap B) \supseteq (A \cap B)$	1
(6) if $K(B) \supseteq A$ then $A \notin B$	2

**3: Structural errors (1):** Missing space between  $P$  and  $C$ , and enclosing parentheses

**2: Type errors (2,3,6):** Typographical (2), argument type (3), operator type (6)

**1: Logical errors (4,5):** Set inclusion for equality (4), membership for subset (5)

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# ERROR RECOGNITION

## *Components contributing*

### **Formula analyzer**

**Defined repertoire of operators and variables, with arity and type restrictions**

### **Proof manager**

**Tries to find a proof for the assertion, within the defined context**

## *Error categories*

***Structural (syntactic) errors* – Formula analyzer cannot built an analysis tree**

***Type (semantic) errors* – Formula analyzer reports a type mismatch**

***Logical (truth-value) errors* – Proof manager disproves the assertion**

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# ERROR CORRECTION

## *Components contributing*

### **Formula analyzer**

**Performs structural modifications to enable building an analysis tree**

### **Formula modifier**

**Tries to apply cognitively plausible changes to the flawed formula**

## *Formula modifications*

**Local and cognitively justified changes**

**Guided by error category and flawed portion of the formula**

**Searching for modifications that improve the correctness state of the formula**

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