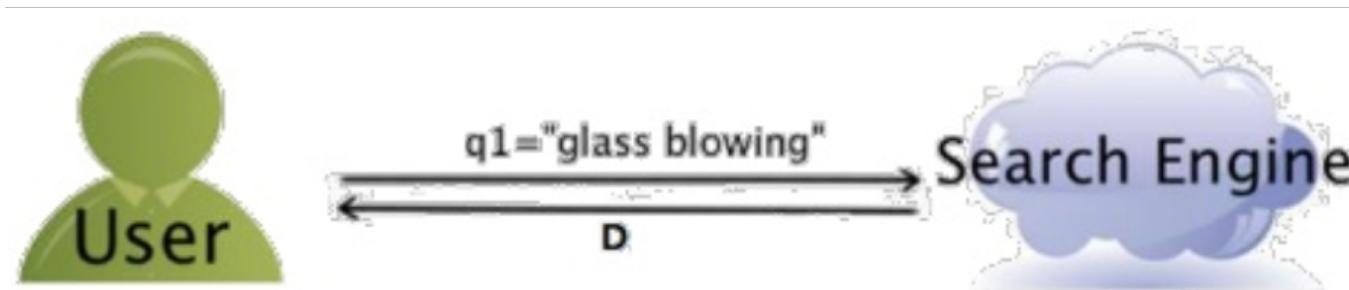


Interactive Information Retrieval

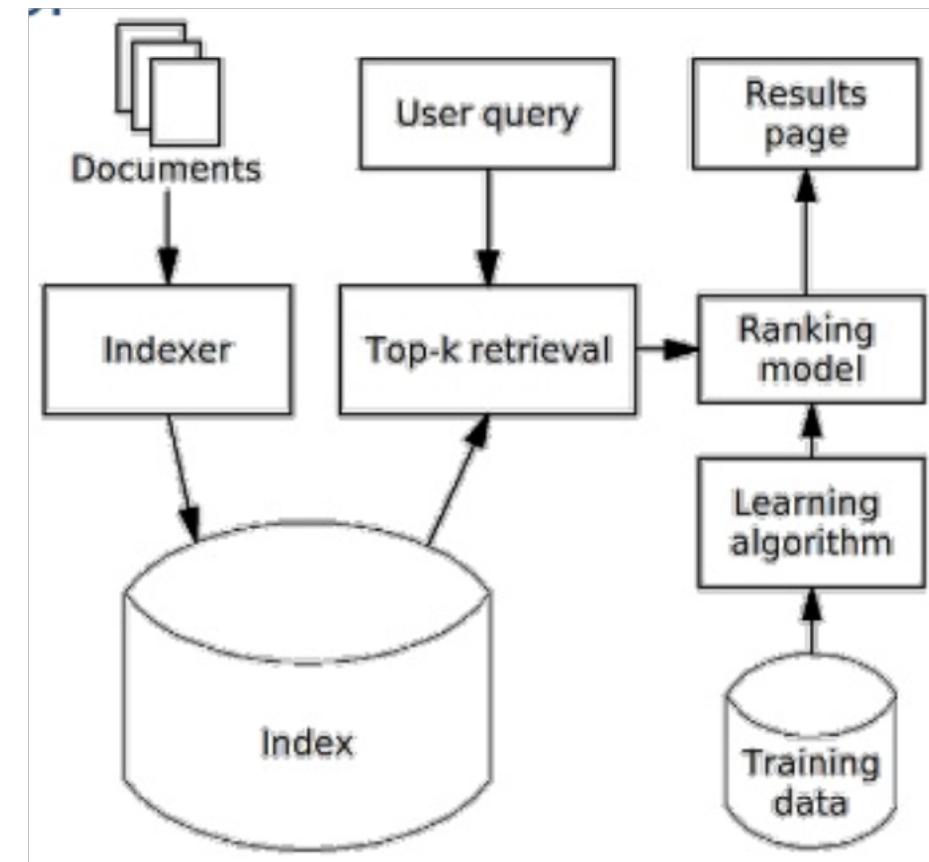
Dorota Glowack
glowacka@cs.helsinki.fi

Static Information Retrieval

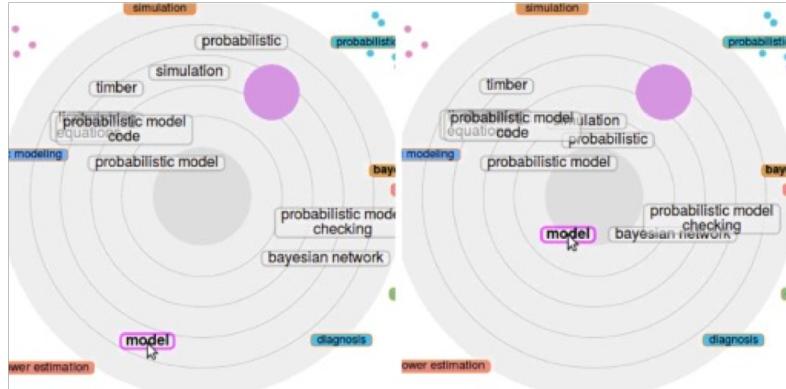
- System does not learn directly from the user
- Parameters updated periodically



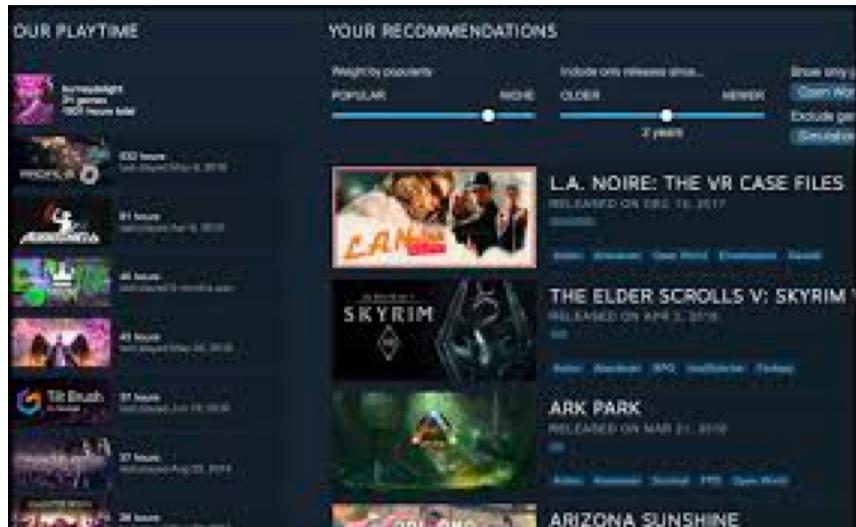
- Aim is to maximize precision and recall
- User's information need is static



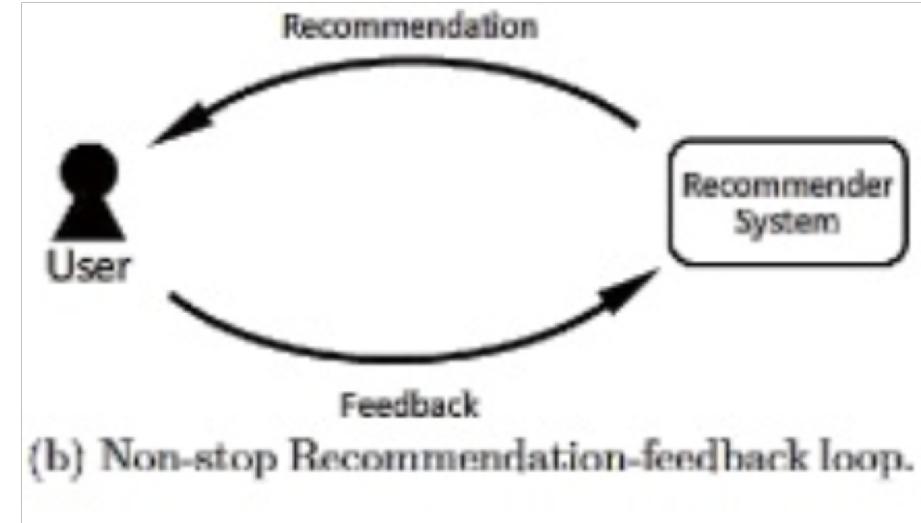
Interactive Recommendation



SciNet scientific literature recommendation



Steam Interactive Games Recommendation



- System learns from user feedback in an interactive setting (while the user is engaged with the system)
- Recommendations improve gradually within the interaction session (and beyond)

Q All

Images

Maps

Videos

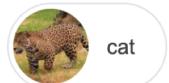
News

More

Settings

Tools

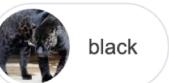
SafeSearch ▾



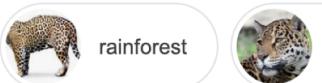
cat



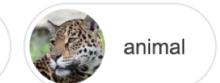
car



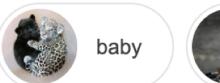
black



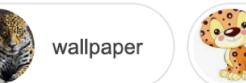
rainforest



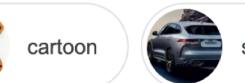
animal



baby



wallpaper



cartoon



suv



wild



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Myydään JAGUAR XF 2018, Hyvi...
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A large image of a jaguar's head and upper body, showing its mouth open and teeth visible. Below the image is a dark overlay with the following text:

Popular Mechanics

Jaguar Facts | Jaguars vs. Leopards

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phys.org

Human centred approach to Information Retrieval

- Cognitive viewpoint of information retrieval:
 - more focus on user needs and how they search for information
 - matching user side and interaction
- Interactive IR
 - more than simply developing interfaces for searching (Shneiderman, Byrd, & Croft, 1998)
 - knowledge of people's search behavior and search context, including the environmental factors that influence behavior (Fidel & Pejtersen, 2004)
- HCIR (Human Computer Information Retrieval)
 - HCI and IR come from different traditions:
 - HCI places more emphasis on usability
 - IR emphasizes system effectiveness

Interactive Information Retrieval

- Goal: study ***user interaction*** with a search system to learn about the user's ***search intent*** and when they encounter relevant documents
- Taking account of user and their ***search context*** can improve understanding of the ***search process*** and the user's intent
- A search system that "knows" this information can improve its performance in retrieving documents that ***satisfy user's needs***
- Awareness of demands imposed on user's ***cognitive processing*** and ***levels of user's knowledge*** can contribute to improvements in system performance.

Interactive Information Retrieval Problems

- IIR research addresses three major problem areas:
 1. Understanding information seeking needs and behaviors;
 2. Developing retrieval systems that respond to information needs and support information seeking behaviors and interactions;
 3. Developing methods and measures to study and evaluate behaviors, interactions and systems.
- Issues
 - Information seeking behavior related information needs and query intent
 - Models of the Information Seeking Process
 - Design of Search User Interfaces and presentation of search results
 - How to evaluate IR systems / Search Quality

Information Seeking Models

- Represent how people search for information in specific environments and how they interact with IRs and/or traditional sources to satisfy information needs
- Models vary based on what researchers investigate:
 - type of user, e.g. novices vs. advanced researchers
 - search environment, e.g. web search vs. online library
 - types of documents/information, e.g. specialised vs. non-specialised literature
 - user's search goal, e.g. looking for a specific documents vs. general browsing
- Commonality across user information seeking

Models of Information Seeking Behaviour

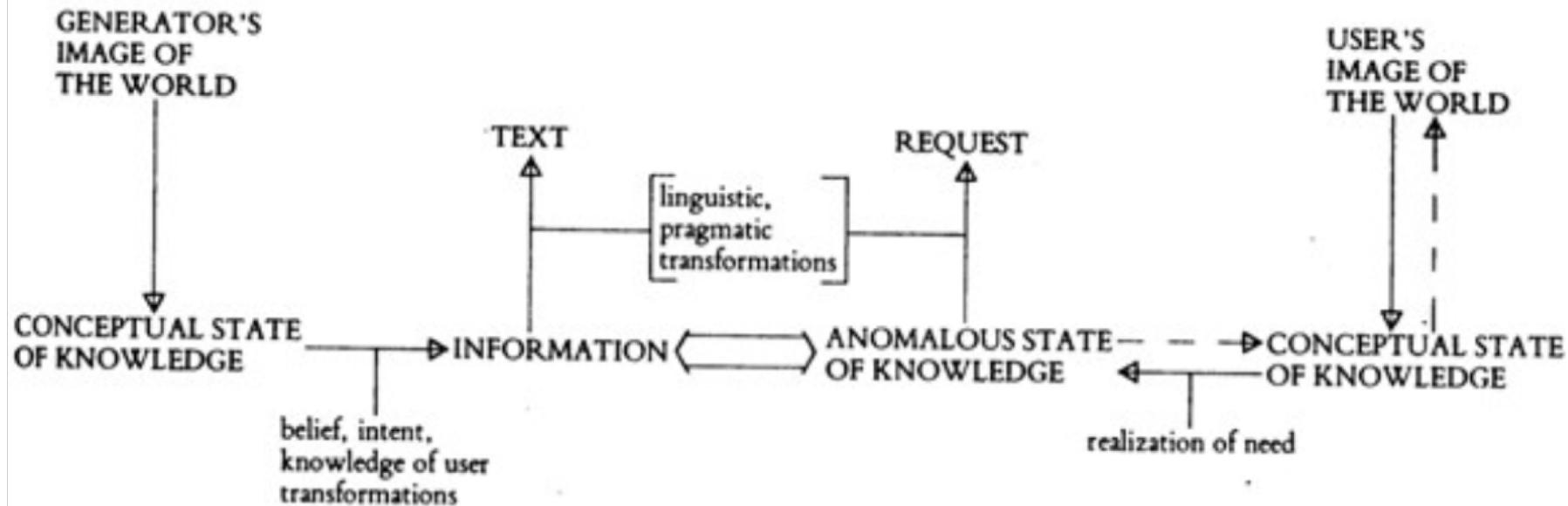
- Belkin's Anomalous State of Knowledge (ASK)
- Bates' berrypicking – acts in searching
- Dervin's sense-making theory – gap, bridge
- Ellis' Information Seeking Process
- Marchionin's Information Seeking Model
- Kuhlthau's information search process
- Ingwersen's cognitive model
- Wilson's information-seeking behaviour model
- Saracevic's model of stratified interaction

Belkin's Model (1984)

- User's information need: Anomalous State of Knowledge (ASK)
- Knowledge gap (anomaly) and the need to solve it
- Difficult for user to specify information needs
- Interview to elicit problem statements to determine the user's ASK
- After ASK determined, formulate query in system's language
- ASK Definition:
A recognition by an individual that his/her model of some aspect of the external world and of her/her position in it with respect to some particular situation is insufficient and knowledge is needed to reduce uncertainty

Belkin's Model

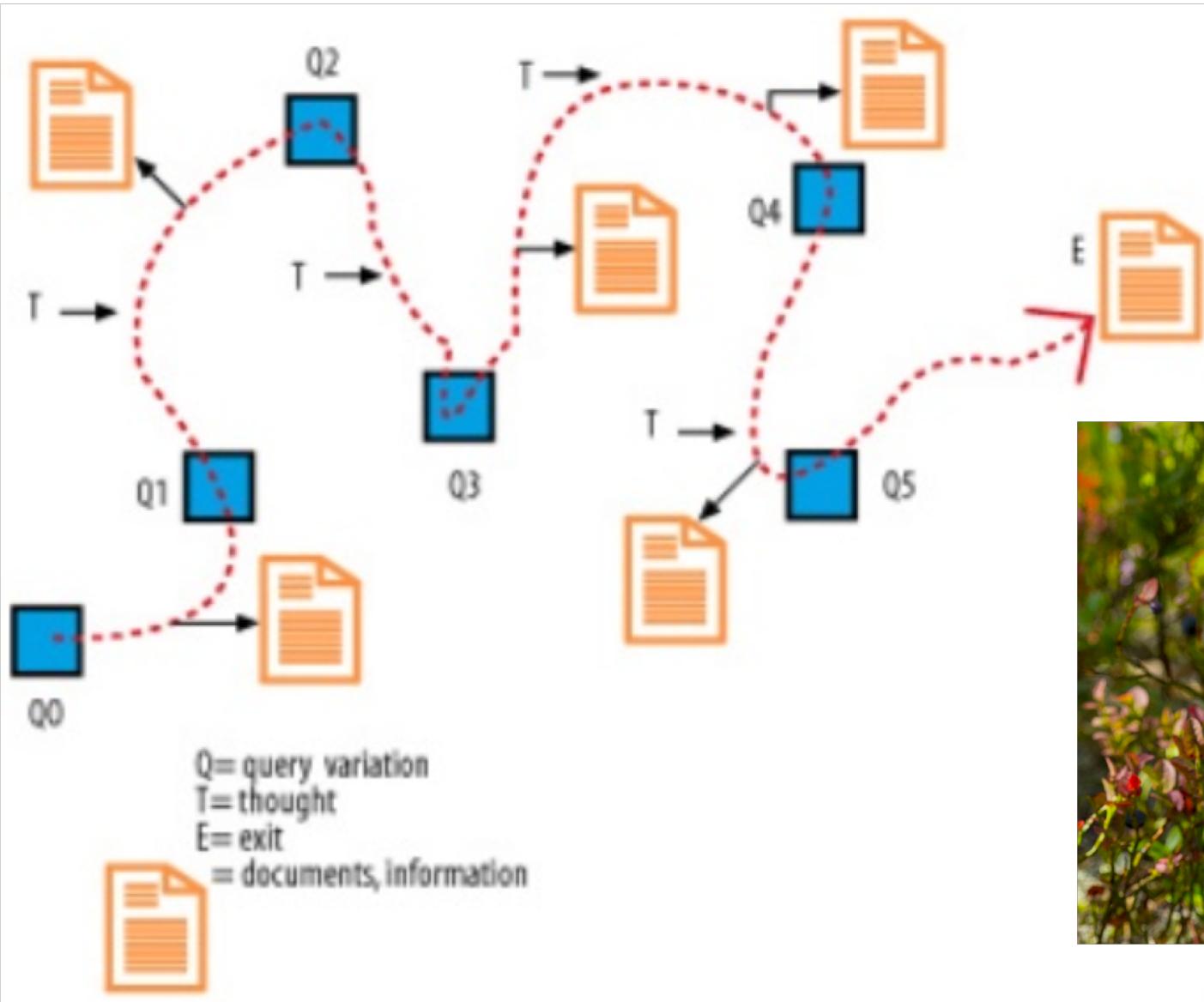
A Cognitive Communication System for Information Retrieval



Contributions of ASK

- Reinforced the certainty of the user's needs
- Recognized the iterative nature of information retrieval
 - users return to the IR system repeatedly to satisfy their information needs
- Move towards system design that is user- rather than system-centered (people rather than documents)

Bates' Berrypicking – dynamic not static



Berrypicking model

- Static IR model:
 - The information need remains the same throughout the search session
 - Goal is to produce a perfect set of relevant documents with respect to the query
- Berrypicking model:
 - The query is continually shifting
 - Users may move through a variety of sources
 - New information may yield new ideas and new directions
 - The value of search is in the bits and pieces picked up along the way

Dervin's sense-making theory

SITUATIONS: The time-space contexts at which sense is constructed.

GAPS: The gaps seen as needing bridging, translated in most studies as "information needs" or the questions people have as they construct sense and move through time-space.

USES: The uses to which the individual puts newly created sense, translated in most studies as information helps and hurts.

questioning that can reveal the nature of a problematic situation, the extent to which information serves to bridge the gap of uncertainty, confusion, or whatever, and the nature of the outcomes from the use of information.

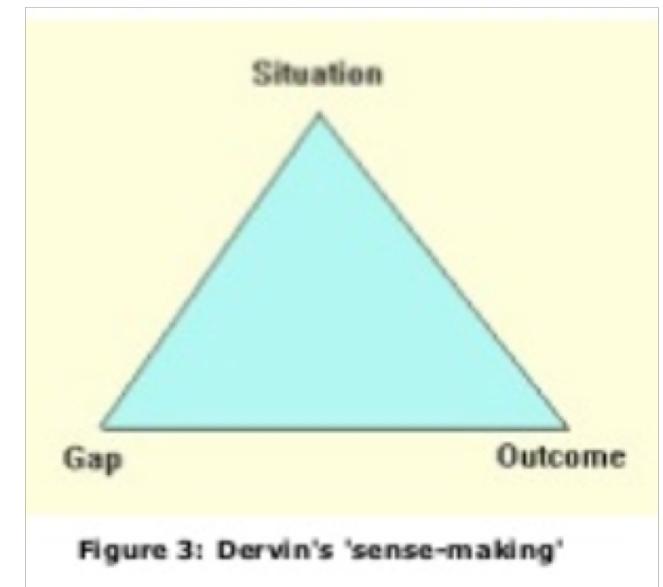
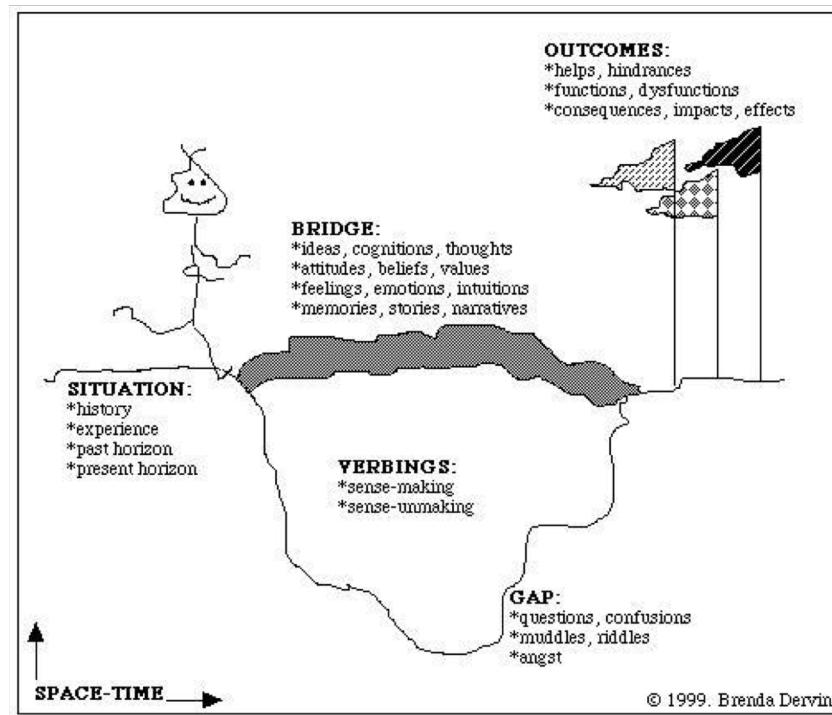
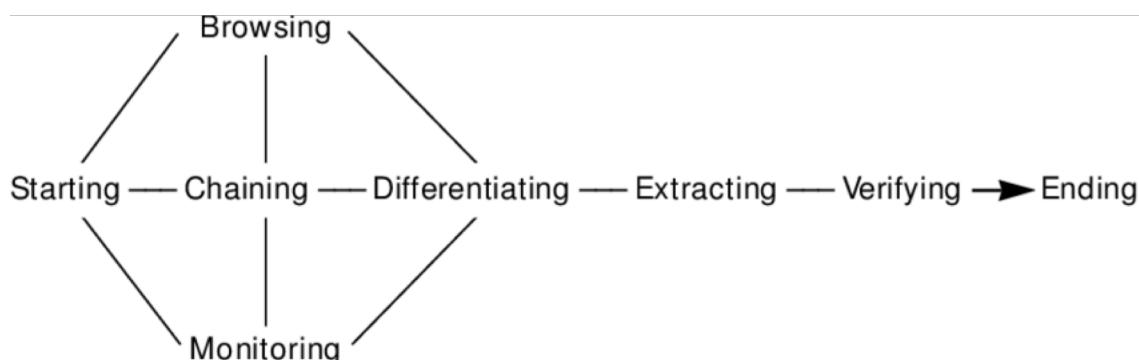


Figure 3: Dervin's 'sense-making'

Ellis' Behavioural Model

David Ellis describes 8 information seeking patterns of social scientists, physical scientists, and engineers in using hypertext (e.g., the Web).



- Starting (Surveying)
- Chaining
- Monitoring
- Browsing
- Differentiating (Distinguishing)
- Filtering
- Extracting
- Verifying
- Ending

Ellis' Behavioural Model (1989)

- ***Starting***: Looking for information in a new area or on a new topic.
- ***Chaining***: Searching by following citation connections between materials.
- ***Differentiating***: Selecting information sources based on their orientation and intended audience.
- ***Monitoring***: The continuous monitoring of developments in a field of study.
- ***Extracting***: Going through a particular source selectively identifying relevant material from that source

Marchionini's Model

- Problem solving approach to understanding information seeking process in the electronic environment
- Eight processes that may work in parallel:
 - Problem recognition
 - Problem definition
 - Selection of system/source
 - Problem articulation (query formulation)
 - Search execution
 - Examination of results
 - Extraction of desired information
 - Reflection, Iteration, and Stopping of search process

Kuhlthau's Model (1991)

- Six stages in the information search process incorporated in three realms:
 - affective – feelings
 - cognitive - thoughts
 - physical - actions

- **initiation** - the first awareness of a lack of knowledge or understanding
- **selection** - identifying the general topic of the approach to be pursued
- **exploration** - investigating information on the general topic, to improve orientation sufficiently to form a focus for resolving the problem
- **formulation** - forming a focus for the information encountered
- **collection** - extends and supports the focus and selects information pertaining specifically to the focus
- **presentation** - completing the search and preparing to present or otherwise use the findings

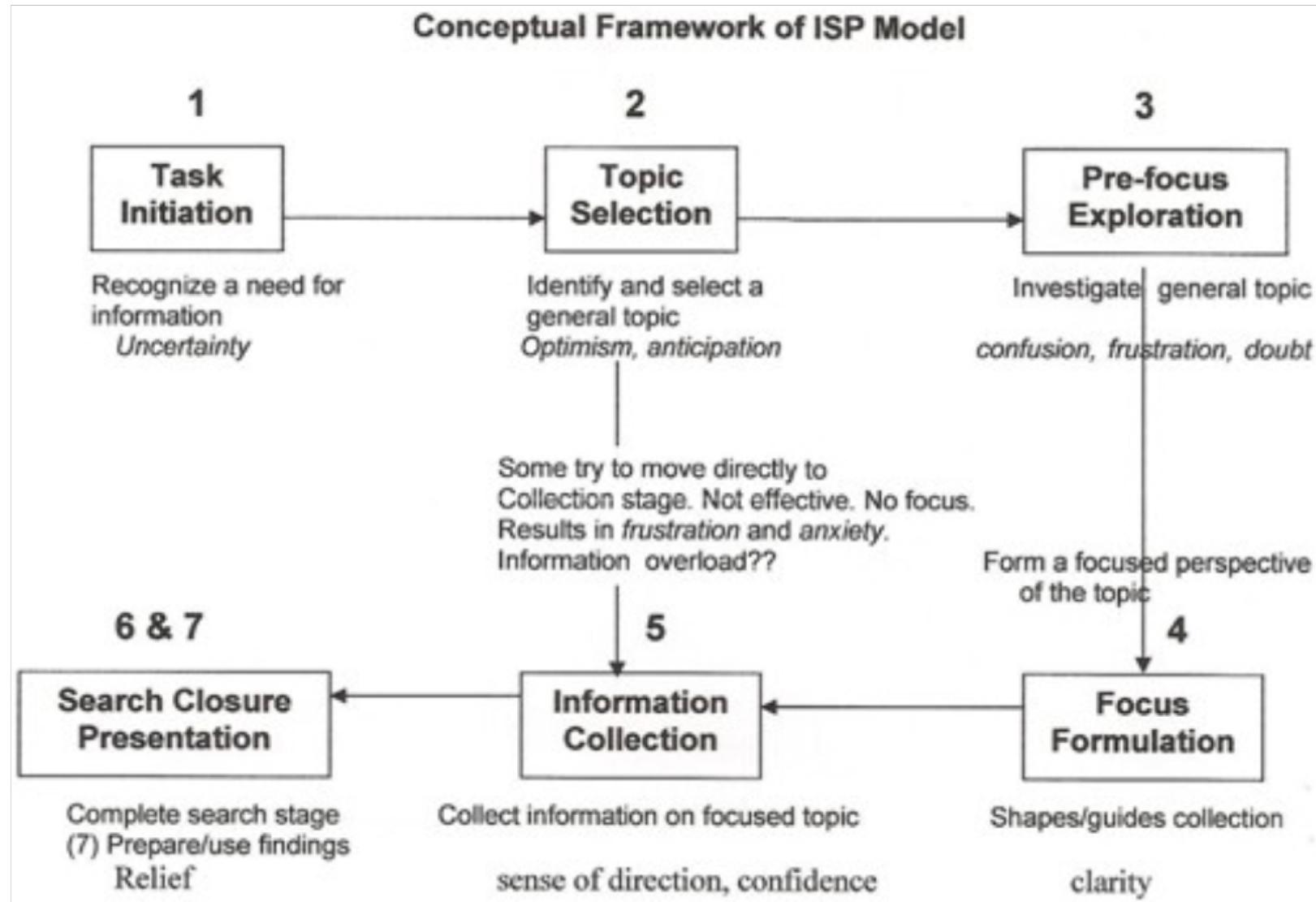


Kuklthau's Information Search Process

Tasks	Initiation	Selection	Exploration	Formulation	Collection	Presentation
Feelings (affective)	uncertainty	optimism	confusion/ frustration/doubt	clarity	sense of direction /confidence	satisfaction or disappointment
Thoughts (cognitive)	vague			→ focused		→ increased interest
Actions (physical)	seeking relevant information exploring			→	seeking pertinent information documenting	

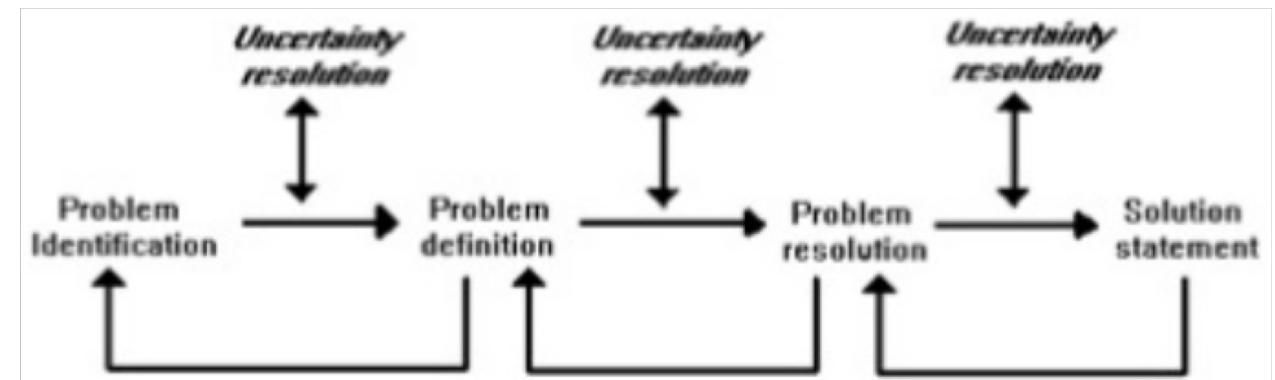
Figure 5.1. Model of the Information Search Process (ISP).

Kuhlthau's Information Search Process

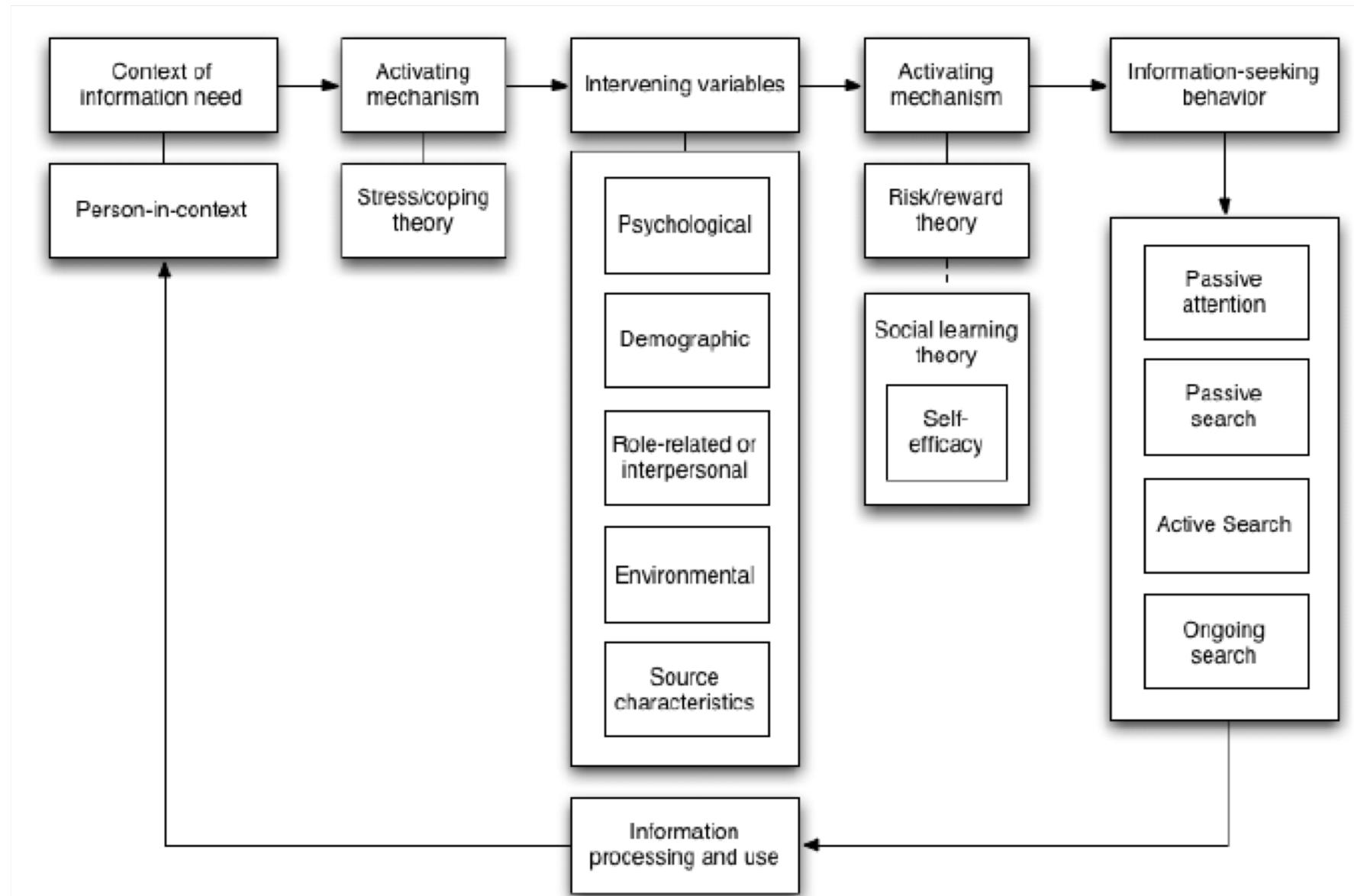


Wilson's Problem Solving Model

- Goal-directed towards problem solving
- Based on a survey of research in the health field
- Users move from *uncertainty* to *certainty* through the problem-resolution process
- Stages:
 - Problem identification
 - Problem definition
 - Problem resolution
 - Solution statement

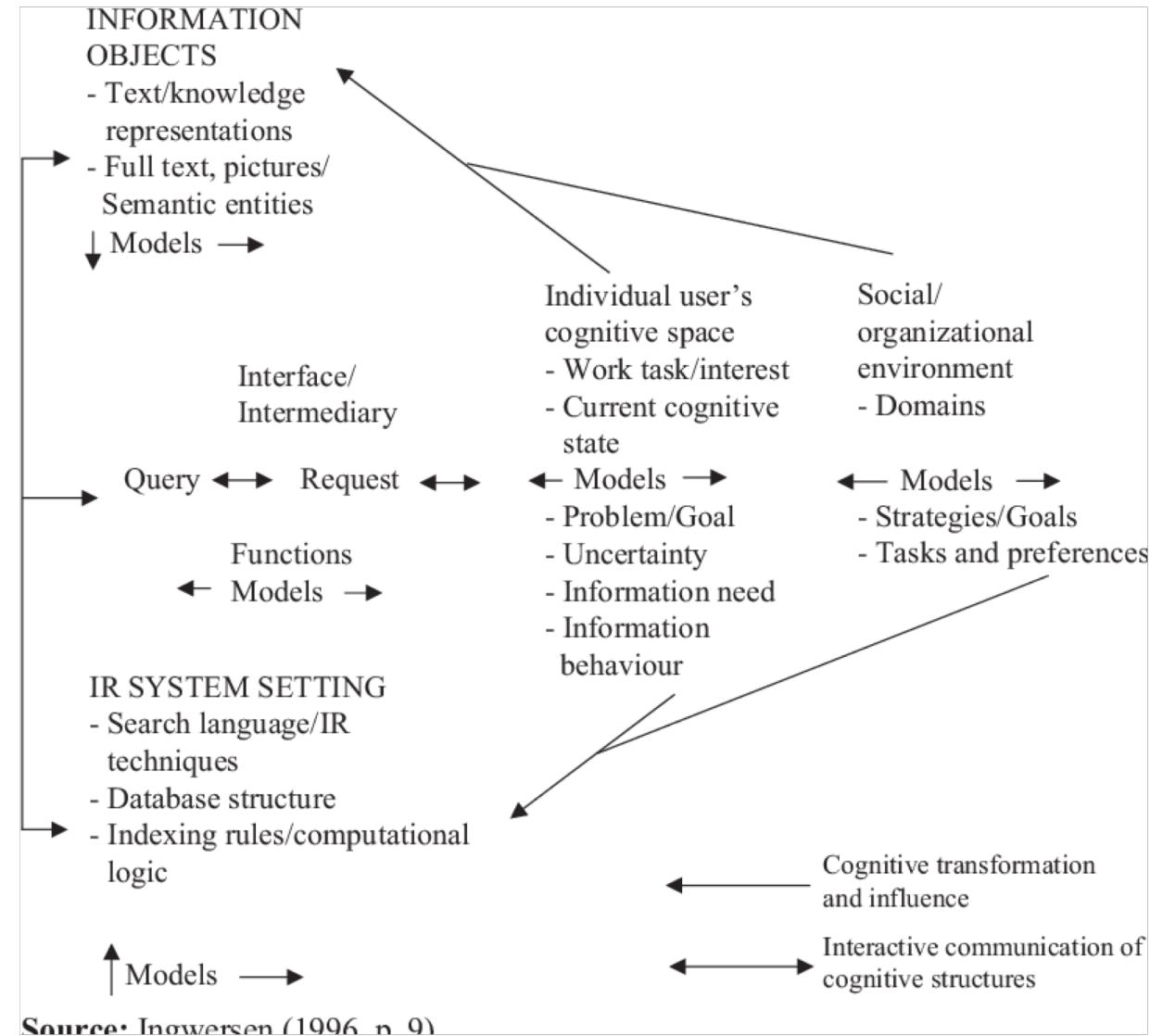
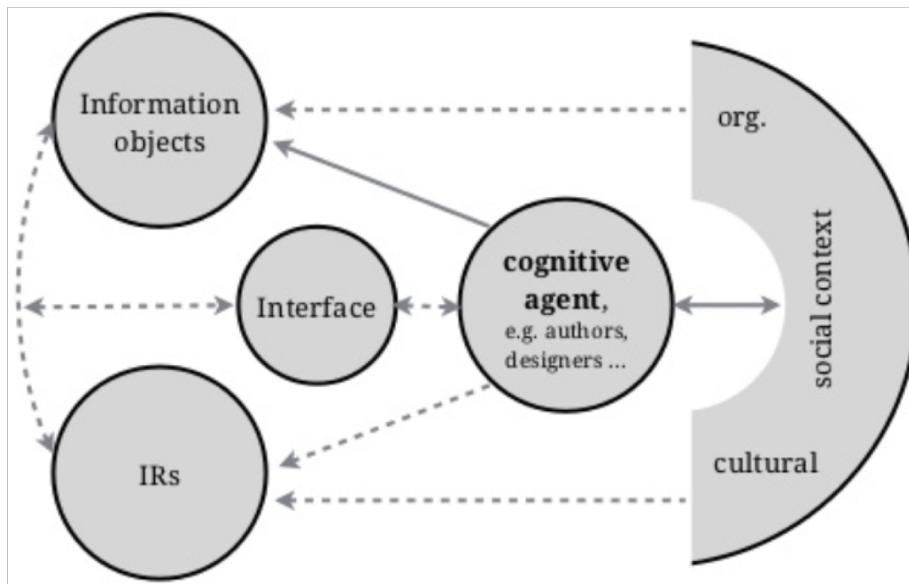


Wilson's General Model of Information Behaviour (1997)



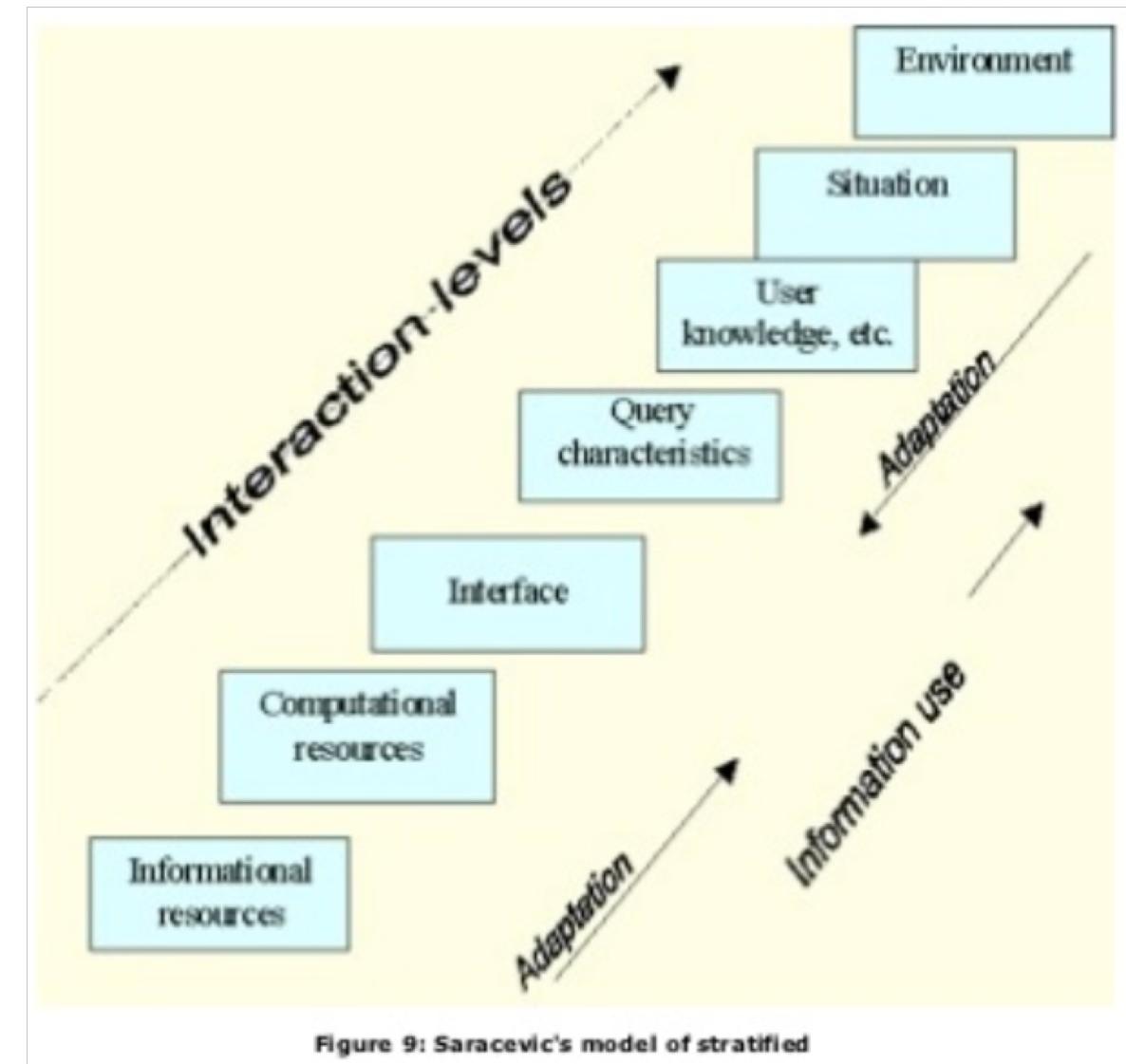
Ingwersen Cognitive IR Model (1996)

- Ingwersen analyzes cognitive information retrieval.
- He focuses on the interaction of mental models.
- He shows the short and the long-term change of these models as well as their drivers.



Saracevic's model of Stratified Interaction

- Stratified interaction model developed within an overall framework of an **acquisition-cognition-application model** of information use.
- The levels or strata are simplified to three:
 1. **surface**, or the level of interaction between the user and the system interface;
 2. **cognition**, or the level of interaction with the texts or their representation
 3. **situation**, or the **context** that provides the initial problem at hand.

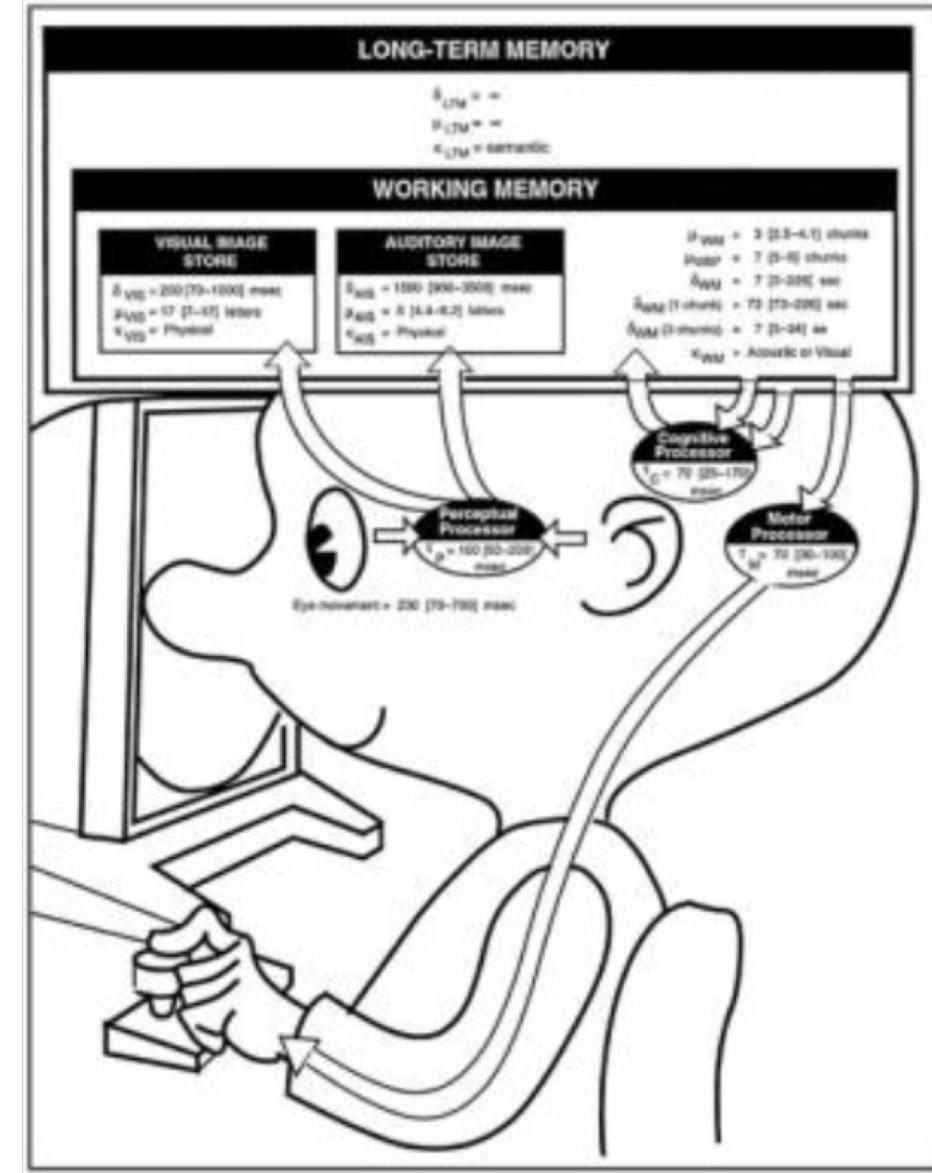


Information Foraging Theory (IFT)

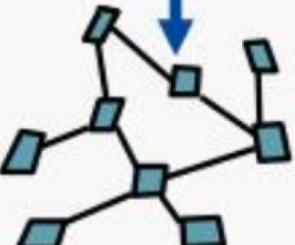
- Information Foraging Theory (IFT)
 - Pirolli and Card – Xerox PARC
 - “an approach to the analysis of human activities involving information access technologies”
 - Derives from **optimal foraging theory** in biology and anthropology
 - Analyzes adaptive value of food-foraging strategies
- Analyzes trade-offs in value of **information gained** against the **costs of performing activity** in human-computer interaction tasks
 - And needs models and analysis techniques to determine value added by information access, manipulation, and presentation techniques
- Real information system design problem is not **how to collect more information**, but **how to optimize user's time**
 - Increase relevant information gained per unit time expended
- IFT provides a relatively “formal” (quantitative) account

IFT timescales

- Considers “adaptiveness of human-system designs in the context of the information ecologies in which tasks are performed”
 - Ecology, as system; here -- information
- **Timescales** of information seeking and sense making activities:
 - **Cognitive** band (~ 100 ms – 10 s)
 - **Rational** band (minutes to hours)
 - **Social** band (days to months)



Timescale of Analysis

Time scale (s)	Psychological domain	User Interface Domain
.100-1	<ul style="list-style-type: none">• Visual attention• Perceptual judgment	<p>Pete Pirolli's Home Page Peter Pirolli, ... Palo Alto, CA 94304 USA phone: +1-650-812-4483 fax: +1-650-812-4241 email: pirolli@parc.xerox.com This page updated December 18, 2000. www.parc.xerox.com/istl/members/pirolli/pirolli.html - 9k - Cached - Similar pages</p>
1-100	<ul style="list-style-type: none">• Visual search• Motor behavior	
10-1000	<ul style="list-style-type: none">• Problem solving• Decision making	

IFT – An Ecological Perspective

- Time scales of information seeking and sense making activities
 - Cognitive band (~100 ms – 10 s)
 - Rational band (minutes to hours)
 - Social band (days to months)
- As time scale increases, less regard for how internal processing accomplishes linking of actions to goals
- Assumes behavior governed by “rational principles and shaped by constraints and affordances of the task environment”
- An **ecological perspective**, i.e., that behavior is “adaptive” in that it accomplishes some goal

Optimal Foraging Theory - Biology

- Developed in biology for understanding opportunities and forces of adaptation
 - the theory helps in understanding existing human adaptations for gaining and making sense of information
 - aid in task analysis for creating new interactive information system designs
- Optimality models include:
 - **Decision** assumptions
 - Which of the problems faced by an agent are to be analyzed, e.g., whether to pursue a particular type of information (or prey) when encountered, how long to spend
 - **Currency** assumptions
 - How choices are to be evaluated, e.g., information value (food value)
 - **Constraint** assumptions
 - Limit and define relationships among decision and currency variables, e.g., from task structure, interface technology, user knowledge

Information Foraging Theory

- Information foraging is usually a task embedded in context of some other task
 - Value and cost structure defined in relation to the embedding task
 - Value of external information may be in improvements to outcomes of embedding task
- Usually, embedding task is some ill-structured problem
 - Additional knowledge is needed to better define goals, available actions, heuristics, etc.
 - E.g., choosing a graduate school, developing business strategy
- Though use optimality model, not imply human behavior is classically rational
 - I.e., have perfect information and infinite computational resources
 - Rather, humans exhibit bounded rationality, or make choices based on satisficing

IFT – Information Patch Model

- Information patch model – from optimal foraging theory
- Rate of currency intake, $R = U / (T_s + T_h)$
 - U = net amount of currency (value, e.g., food, information) gained
 - T_s = time spent searching
 - T_h = time spent exploiting
- Net currency gain, $U = U_f - C_f$
 - U_f = overall currency intake (gross amount foraged)
 - C_f = currency expended in foraging
- Average rate of currency intake $u = U_f / \lambda T_s$
 - If assume information workers/foragers/consumers encounter information as **linear** function of time (will revisit this)
 - Total n items encountered = λT_s , where λ is rate of encounter with items
 - (will use next slide)

IFT – Information Patch Model

- Average cost of handling items (1st total/rate, the average) :

$$\bar{h} = \frac{T_h}{\lambda T_s}, \text{ and so } U_f = \bar{u}\lambda T_s \text{ and } T_h = \bar{h}\lambda T_s,$$

- Let s = search cost per unit time, then total cost of search = sT_s
- Then, substituting in equation for R , rate of currency intake:

$$\begin{aligned} R &= \frac{\bar{u}\lambda T_s - sT_s}{T_s + \bar{h}\lambda T_s} \\ &= \frac{\lambda\bar{u} - s}{1 + \lambda\bar{h}} \end{aligned}$$

- So, can express R in terms of
 - Average rate of currency intake, u
 - Search cost per unit time, s
 - Cost of handling items, h

An Example: Scatter Gather

- Hierarchical clustering of document
- Users see “overview” of document clusters
- Allows user to navigate through clusters and overviews

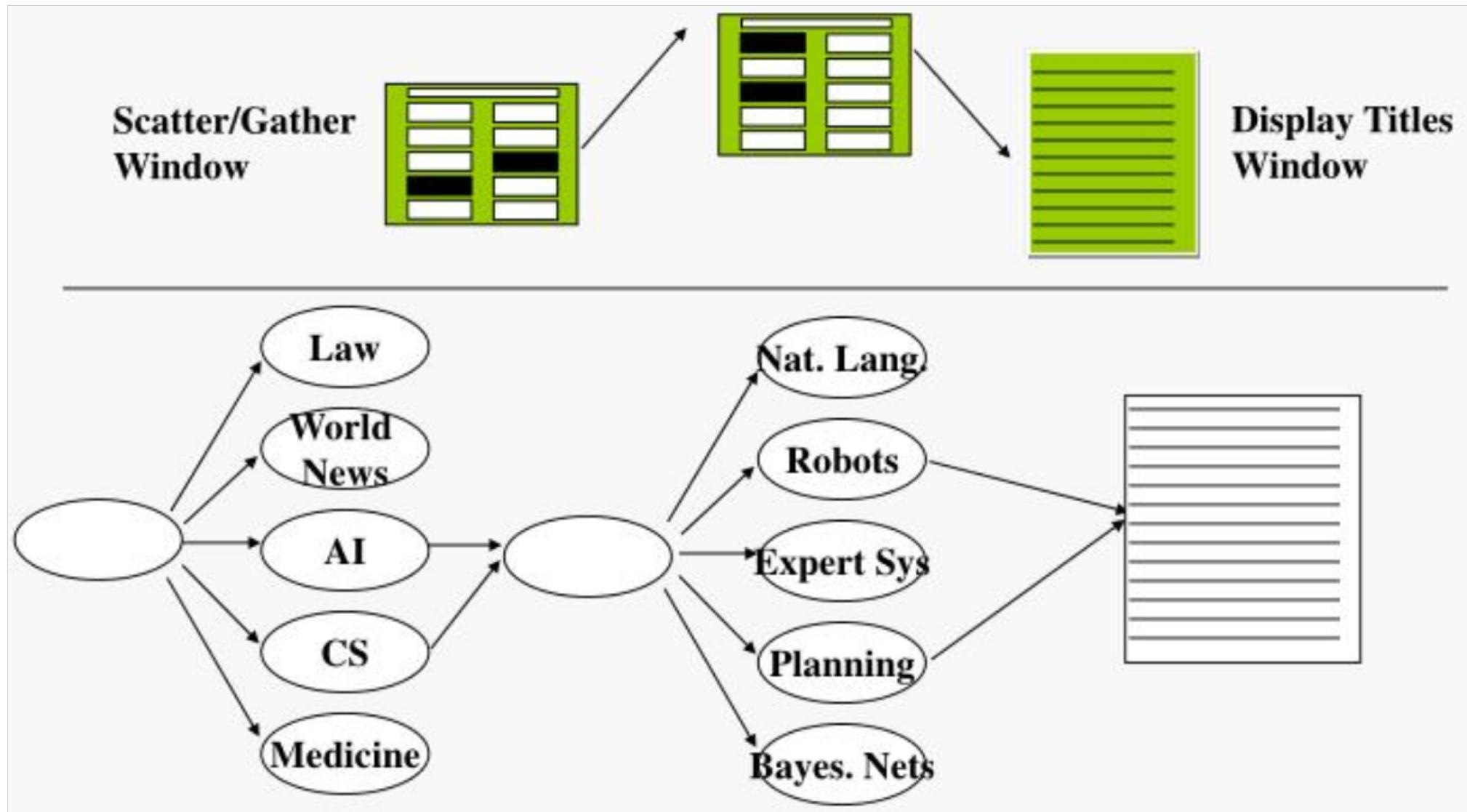
Scatter/Gather

Text Database: Inct
This Window: 0 Panel Window: -1

Scatter/Gather Show Dists Start New Query QUIT Scatter/Gather Goto Window:

Cluster ID (Count)	Document List
Cluster 0 (30240)	cell, patient, radiation, dose, beam, disease, treatment, ins RP: Early Results In Hospital Patient Study Shows Tardy, study, percent. DDE: Doses of secondary radiation appearing as (radiation, dose, esp RP: Poll; HIBS Test Confidentiality Opposed in (percent, study, drug,
Cluster 1 (23064)	court, judge, law, attorney, appeal, lawyer, trial, justice, RPB0502-01111 (court, state, u.s., f MSJ: Supreme Court to Review New York Law That (court, law, federal, MSJ: Law -- Legal Beat: Court Affirms Verdict 1 (court, case, state, 1
Cluster 2 (37740)	fire, nile, spokesman, monday, friday, thursday, saturday, wedn RP: Troops Violated Rules in Village Raid Last (police, kill, report, RP: Up To 50,000 Reported Killed In Armenian Qu (official, report, gov RP: Two Palestinians Wounded in Clash With Sold (police, kill, army, o
Cluster 3 (166437)	american, bush, country, house, soviet, party, leader, think RP: U.S. Invasion of Panama Draws Fire From Lat (state, government, u. MSJ: --- President's Power Is Slipping) Soviet (u.s., government, sov MSJ: The Iraqi Invasion of Kuwait -- Persian Gu (u.s., soviet, govern
Cluster 4 (174353)	share, stock, trade, billion, bank, sale, sell, york, buy, e MSJ: Reliance Electric Holds Public Offering; \$ (million, company, sto MSJ: Enterprise; 2 Staging Private Helped Rainh (company, million, sal RP: WASHINGTON: ... he said, (company, million, sha
Cluster 5 (122371)	user, software, computer, network, iba, version, pc, line, d Zf: Networks for the '90s; getting down to busi (user, software, appli Zf: Windows 3.0 wins with the users, (news anal (application, user, wi Zf: Visual programming; is a picture worth 1,00 (software, program, us
Cluster 6 (8134)	section, 1988, 1989, public, regulation, office, action, agen FR: Support 1852.1_Instructions for Using Provi (l, section, informati FR: Community Development Block Grants (section, l, state, ru FR: Proprietary Trading Systems (commission, file, 198
Cluster 7 (80304)	o, phase, reaction, concentration, 6, cm, investigate, metal, DDE: The composition of ND/sub w/ generated in (2, 3, 1, rate, reacti DDE: Using a 40 cm bent crystal spectrograph of (2, 1, 3, refs, gas, t DDE: X-ray method is used to study phase compos (2, 4, 3, 5, solution,
Cluster 8 (116210)	coal, fuel, flow, technique, oil, pressure, production, mean DDE: A specialized software system which allows (data, time, measureme DDE: We present results of our theoretical and (refs, tab, model, 1, DDE: Distributed control systems provide their (process, control, dev
Cluster 9 (20670)	field, nuclear, plant, waste, reactor, magnetic, plasma, ther DDE: The effect of the radial electrostatic field (field, magnetic, plas DDE: The operational principle of nuclear power (plant, nuclear, analy DDE: Wilson 'renormalization group' fixed point (field, theory, equati

Scatther/Gather Task



Optimal Foraging Time in a Patch

- $g_i(t)$, cumulative gain function
 - Amt of information gained in time t
 - $g_A(t) = \text{random order of encounter}$
 - Increase in information equal for all elements
 - Hence, constant slope
 - $g_B(t)$ and $g_C(t) = \text{ordered by relevancy}$
 - "Relevant" items, those with higher information content, encountered earlier
 - Hence, highest rate of information increase earlier, and rate decreases
- λ_p , rate of encounter with relevant items
- x-axis, travel time between patches
- R_B and R_C = rate of return
- t_c and t_b optimal foraging time
 - Foraging longer in the "patch" not optimal

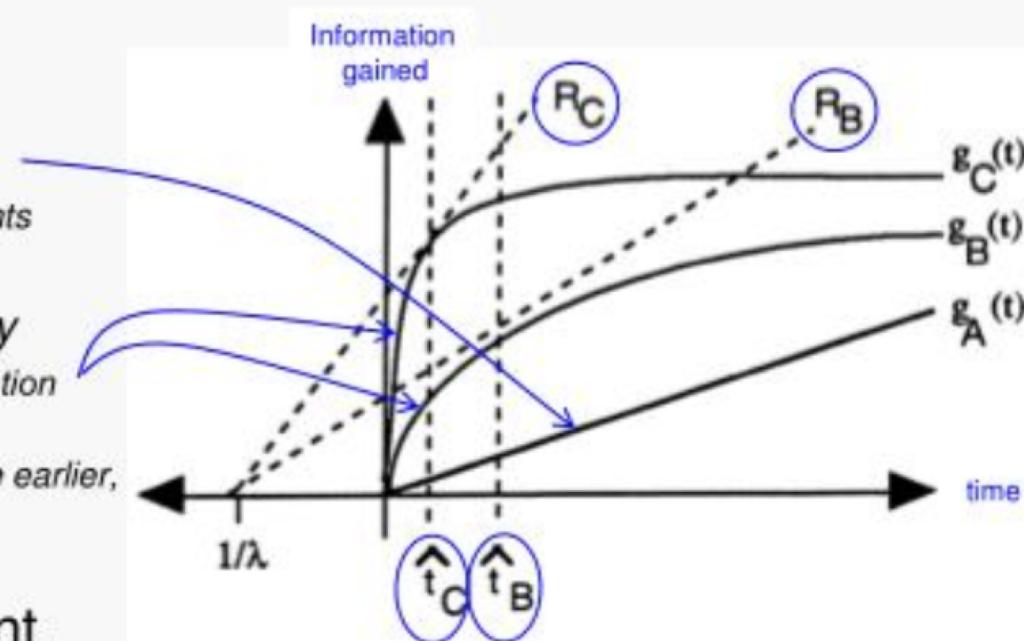


Figure 2. Optimal foraging in information cluster-patches. $g_A(t)$ is the current information-gain function, and $g_B(t)$ and $g_C(t)$ illustrate the effects of ordering by relevancy.

IFT – Cost of Knowledge

- Foraging Efficiency
 - Animals minimize energy expenditure to get required gain in sustenance
 - Humans minimize effort to get necessary gain in information
- Foraging for food has much in common with seeking information
 - Like edible plants in wild, useful information items often grouped together, but separated by long distances in an “information wasteland”
- Information “scent”
 - Like scent of food, information in current environment that will assist in finding more information clusters
- Activities analyzed according to value gained and the cost incurred
 - **Resource costs**, e.g. expenditures of time and cognitive effort incurred
 - **Opportunity costs**
 - Benefits that could be gained in engaging in other activities
 - “Cost of lost opportunity”, e.g., if not gaining information about algorithms (or messing with registration system), could be gaining information about software design

IFT - Conclusions

- Information processing systems evolve so as to maximize the gain of valuable information per unit cost
 - Sensory systems (vision, hearing)
 - Information access (card catalogs, offices)

maximize $\left(\frac{\text{information value}}{\text{cost of interaction}} \right)$