### **Just-in-Time Information**

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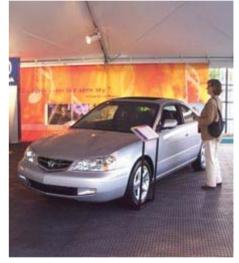
### What is "Just-in-time Information"?

Proactively offering a user information that is highly relevant to what s/he is currently focused on











### Why offer Just-in-time Information?

To promote:

- Insight
- Inspiration
- Interpersonal connections

...without interrupting the user's activities

### **How offer Just-in-time Information?**

- 1. Model user interests/preferences
- 2. Sense current context of user
- 3. Compute information relevant to the context and user profile (recommendation algorithm)
- 4. Present information in subtle, non-intrusive way

# Just-in-time Information for the Desktop User

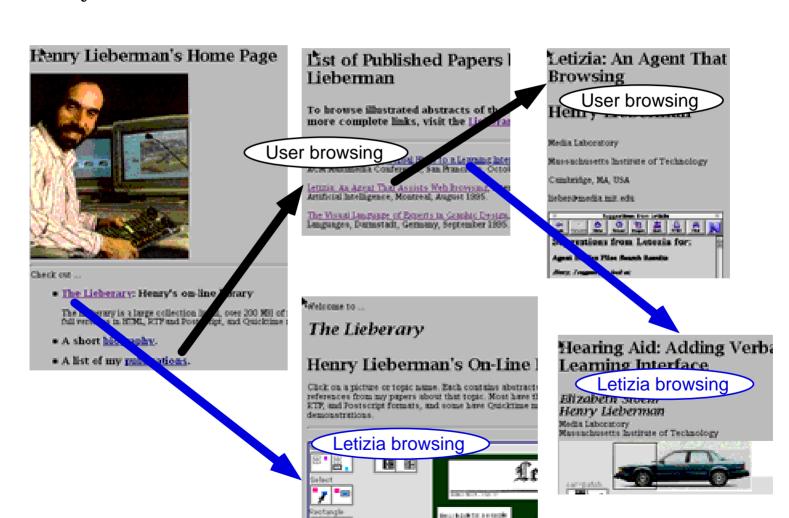
### **Examples:**

- Recommender systems
  - Based on patterns identified in user's behavior
  - Based on patterns identified among users
- Remembrance systems
- Mentoring systems
- Matchmaking systems

**—** ...

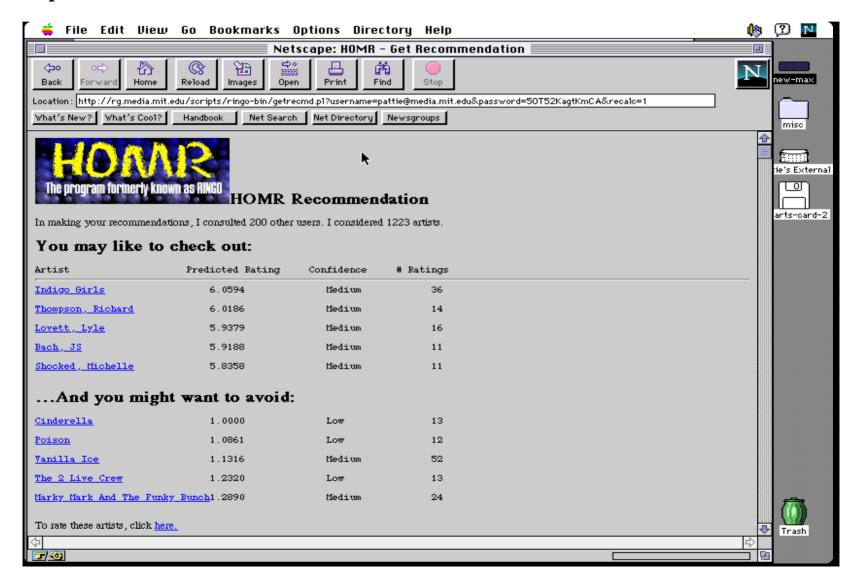
# Letizia: A Recommender System for Webpages

- Henry Lieberman 1998



### "Collaborative Filtering" recommenders

- Upendra Shardanand, Max Metral 2004

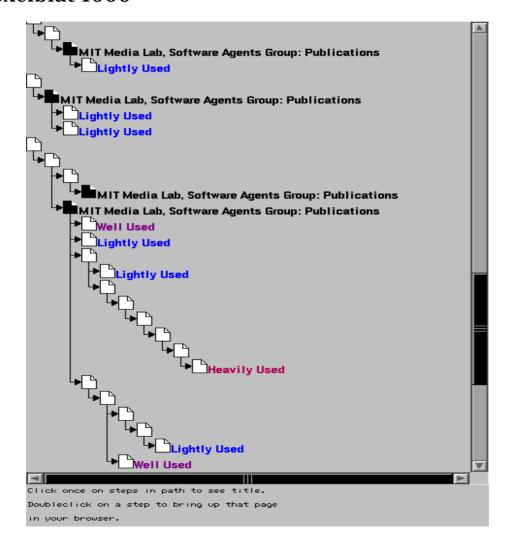


### Firefly (Barnes&Noble, Launch, etc, 94)



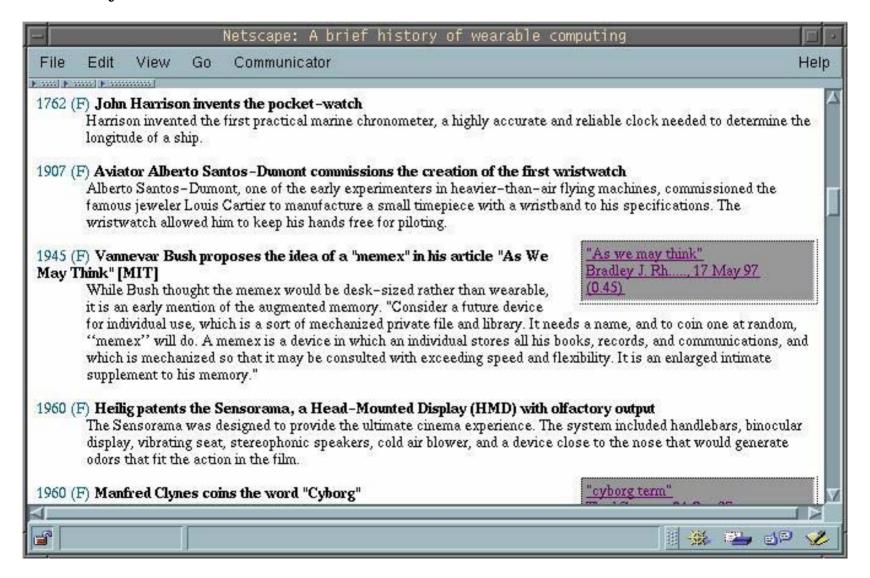
# Footprints: Visualizing popular paths on a website

- Alan Wexelblat 1999



### Remembrance Agent (Web version)

- Bradley Rhodes 1996



### Remembrance Agent (Emacs version)

Bradley Rhodes 1996

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#### Buffers File Edit Help

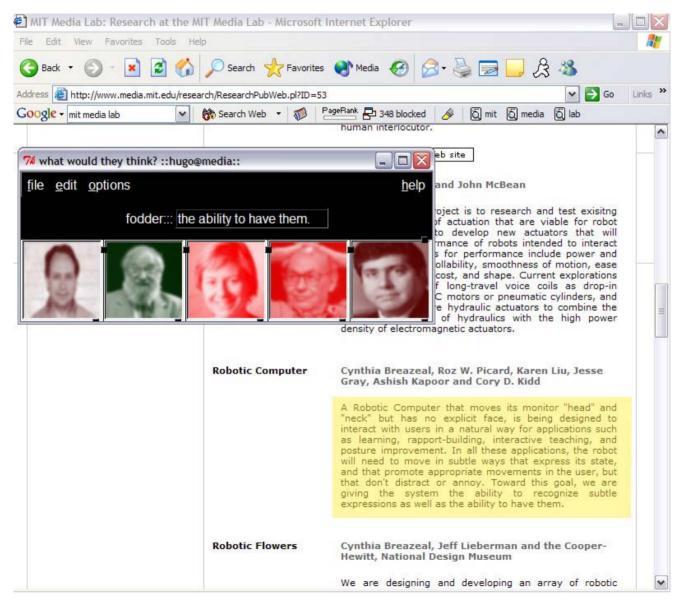
As a user collects a large database of private knowledge, his RA becomes an expert on that knowledge base through constant re-training. A goal of the RA is to allow co-workers to conveniently access the ``public'' portions of this database without interrupting the user. Thus, if a colleague wants to know about augmented reality, he simply sends a message to the user's Remembrance Agent, for example, thad-ra@media.mit.edu. The RA can then return its best guess at an appropriate file. Thus, the user is never bothered by the query, never has to format his knowledge (i.e. some mark-up language), and the colleague feels free to use the resource as opposed to knocking on an office door. Knowledge transfer may occur in a similar fashion. When an engineer trains his replacement, he can also transfer his RA database of knowledge on the subject so that his replacement may continually get the benefit of his experience even after he has left. Finally, if a large collective of people use Remembrance Agents, queries can be sent to communities, not just individuals. This allows questions of the form ``How do I reboot a Sun workstation?''

- 0.31 Boston local: Wearable Computing talk take 2
- 0.25 mobile Linux web page
  - 0.51 rebooting workstations in the agents area

#### \*remem-displau\*

### "What would they think?" Virtual Mentors

- Hugo Liu 2004



"attitude "attitude processing" to show what some mentors have to say about the topic the user is focused on

### **Yenta** Matchmaking System

- Leonard Foner 1999



### Current cluster memberships

Cluster number	Top words	Number of documents	Visibility			Status	
			ignore	careful	carefree	Status	
2	agent, paper, conference, author	11	0	0	•	Searching (tried for 4 hours)	
3	one-time-pad, shipping, contract	24	0	0	•	Found and joined: (37 known, ~400 estimated members)	

Submit Preferences



### I've got someone you might want to meet!

Introduce me

Open a commlink

			Submit Preferences								
Cluster contents	3	one-time-pad, shipping, contract	24	0	0	•					
	Cruster number	Top works	documents	ignore	careful	carefree					
	Cluster number	Top words	Number of	Visibility							
Who initiated	We did										
Attestations	I am a SkrodeRider. (3 signatories) My Skrode is of the traditional design. (no signatories!)										
Known age	At least 2 years 3 months 1 week										
Handle	Blueshell										
	7 A 34 56 D1 8C 91 EA 0A 30 DC D3 2A 52 E8 09 FA										

### Just-in-time Information While on the Go

State of the art in mobile computing:

- Too many clicks
- Not enough screen space



### Wearable Remembrance Agent

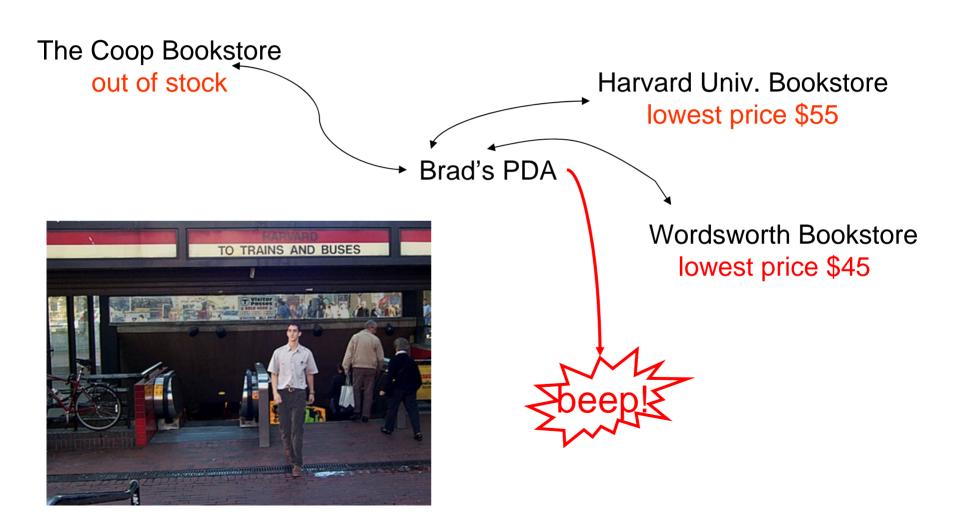
- Bradley Rhodes 1998

User receives context-specific reminders of relevant information (based on location, day of week, time of day, other people present, conversation topics)



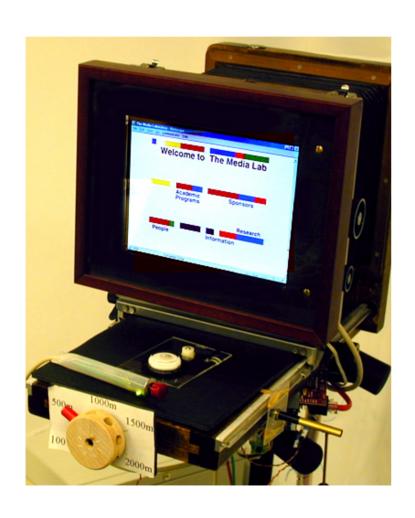
# Impulse: Automated Information Exchange with Entities in the Physical Vicinity

- Joan Morris & Jim Youll 2000



### **Periscope:** A Browser for the Real World

- Jim Youll 2001



Camera with compass and range finder shows
Web pages about the location the user/camera is currently focused on

## Hanging Messages: A platform for Annotating the physical world

- Emily Chang 2000



A PDA device with GPS allows users to leave & receive location-based and thread-based messages from others

### Ether Threads:

location-based messaging using a cell phone

- Bradford Lassey 2004

Blue-tooth and GPS data trigger location-based messages relevant to the user and the threads s/he is interested in



# **Photowhere:** Automated annotation of photographs

- Dan Relihan & Bradford Lassey 2004



- Cell phone communicates with GPS device via bluetooth to record location of picture taken
- Phone interfaces to metacarta.com server to find URLs about that location
- Extracts and offers keywords for the picture taken

# **ReachMedia:** On-the-move Interaction with Augmented Objects

- Assaf Feldman, Sajid Sadi 2005

- Wireless RFID reader wristband reads tags in objects held by user
- Touching an object results in a menu of services and information:
  - Order a copy
  - Read reviews
  - Leave a message
  - Retrieve messages
  - Do a keyword search

• ...



# **ReachMedia:** On-the-move interaction with Augmented Objects

- Assaf Feldman, Sajid Sadi 2005
- Wireless and mobile
- Natural and seamless, hands-free and eyes-free interaction option:
  - Gesture input (accelerometers on wristband)
  - Audio output
- Keypad & screen-based interaction option



### ReachMedia: Video

### Peripheral visual interface for ReachMedia Platform

- Enrico Costanza 2005



Wearable peripheral display (using tiny LEDs) embedded in a pair of eyeglasses delivers notification cues in a private, subtle and non-obtrusive way

# Ambient Semantics: Personalizing information presented on the ReachMedia Platform

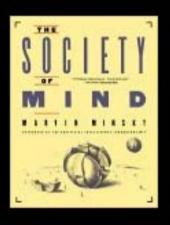
- Hugo Liu 2004

E.g. When user picks up a book with ReachMedia wristband, user's cell pone conveys:

- A prediction of how much user will like the book
- Which passages are relevant to user's interests
- How it relates to other books recently read
- Reviews by respected friends/editors
- Which friends loved/hated it

**—** ...





I see that you are looking at SOCIETY OF MIND.

Your friends are crazy about this book! Barbara Barry and Henry Lieberman say it's one of their favorites!

People on the web who have read SOCIETY OF MIND have said some things about it:

"In this book Minsky tries, as have many scientists before him, to explain what seems unexplainable. Even though in present day, many people believe in science over magic,





**Hugo, please meet Dave Merrill!** 

Dave and you both love some of the same sports, such as snowboarding.

Both of you know Nathan Eagle, Elisabeth Sylvan, Cory Kidd, Cameron Marlow, Joanie Morris DiMicco!

Hugo, you might also be interested that Dave Merrill likes neal stephenson, student, lifelong learners, lifelong learners, outdoor enthusiasts, domestic gods

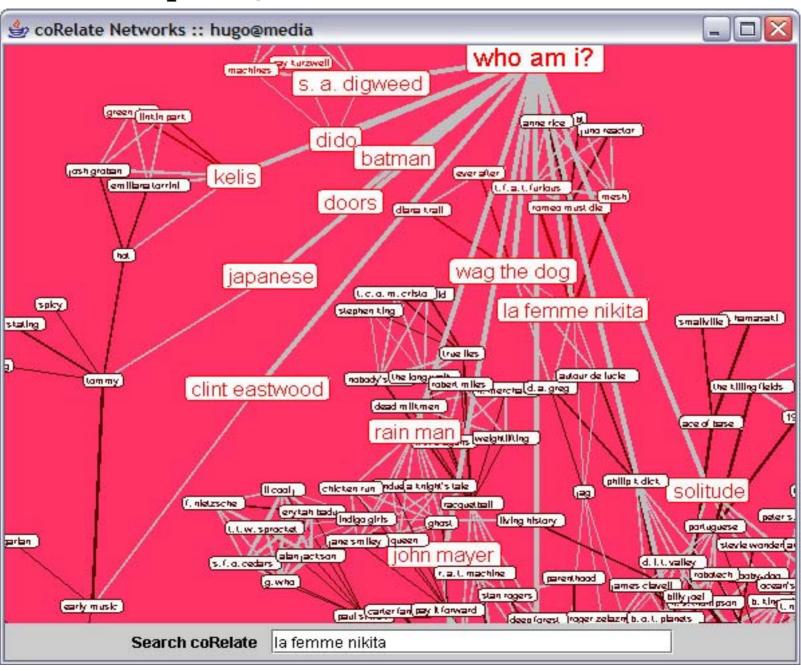
& goddesses, surfing, polo, water polo, cake, eagles, thai, mexican, musicians, san francisco lovers, europhiles, linguists, futurama, the simpsons, run lola

# **Ambient Semantics: Personalizing Just-in-time Information**

- Hugo Liu 2004

- Uses webmining to build:
  - User profiles (orkut, friendster, linked-in, homepages)
  - Object profiles (amazon, google)
- Uses webmining to build InterestMap
  - Map of correlations between interests as mined from tens of thousands of homepages
  - Is used to compute distance/relevance
- Presents information about object/person that ranks high in relevance

### InterestMap — Hugo Liu 2004



### **Invisible Media:** Sensing & responding to visual focus of attention

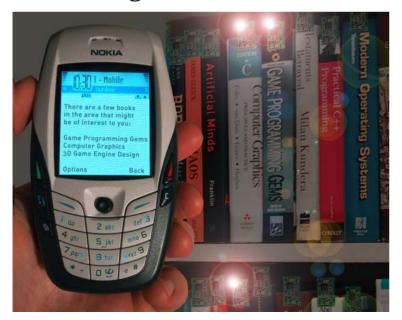
- David Merrill 2005



- -User wears earbud with IR emitter/receiver
- Augmented objects sense the user's focus of attention
- Relevant information is presented in audio format
- Speech input

# **Object Awareness:**Drawing the person's attention to objects of interest in the immediate environment

- David Gatenby 2005
  - Bluetooth-enabled cell phone communicates user's interests to augmented objects in user's vicinity
  - Relevant objects can draw the user's attention by blinking their LED's



### **Functions:**

- -Finding an object
- -Keyword search
- -Recommendations
- -Similarities

-...

# Other Projects: Augmenting Everyday Objects with Specific Functionalities

- Responsive portraits
- Responsive mirrors
- Augmented pillows
- Augmented doors, windows, walls, clocks, ...

# **CASY:** Responsive Portraits Support Staying in Touch

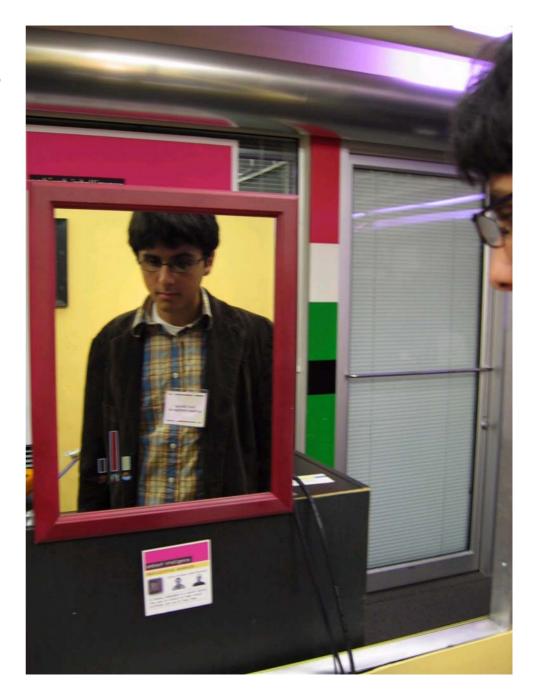
- Orit Zuckerman 2005
- Context-based delivery of audio/video messages on PDA
- Ex:
  - Grandparent records 'good morning' and 'good night' video snippets
  - Grandchild is shown the snippet in-context of going to sleep or waking up



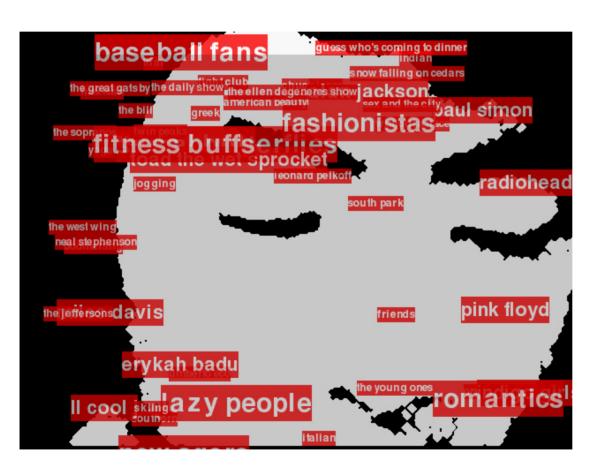
### **Reflective Mirror**

- David Bouchard, Enrico Costanza 2005

Bathroom mirror allows person to reflect on their recent behavior.
Uses half-way mirror & hidden LCD screen and camera.



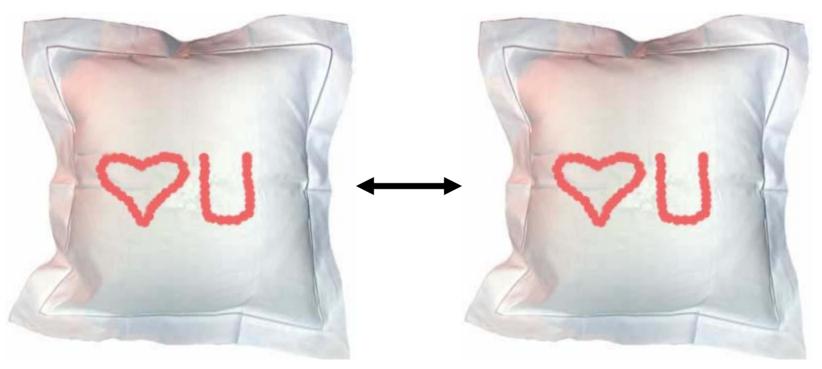
### Identity Mirror – Hugo Liu 2005



Abstracted "mirror" reflects person's "identity neighborhood" as gleaned from user's homepage and public profiles pages

### **Pillow Talk**

- Amir Bakhtiar, Sajid Sadi & David Merrill 2005



A pair of networked touch-sensitive pillows with crude LED displays support synchronous, low-tech messaging

# Just-in-time Information: Technical Challenges

### Just-in-time information "works" if it is:

- likely to be <u>relevant</u> to the user
  - Challenges in:
    - » user profiling
    - » detecting context of user
    - » recommendation algorithms (personalization, contextualization)
- offered <u>unobtrusively</u>
  - Challenges in:
    - » Subtle interfaces
- requires <u>minimal user effort</u> to access
  - Challenges in:
    - » Natural, "on-the-move" interfaces

### Challenge: User Modeling/Profiling

### **Approaches:**

- Entered <u>explicitly</u> by user
  - Form filling, choosing options in menu
- Gathered <u>implicitly</u> by system
  - Data mining of observed user behavior
  - Data mining of personal texts
    - Eg homepages, profiles on social networking sites, files
- Combination of approaches

### **Challenge: Detecting User Context**

- Detect <u>who</u>, <u>what</u>, <u>where</u>, <u>when</u>
  - Offer info relevant to current focus of user
- Approaches:
  - On desktop:
    - Sense user's actions in different applications
  - Offline:
    - Sensors in the environment & on user
- May involve use of background knowledge & inferencing
  - E.g. shaking someone's hand first time
    - Background info, creating connections, breaking the ice
  - versus shaking someone's hand nth time
    - Reminders of previous conversations online/offline

### Challenge: Recommender Systems

### Range of approaches based on:

- Cases/prototypes
- Features of the content (patterns in content)
- Collaborative Filtering (patterns among users)
- Other approaches

### Challenge: Subtle, Natural Interfaces

### – Goals:

- Avoid change of focus/interruption
- Recommendations are proactive but easily ignorable
- Avoid additional gear/devices/windows
- Support "on-the-move" access to details

### - Approaches:

- 1. Either offer suggestions using secondary I/O modalities of user Eg peripheral vision, audio, gestures, etc
- 2. Or provide seamless integration of recommendations in existing interface in minimal way
- Offer "ramping" interface
  - Present minimal "hints"
  - User controls access to more information/detail

### Other User Interface Lessons Learned

- Transparency is key
  - => trust
- Avoid dependence/"tunnel vision" problem
- Protect user's privacy

### **Summary**

Radically rethink user-information interaction by:

- Proactively offering "just-in-time" information
- Highly relevant to a unique user and their current focus of attention
- In non-disruptive, easily accessible way

### **For More Information**

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