



Seamless capture and discovery for corporate memory



Daniel Billsus



Laurent Denoue



David Hilbert

FX Palo Alto Laboratory
March 2006

FX Palo Alto Laboratory, Inc.

- Research lab for Fuji Xerox
 - ~ 25 researchers
 - Research in multimedia, teleconferencing, HCI, and information management

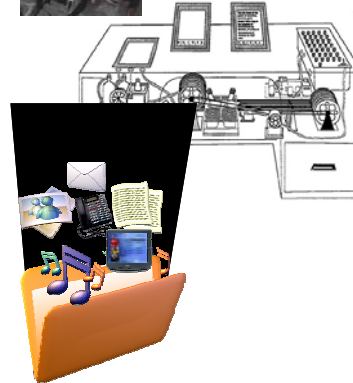


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The “Memory Extender”



- Vannevar Bush,
“As We May Think”,
The Atlantic Monthly, 1945
- Anticipated or inspired
 - Hypertext, Internet,
World Wide Web,
Wikipedia
 - MSR’s MyLifeBits
- What about a corporate
“Memex”?

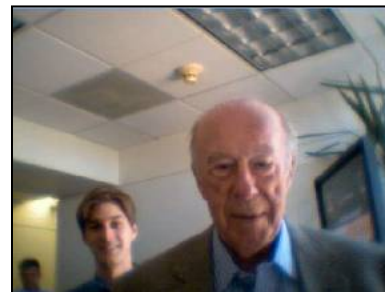


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Corporate Memory



- What is it?
 - “... it allows a company
to know what it knows”
George Shultz, July 2004
- Without it, companies are not
as efficient as they could be
 - Reuse instead of reinvention
 - Coordination instead of replication
- An important but very difficult problem



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Challenges



- Information Capture
 - People won't add information if there is no immediate benefit
- Information Discovery
 - People don't search for things they don't know about
 - People can't spend all their time searching and filtering
- Multimedia Content
 - Documents alone are not enough
 - People, meetings, presentations



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Vision



- Move *beyond* existing intranets
- Help organizations take better advantage of their intellectual capital
- Knowledge management without extra effort
- Weave capture and discovery into existing work practices



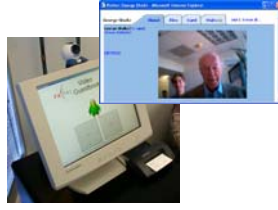
FXPAL Corporate Memory

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Example Content @ FXPAL



PALWeb: Reports,
Publications, Inventions



Video Guestbook:
Visitor Information



PlasmaPoster:
Web Pages



UbiSight:
Meeting Capture



mBase:
Video Database

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Problems



- Useful content, but not usable as corporate memory
 - No content-based meeting retrieval
 - Users needed to manually locate relevant information

Result: Past information often ignored

- Two new prototypes
 - ProjectorBox: autonomous presentation capture and indexing
 - PAL Bar: proactive contextual retrieval

Result: A unified multimedia corporate memory

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FXPAL Corporate Memory



- Introduction
 - Corporate Memory
- Seamless Information Capture
 - ProjectorBox
- Seamless Information Discovery
 - PAL Bar
- System Integration
 - Multimedia Corporate Memory

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ProjectorBox



Laurent Denoue



David Hilbert



John Adcock

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March 2006

Presentations



- **They're everywhere**
 - Business, education, government
- **They're informative**
 - An important communication medium
- **They're nowhere**
 - Pass through projectors everyday and are lost



Our Research



- Question
 - Why so few archives?
- Hypothesis
 - Cost, complexity, somebody always has to do something
- Our Research
 - What if we could create useful archives without any added burden on anyone?



AutoAuditorium™



quindi

mediasite



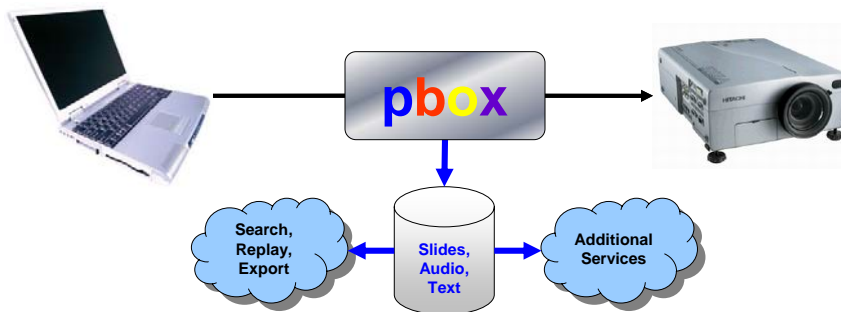
Anystream
Apreso
Classroom

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ProjectorBox



A smart appliance for capturing, indexing, and managing presentation media



- Intercepts video between PCs and projectors
- Extracts text (OCR) and records audio (microphone)
- Automatically archives slides, text, and audio
- Simple UIs and APIs for accessing media

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ProjectorBox



- **Small PC-based appliance**
 - Video capture card + splitter
 - Microphone
 - Web server



- **Key features**
 - Starts / stops recordings automatically
 - Easy search, skim, and export
 - No change to presentation practice
 - Works with any projector, PC, software

↑
25¢

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Demo



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Search and Browse



Keyword search

Browse by date

Projector Box - Mozilla Firefox
http://projectorbox/index.jsp

pbox
©2004 FXPAL - Searching 104,059 images

Only slides All images

Search

1998 1999 2000 2001 2002 2003 2004 2005

October 2005

Thu, 20th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Wed, 19th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Tue, 18th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Mon, 17th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Fri, 14th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Wed, 12th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Tue, 11th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Mon, 10th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Fri, 7th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Thu, 6th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Wed, 5th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Tue, 4th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Mon, 3rd	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Sun, 2nd	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11

September 2005

Fri, 30th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Thu, 29th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Wed, 28th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11
Tue, 27th	0 1 2 3 4 5 6 7 8 9 10 11 12 1 2 3 4 5 6 7 8 9 10 11

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Search Results



Projector Box - Mozilla Firefox
http://projectorbox/search.jsp?query=music+perceptual&domain=kumo

pbox Only slides All images

music perceptual kumo Search

Result page

Thu, March 17th, 2005

Thu, Sep

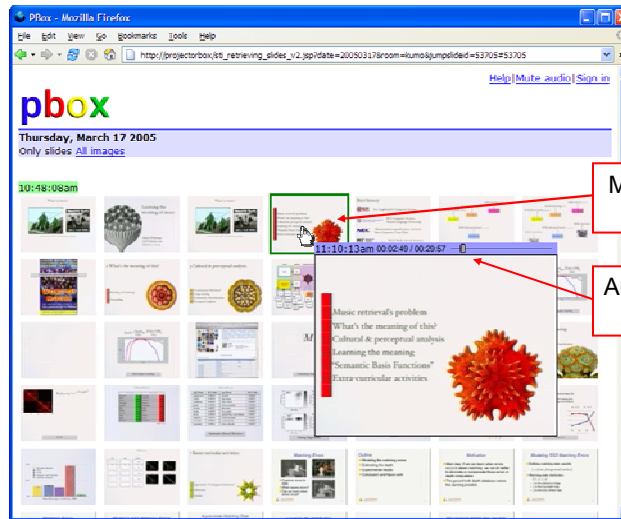
What's the meaning of this?
Cultural & perceptual analysis
Learning the meaning
"Romantic Basin Functions"
Intra-curricular activities

Mouse-over to zoom

Matched terms highlighted

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Skimming

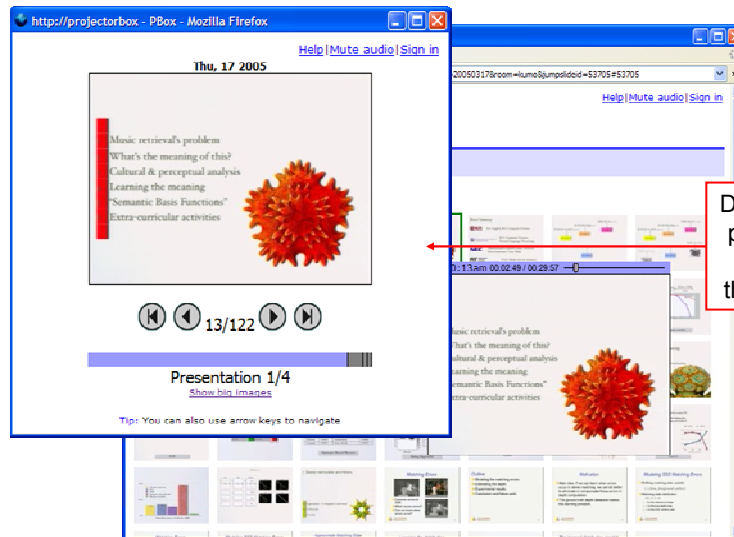


Mouse-over to zoom

Audio playback control

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Playback



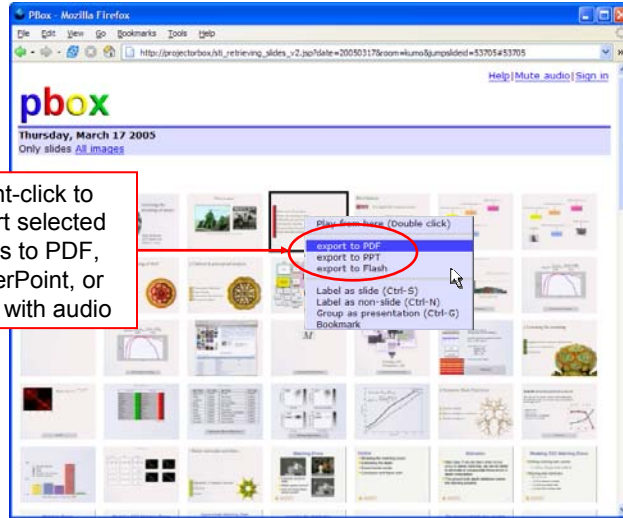
Double-click to playback and advance through slides

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Export



Right-click to export selected slides to PDF, PowerPoint, or Flash with audio



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Real-time Slide Enhancement



Enriching presentations by **overlaying** additional information



Or overlays can be shown on multiple screens



Users can mouse-over text for more information

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Media Analysis Overview



- Image change detection
- Slide classification
 - Average font height from OCR
- Presentation segmentation
 - Time-based
- Storage cost
 - ~30 MB/hour (300 KB/slide, 350 KB/minute MP3 audio)
 - ~20 GB for all presentations at FXPAL in 2005
 - 10+ times lower than current MPEG4 video encoding at 1024x768

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Deployments



- Corporate settings
 - FX Palo Alto Laboratory
 - Main conference room
 - Fixed room appliance
 - (Also @ Fuji Xerox)
- Educational settings
 - Naval Postgraduate School (NPS)
 - Multiple classrooms
 - Portable appliance, laptop capture client
 - (Also @ SFSU)



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Study Summary



- **Worked well across diverse settings**
 - Primarily for viewing missed presentations
 - More attention, less notes
- **Usage differences**
 - Education: “Study aid”
 - Corporate: “What’s going on?”
- **What’s missing?**
 - Dynamic content (e.g., videos clips and demos)
 - Students missed whiteboard, not video
 - Search on audio
- **Validated design**
 - Searching important (in corporate setting)
 - Skimming important (both settings)
- **New directions for corporate use**
 - New content access interfaces
 - Privacy and security

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New Directions



- **New content access interfaces**

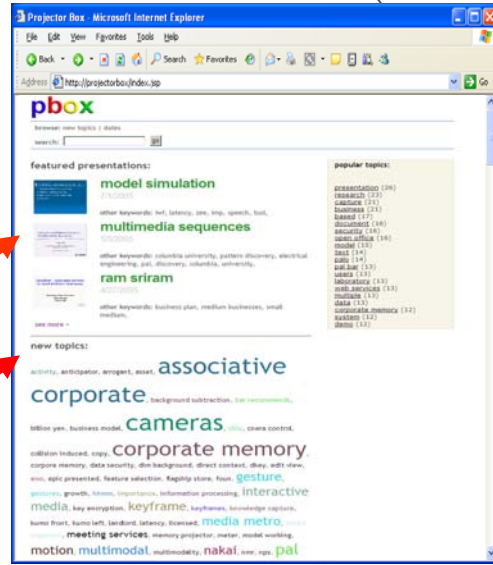
- **Privacy and security**

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Awareness and Discovery

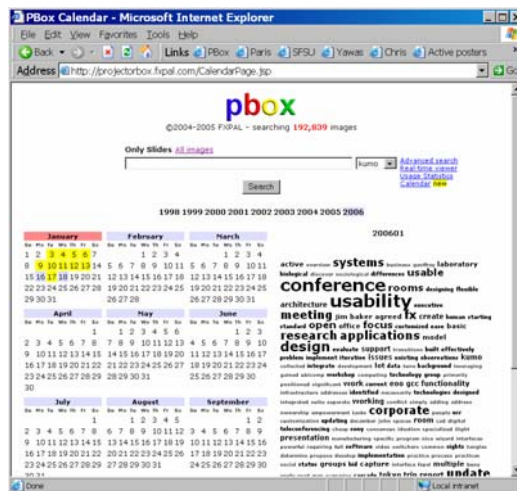


- Users can easily search, browse, and skim to find what they are looking for
- But how can they stay aware of what's new and discover what's "interesting"?
 - E.g., recent talks by external visitors
 - E.g., "hot topics" that have increased in popularity recently



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Exploration



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Privacy and Security

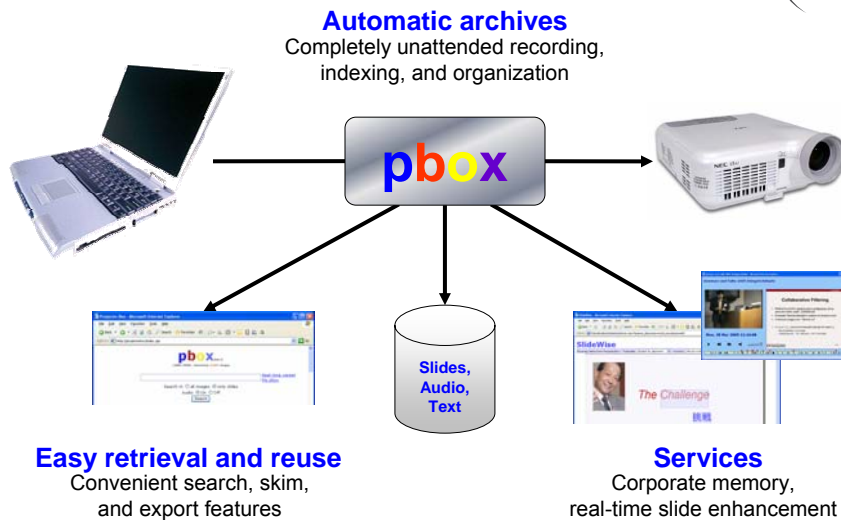


- Recording awareness and control
 - Interactive projection overlay
 - RGB cable interface
- Usable access control
 - Smart cards, biometrics?
- Alternative form factors
 - Next generation IC recorder?



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Summary



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ProjectorBox team



Laurent Denoue



David Hilbert



John Adcock

Contributors



Daniel Billsus



Matt Cooper



Hanning Zhou



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FXPAL Corporate Memory



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Corporate Memory Content @ FXPAL



Documents,
web pages,
bookmarks



ProjectorBox:
Slide Capture



UbiSight:
Video Capture



mBase:
Video Database



Guestbook:
Visitor Information



PlasmaPoster:
Web Pages

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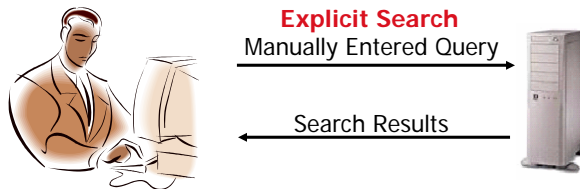
PAL Bar: Seamless Information Discovery



- **Seamless Information Discovery**

- PAL Bar automatically finds corporate resources based on currently displayed web page or email
- Proactive recommendations
- No added effort

Explicit Search vs. Proactive Recommendations



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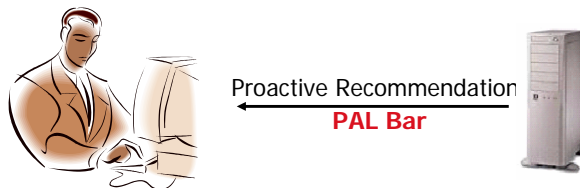
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Explicit Search vs. Proactive Recommendations



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PAL Bar Architecture



FXPAL ▾ Content* Digest* Visitors* Internal* Personal*



Server

- Database: Users, Content
- Server converts text to query
- Full-text search



Documents



Slides



Videos / Meetings



Visitors

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PAL Bar Architecture



FXPAL ▾ Content* Digest* Visitors* Internal* Personal*

Text



Server

- Database: Users, Content
- Server converts text to query
- Full-text search



Documents



Slides



Videos / Meetings



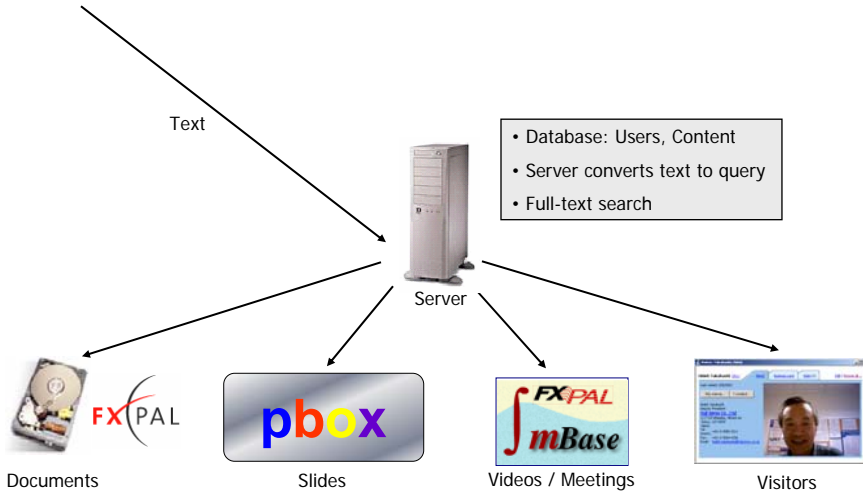
Visitors

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PAL Bar Architecture



FX PAL | Content* | Digest* | Visitors* | Internal* | Personal* |

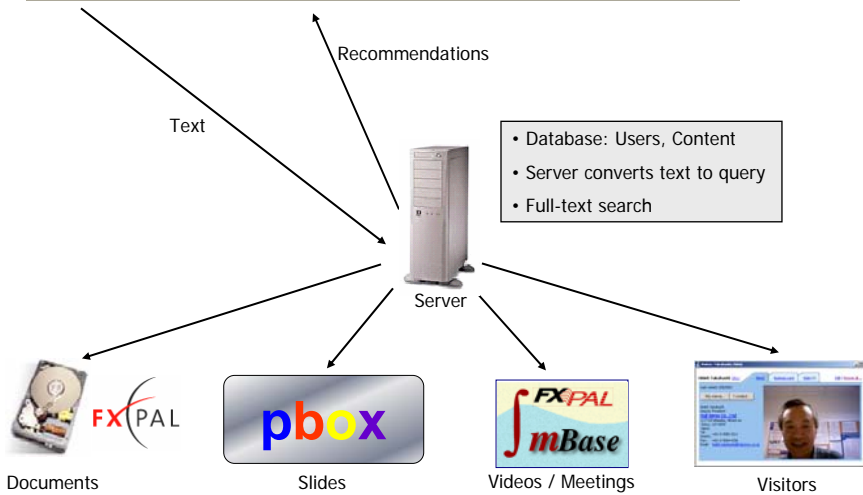


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PAL Bar Architecture



FX PAL | Content* | Digest* | Visitors* | Internal* | Personal* |



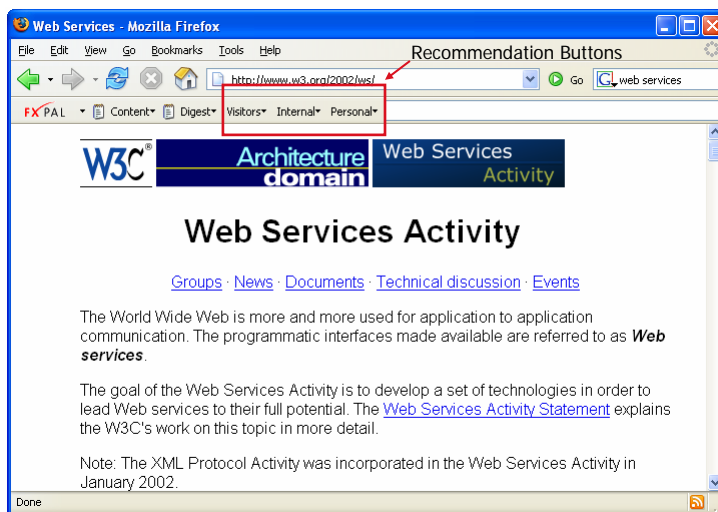
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PAL Bar Recommendations



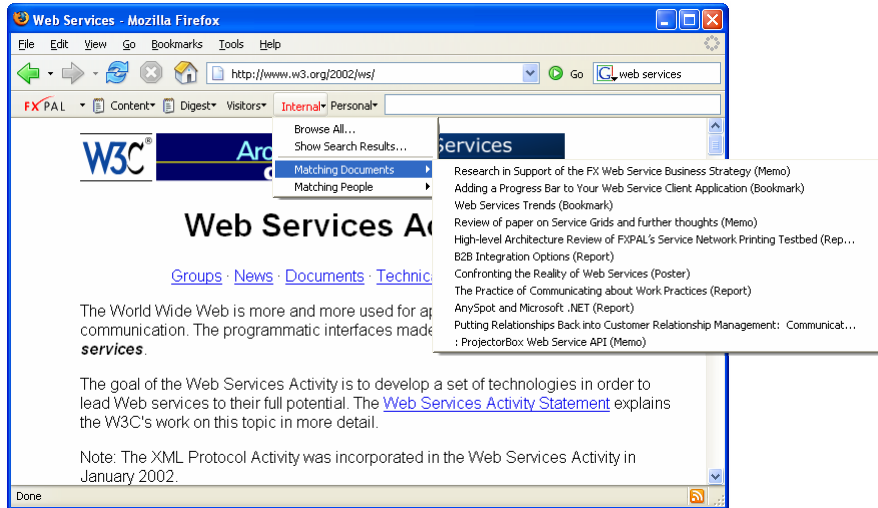
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PAL Bar Recommendations



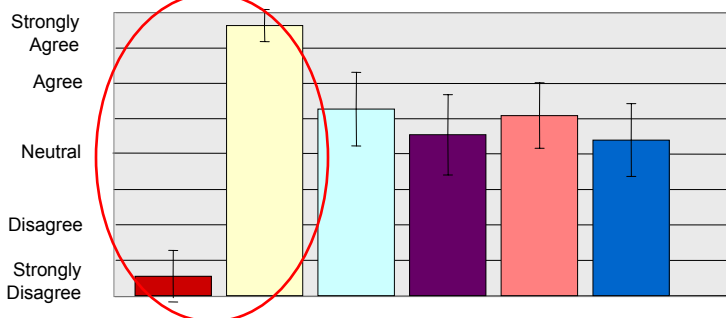
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PAL Bar Recommendations



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Initial User Study



- PAL Bar distracts me from what I am doing.
- I often forget that PAL Bar is there.
- I would use PAL Bar more often if I could easily see why it had recommended certain things to me.
- I would use PAL Bar more often if it showed me a preview of recommended documents before I clicked on them.
- I would use PAL Bar more often if the recommendations were sorted into topic categories.
- I would provide feedback on the quality of my recommendations if it helped improve future recommendations.

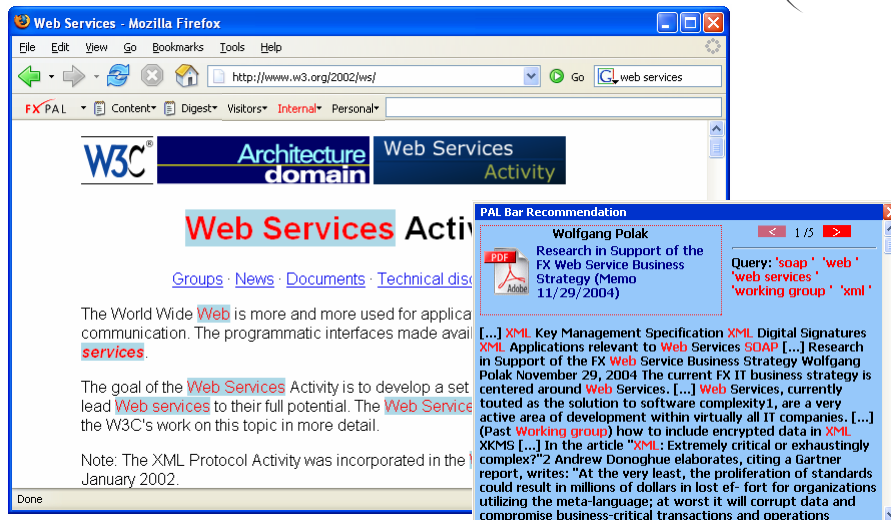
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Recommendation Windows



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Recommendation Windows

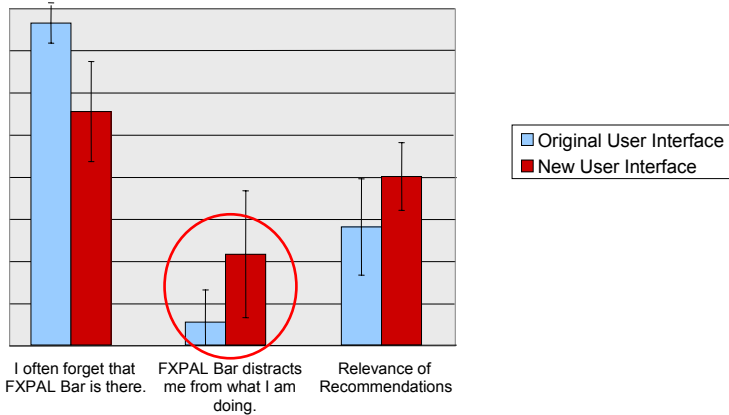


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Effects of UI Changes



Effects of Changes to
FXPAL Bar User Interface



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Recommendation Digests



FXPAL Bar Recommendation Digest - Microsoft Internet Explorer

Address: http://billtop/PeopleServices/RecommendationDigest.aspx?uHas

FXPAL | Digest | Visitors | Internal | Personal

FXPAL Bar Recommendation Digest (1/10/2005 - 1/10/2005)

Hello Daniel,

Here's your personal recommendation digest. Based on web sites or email messages you've accessed between **Monday, January 10, 2005 12:00 AM** and **Monday, January 10, 2005 3:33 PM**, the FXPAL Bar server has selected several resources that were recommended to you repeatedly. Here are the top 10 recommendations.

Title	Type	Authors / Owners	Date Added	Related URLs visited	Total	Sessions
Panel: New Directions in Music Information Retrieval	Report	Foote	7/1/2001	5	7	1
SIGIR Forum - Challenges in IR and Language Modeling	Bookmark	Billsus	11/7/2003	5	7	1
Natural Language Processing and Information Retrieval	Report	Billsus	1/22/2003	4	6	1
Commercializing FXPAL Audio Technology: Market Analysis and	Report	Cooper, Foote	11/11/2002	4	6	1

Local intranet

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Demo



- Multimedia Content

- PAL Bar can recommend presentations and show slides
- Users can access corresponding UbiSight videos



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Algorithm Overview



- Contact Information Matching
 - Heuristic name, address and email matching
- Document and Context Representation
 - tf-idf (term frequency – inverse document frequency)
 - Vector-Space representation
- Query Generation
 - Sorting terms by term weights to find weighted query terms
- Full-Text Search
 - Relational database with integrated full-text indexing (e.g. MS SQL Server or MySQL).
- Similarity Threshold
 - Retrieve candidate documents
 - Recommend to user if cosine similarity exceeds threshold

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Query Generation



- Goal
 - Convert current document to query that retrieves relevant documents
- Corporate Memory Bias
 - Query should reflect current context **and** document collection
- Algorithm
 - Find set of words and word pairs that are frequently informative in document collection: *corporate topics*
 - Convert context to two term vectors: unigram and bigram term weights
 - Use term vectors and set of frequently informative words to construct weighted query

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Query Generation



- Example
 - ISABOUT (“junk mail” weight (0.512), “mail filters” weight (0.439), “junk” weight (0.753), “filters” weight (0.424), “mail” weight (0.396))

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Future Work



- Email integration
- Usable access control
- Mobile device capture and access
- Enterprise knowledge portal
- Text mining, e.g. trend discovery
- Visualizing corporate memory (topic clouds, etc)

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Corporate Memory for Sales Support



Research Tool at FXPAL

FX PAL Content Digest Visitors Internal Personal Full-text search

Sales Support Tool at Kanagawa Xerox

Customization,
configuration,
minimal
development

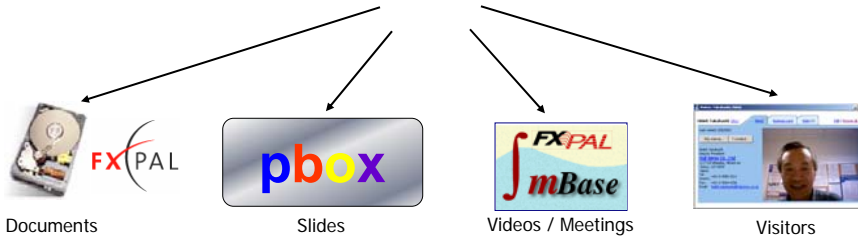


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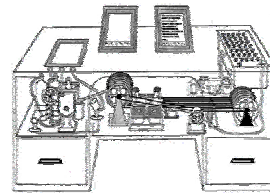
Summary



FXPAL Content* Digest* Visitors* Internal* Personal*



One step closer to a
“Corporate Memex”



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Thank You



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<http://www.fxpal.com/>

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