



Session Viewer:

Visual Exploratory Analysis of Web Session Logs

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Web Session Log Data

- Basic unit of web session log analysis is a session
- **Session** is a time-stamped sequence of events performed by a user
- Each **event** represents a user action,
e.g., submitting a query, clicking on a result link
- A **session population** is a group of sessions with shared characteristics,
e.g., task type or usage patterns

Web Session Log Data

- Both sessions and events have attributes
 - Session attributes include total duration, total number of events
 - Event attributes include time stamp, page title, page URL
- Example user study log
 - collected with browser plug-in from a study with volunteer users

Panel	PanelID	Queue	Navigation_Event	Event	URL	Title
1	15238	44	Begin_Section	1		
2	15238	45	Begin_Objective	1		
3	15238	45	Go to Start URL of Objecti	31	http://www.msn.com	
4	15238	45	Browser Navigate	59	http://search.msn.com/results.asp	MSN Search: london and tours
5	15238	45	Browser Navigate	118	http://www.london-tours.info/	London Tours Info - over 70 London, UK & Pari
6	15238	45	Browser Add Favorite	175	http://www.london-tours.info/	London Tours Info - over 70 London, UK & Pari
7	15238	45	Browser Navigate	204	http://www.london-tours.info/lond	Discovering London (Full Day Tour No 4) Ticke
8	15238	45	Browser Back	244	http://www.london-tours.info/	London Tours Info - over 70 London, UK & Pari
9	15238	45	Browser Navigate	265	http://www.london-tours.info/lond	Oxford, Stratford & Warwick Castle (Tour 23) Ti
10	15238	45	Browser Back	316	http://www.london-tours.info/	London Tours Info - over 70 London, UK & Pari
11	15238	45	Browser Back	320	http://search.msn.com/results.asp	MSN Search: london and tours
12	15238	45	End_Objective	360		

Web Session Log Analysis

- Analysis provides better understanding of web usage behaviours to improve support
- Two main approach in analysis:
 - **Detailed-session**: look at sessions one by one, event by event
 - **Aggregate-statistical**: look at session/event attributes using statistics (e.g., total task time)
- Both methods have merits and problems:
 - **Detailed-session**: can understand usage, but only analyze a very small portion of data and may have selection bias
 - **Aggregate-statistical**: highly scalable, but understand sessions by attributes and may be too hypothesis-driven

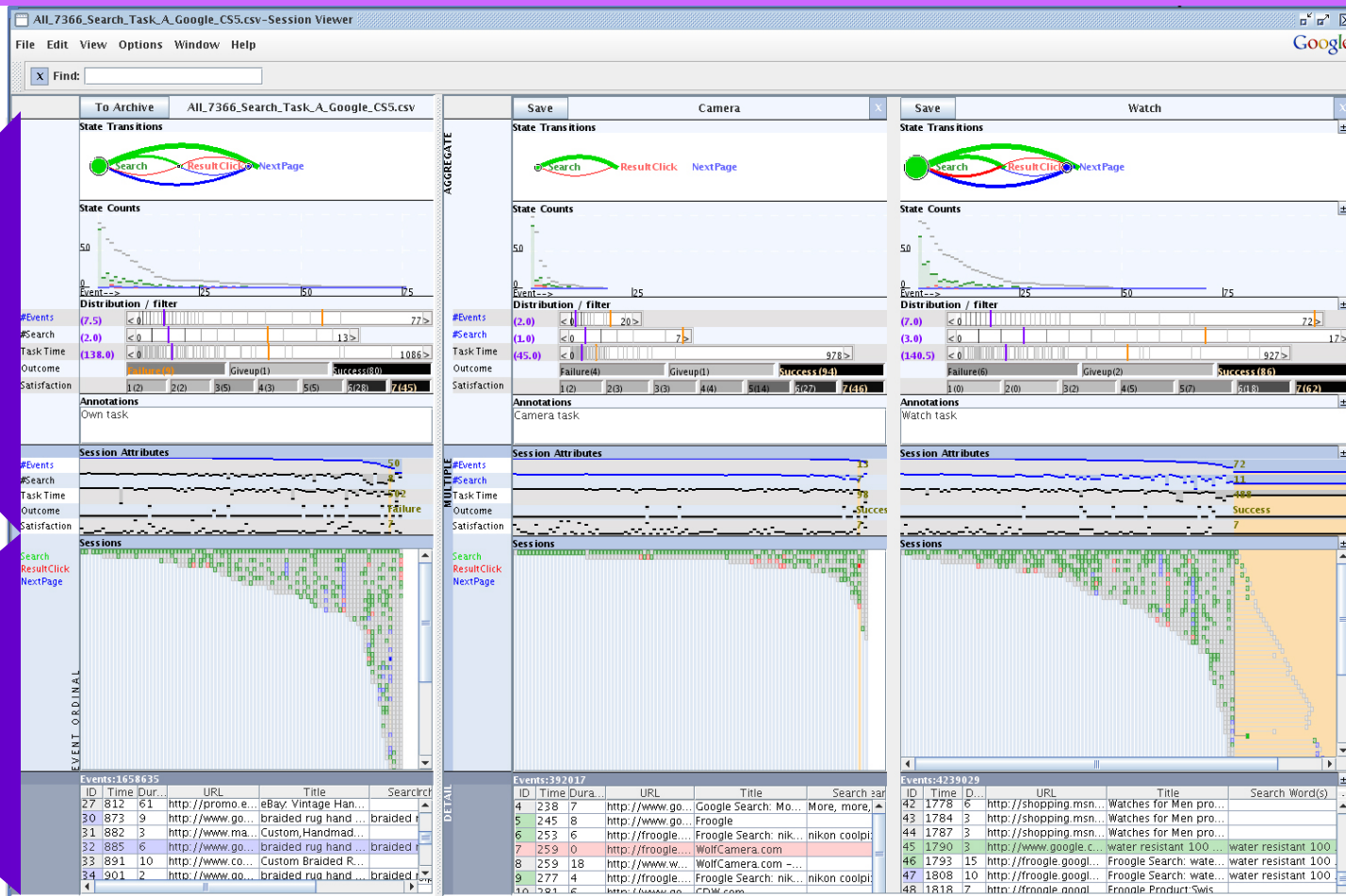
Visualization and Exploratory Analysis

- Visualization can support data exploration and bridge between the detailed and statistical analysis approaches
 - **Detailed**: guides session selection with session-attribute distribution
 - **Aggregate**: provides context and content to statistical results

➤ Session Viewer

- Displays **multiple data levels** to facilitate cross-level analysis
- Displays **multiple session populations** for side-by-side population comparisons

Session Viewer: Main Screen



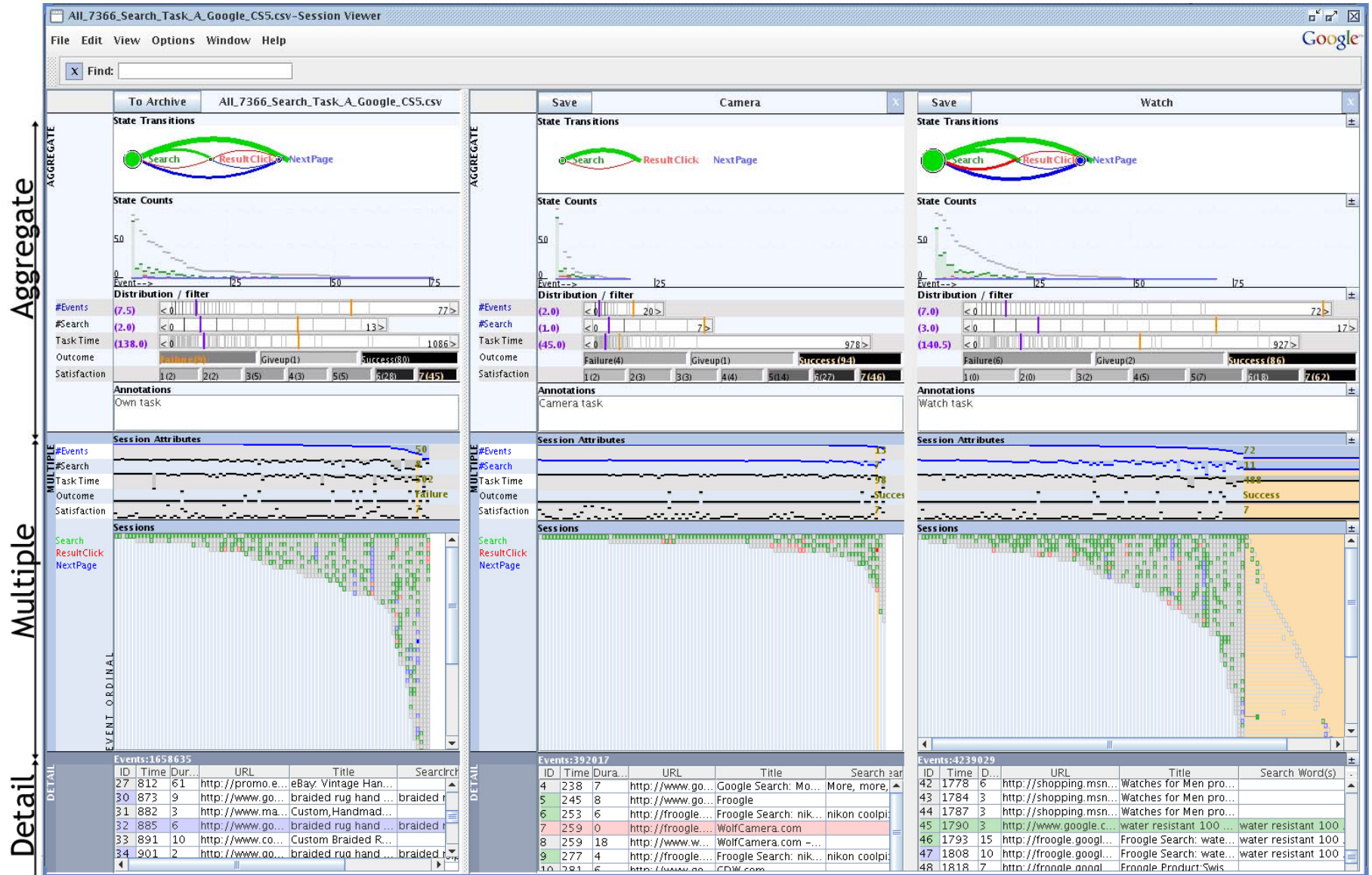
attributes

data

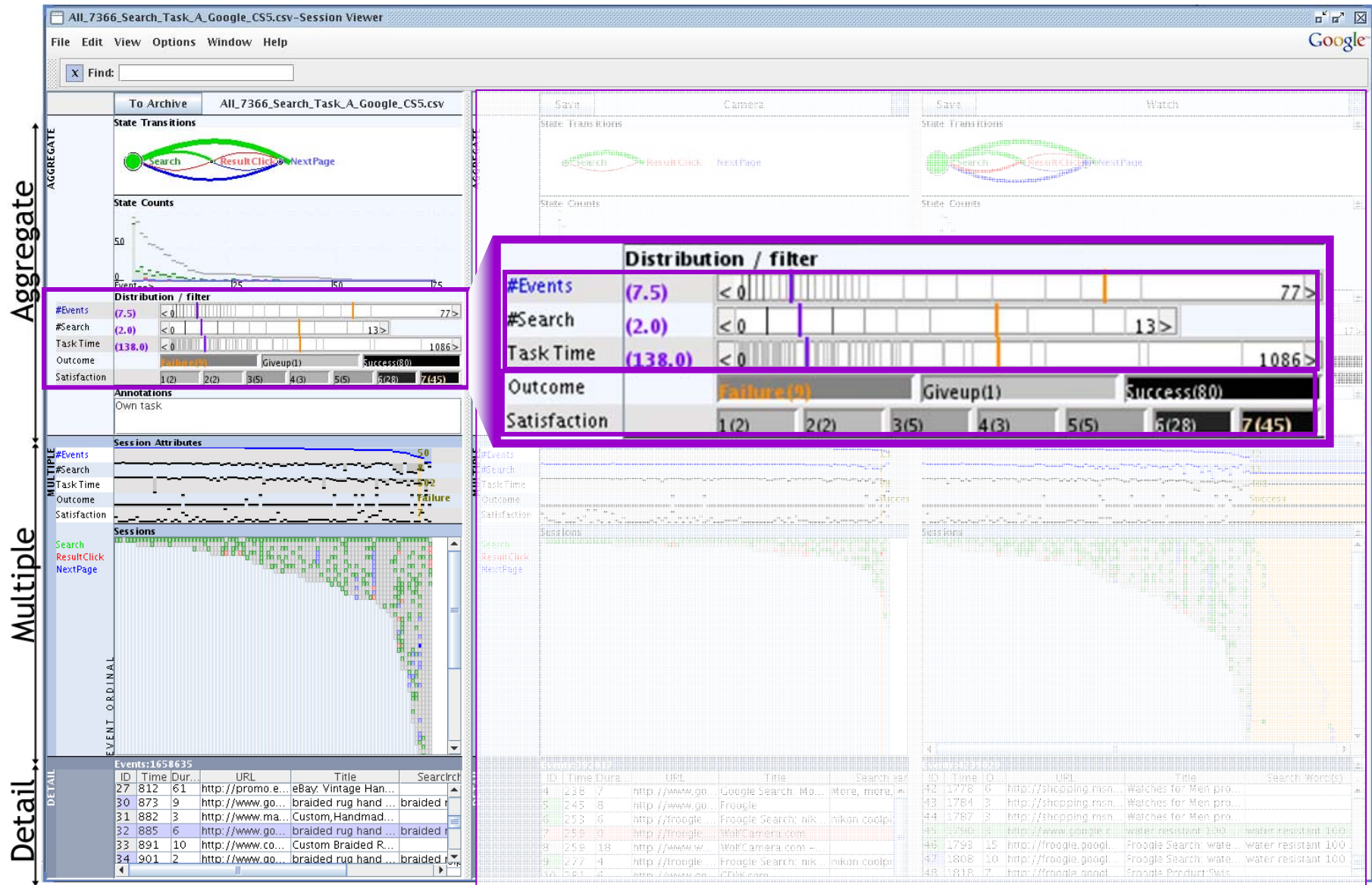
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Session logs

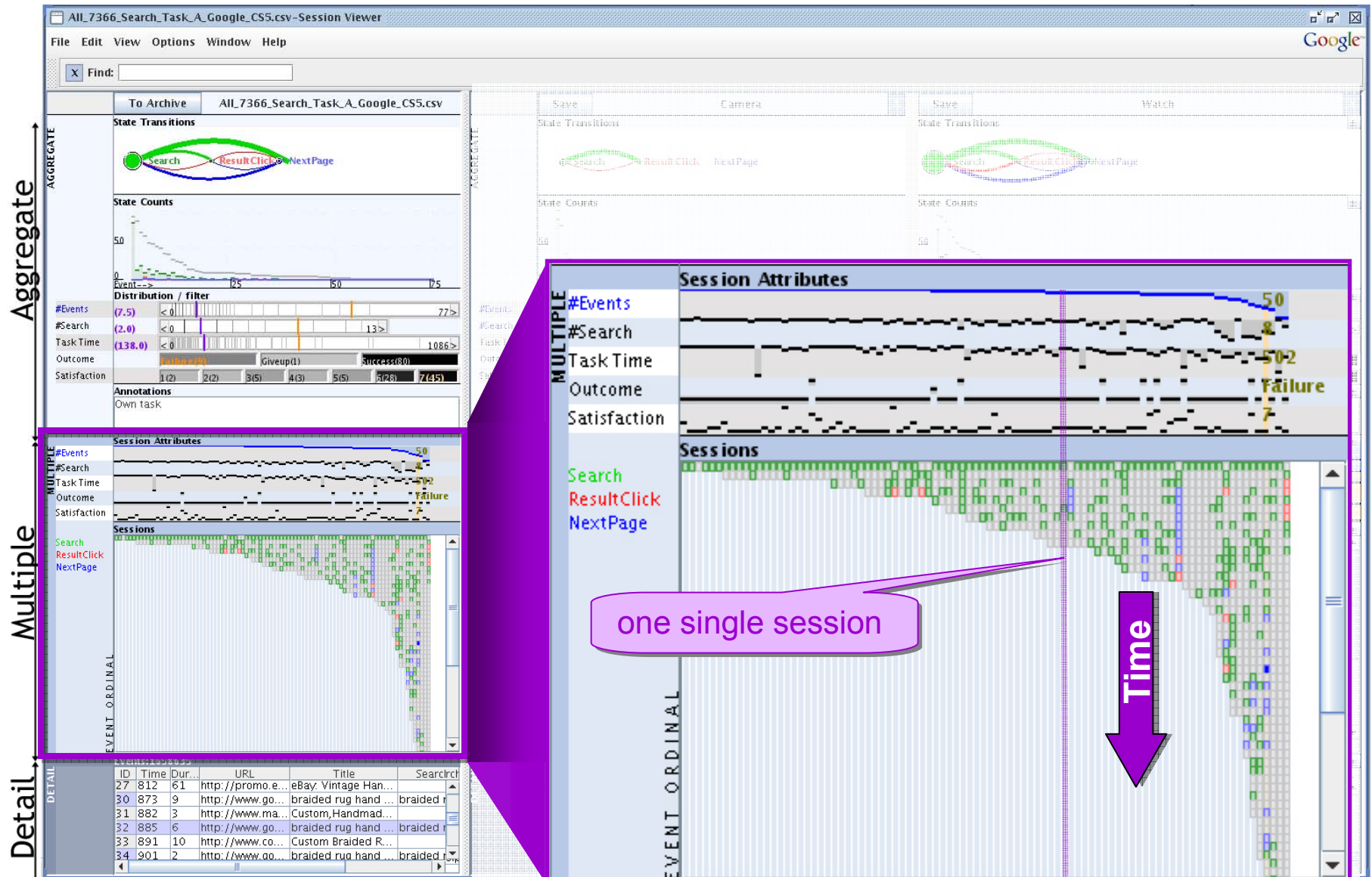
Session Viewer: Multiple Data Levels



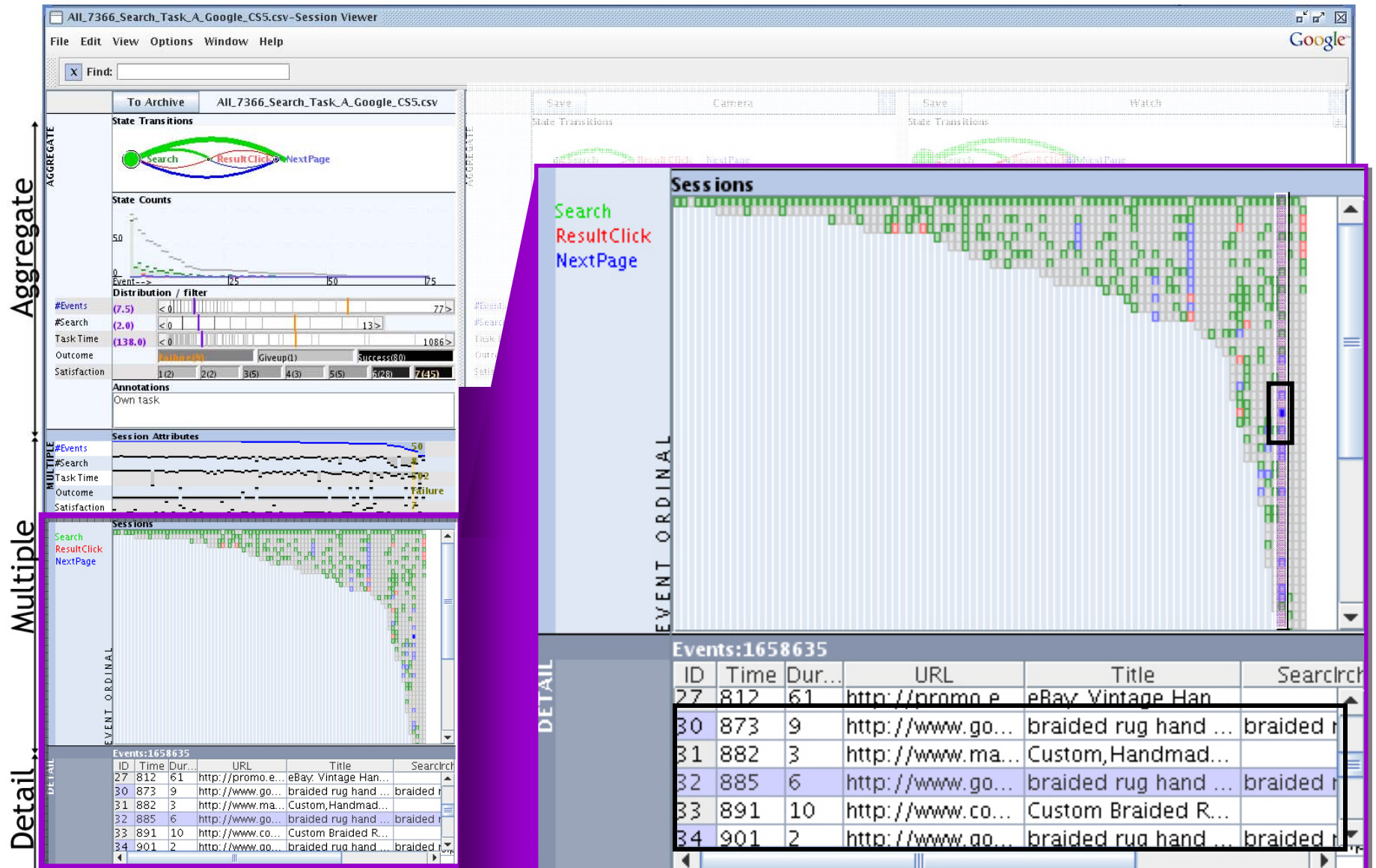
Session Viewer: Aggregate Level



Session Viewer: Multiple Level



Session Viewer: Multiple & Detail Levels

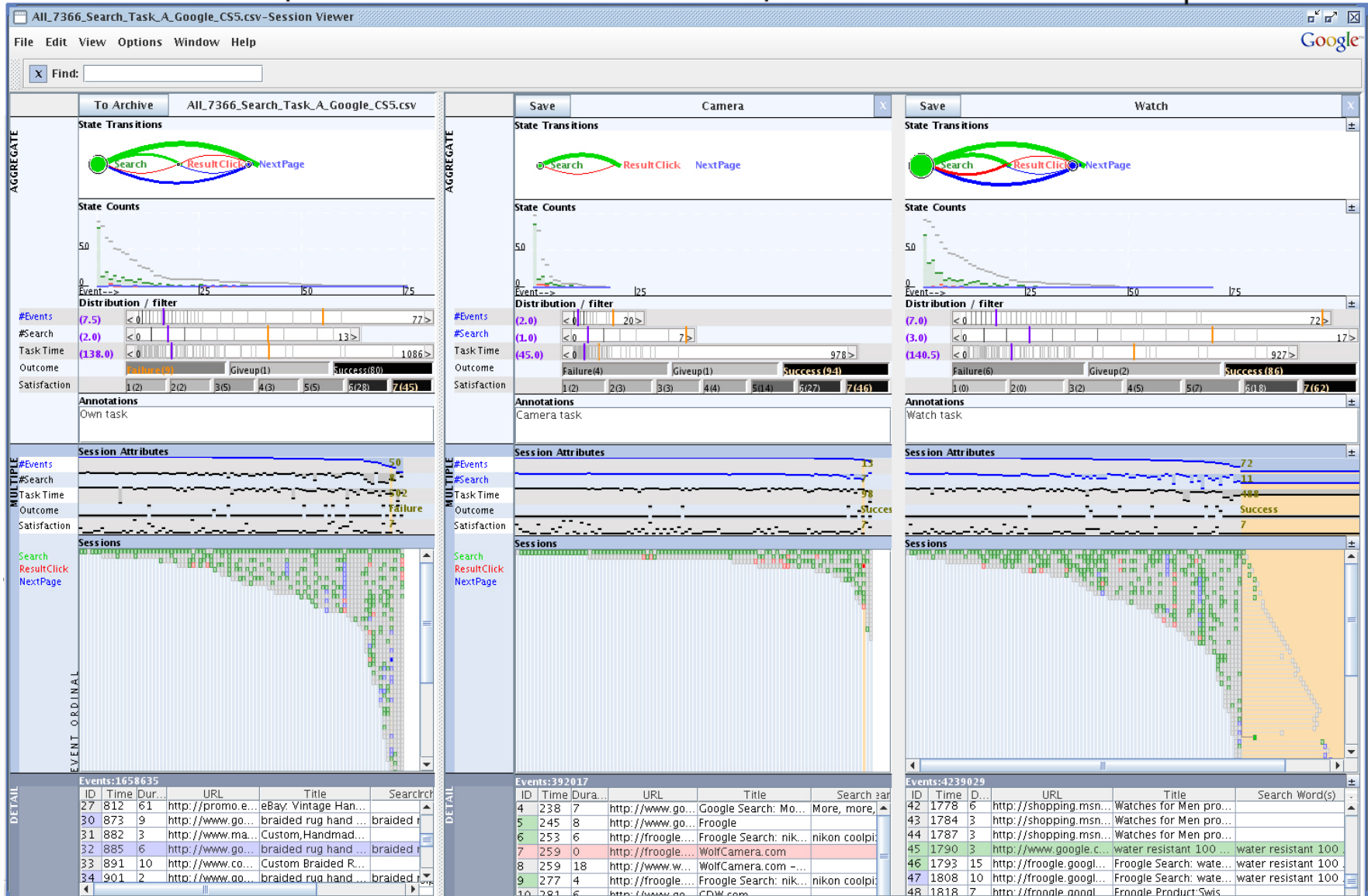


Session Viewer: Multiple Population Views

"Own" Task Population

"Camera" Task Population

"Watch" Task Population



Use-case Scenario: Analyzing Study Logs

- Illustrate the use of Session Viewer with existing study log data
 - Large-scale user study conducted by Keynote
 - Study log data collected with browser plug-in with user consent
- Study gathered >6,000 sessions, grouped by
 - Search engine type
 - Search domain (Image, Shopping, News, Local/Maps)
 - Question variant (3 pre-defined, one participant's own)
 - E.g., “Camera” task to look for image resolution of a camera, and the “Watch” task to look for a water-resistant watch under \$100
- Study Logs analyzed previously: participants' own tasks are longer and more involved than pre-defined tasks (Russell & Grimes, 2007)

Use-case Scenario: Analyzing Study Logs

- Previous analysis identified two population groups: “Own” task, and “Pre-defined” task populations
- We revisited the same study logs with Session Viewer, and found two **new findings**:
 1. Pre-defined tasks are not isomorphic, and can be classified further by task type
 2. Task type classification, based on task instructions, is reflected as usage patterns in session logs
- We also verified correlation between two participant feedback: task outcome and satisfaction scores

Use-case Scenario: Analyzing Study Logs

- To analyze the study logs, we customized Session Viewer by defining...
 - Event types: Search, ResultClick, NextPage, and non-search engine events
 - Session attributes
 - Calculated based on event attributes: #Events, Task Time
 - Read from log: Task Outcome, Satisfaction scores

Use-case Scenario: Three Shopping Populations

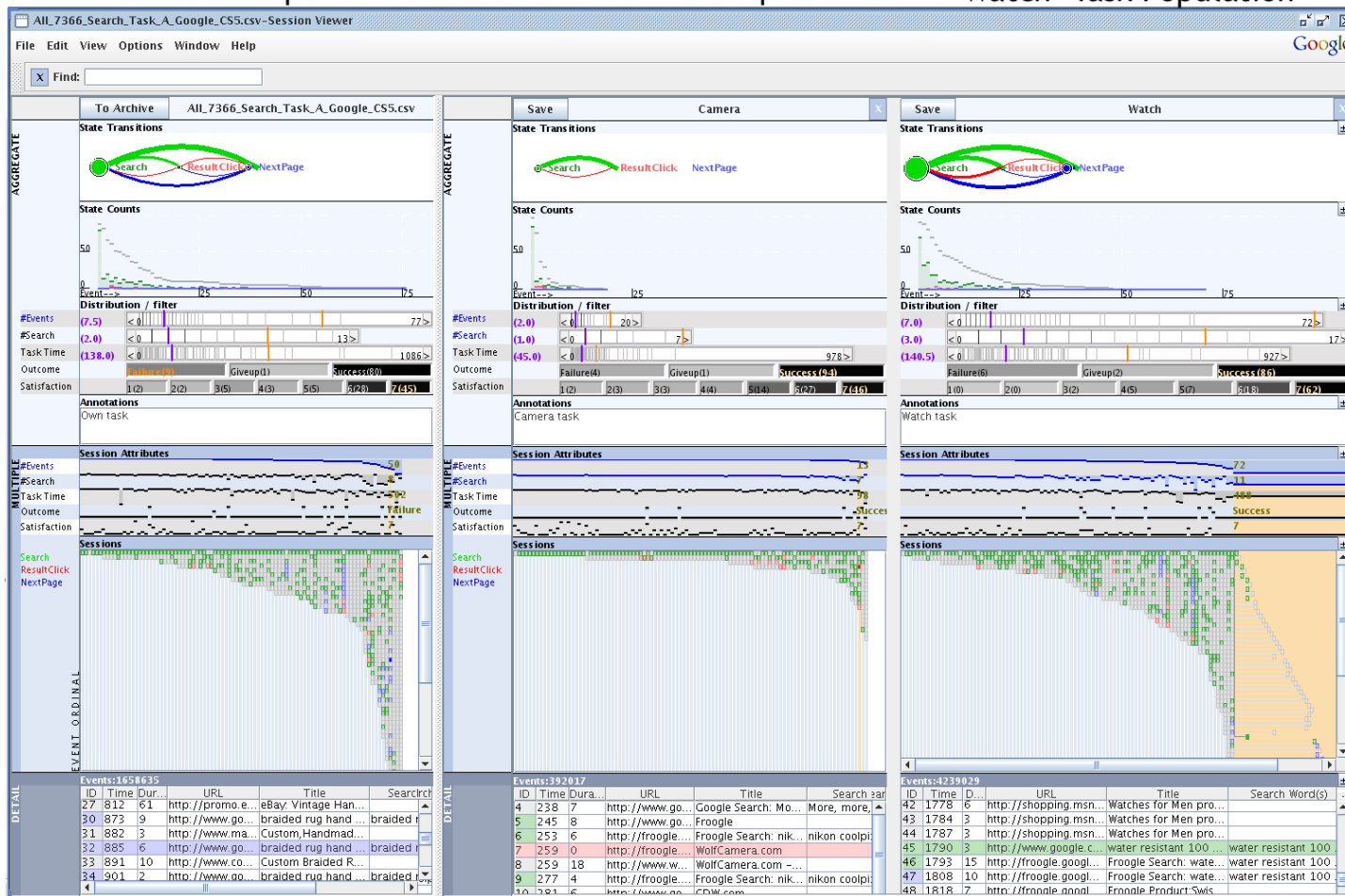
How many megapixels is the image resolution of the Nikon Coolpix 4600?

Find a water-resistant watch for under \$100

"Own" Task Population

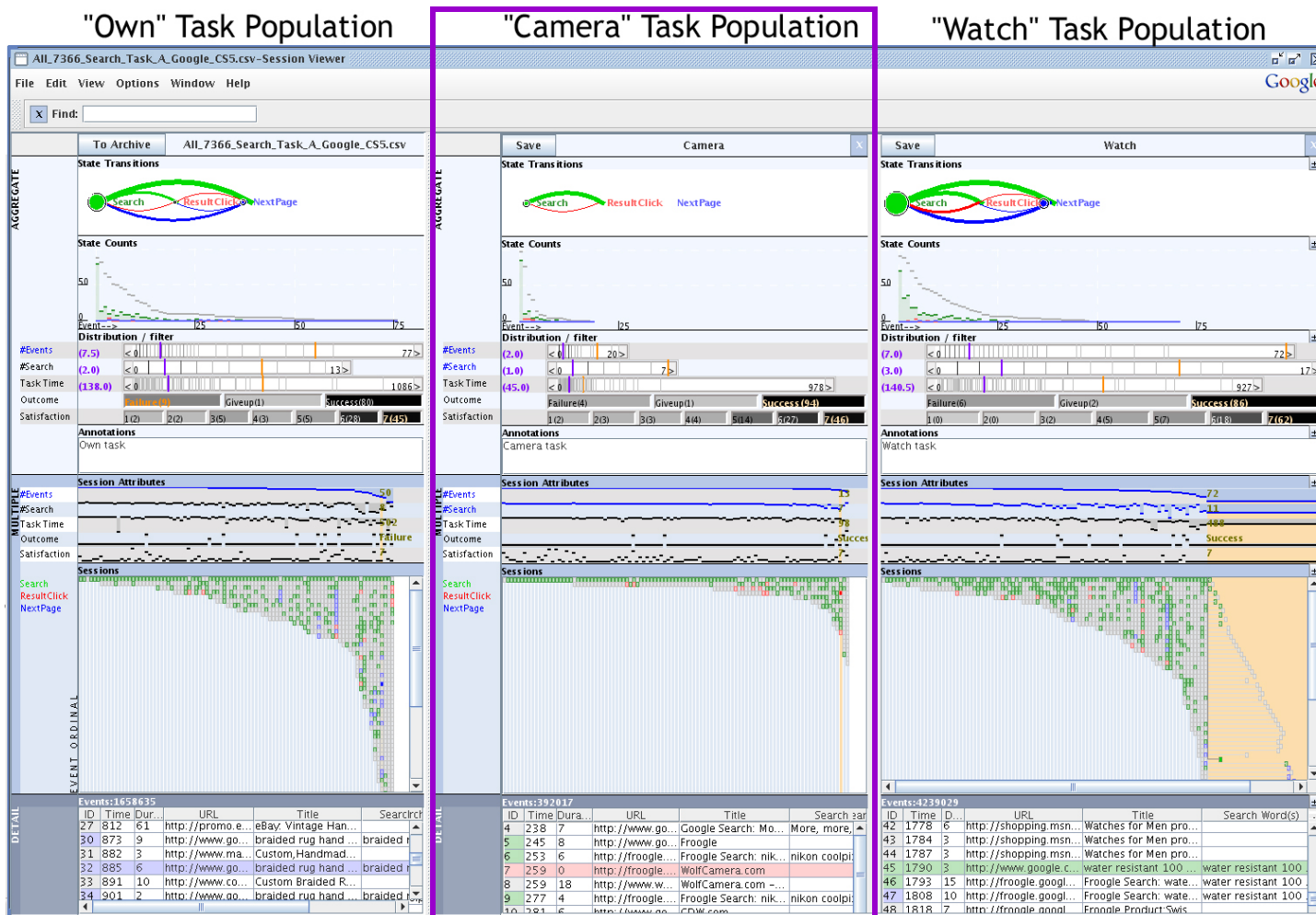
"Camera" Task Population

"Watch" Task Population



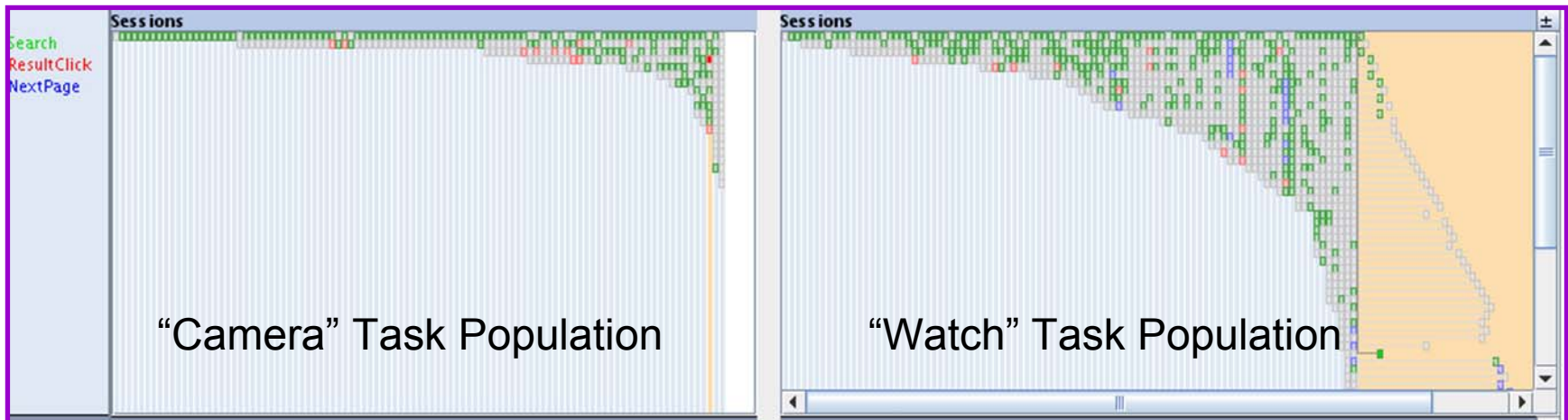
Use-case Scenario: Compare between aggregates

- Expected the populations to look similar, as the question variants were assumed to be isomorphic
- But the “Camera” task population has shorter sessions with fewer events



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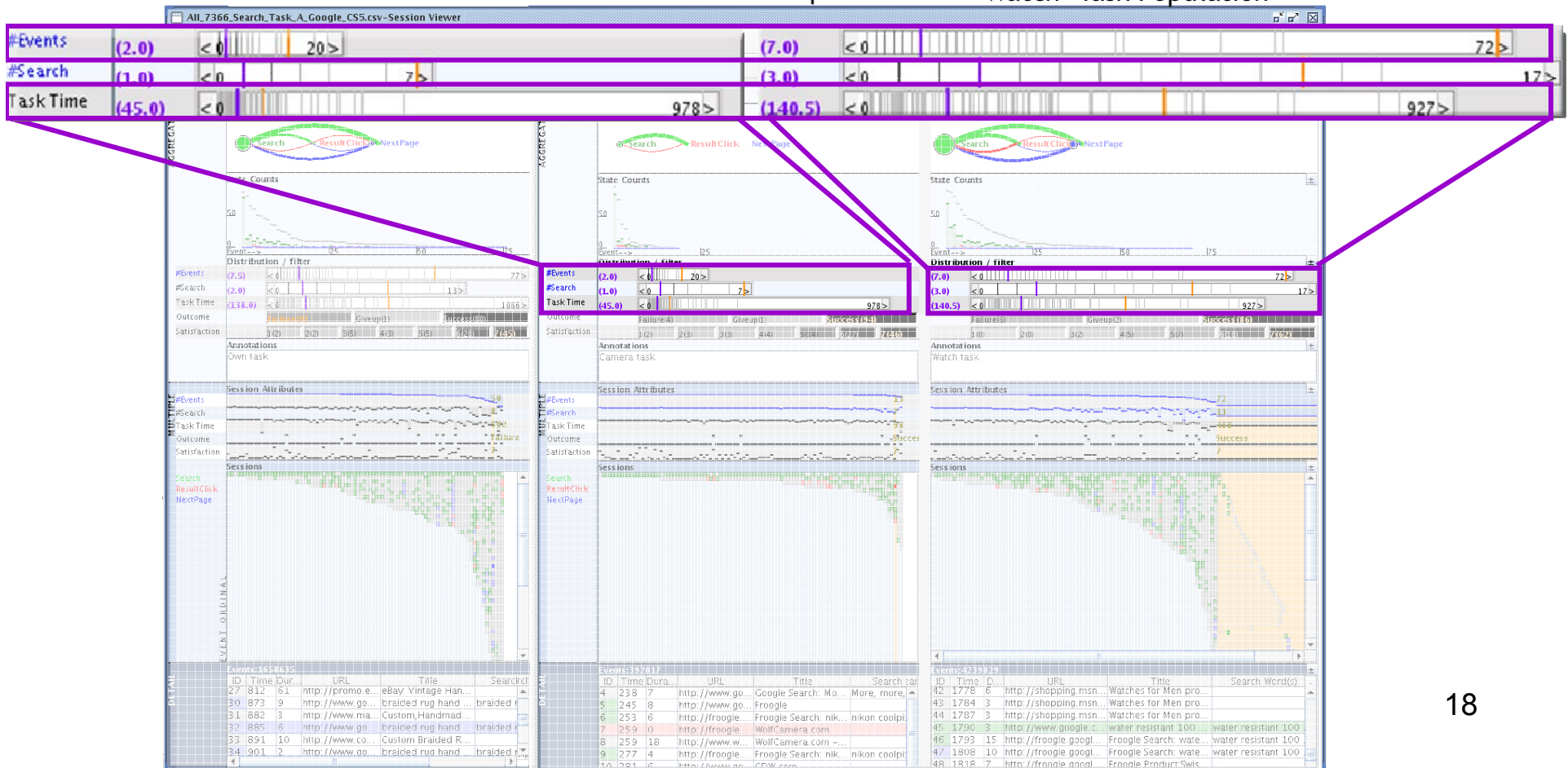
EVENTS SUMMARY					EVENTS SUMMARY					EVENTS SUMMARY							
ID	Time	Dur...	URL	Title	Search	ID	Time	Dur...	URL	Title	Search	ID	Time	Dur...	URL	Title	Search
27	812	81	http://promo.e...	eBay Vintage Han...	Search	4	238	7	http://www.go...	Google Search: Mo...	More, more, >	42	1778	6	http://shopping.msn...	Watches for Men pro...	
30	873	9	http://www.go...	braided rug hand...	braided	5	245	8	http://www.go...	Froogle Search: nik...	nikon coolpi...	43	1784	3	http://shopping.msn...	Watches for Men pro...	
31	882	3	http://www.ma...	Custom Handmad...	braided	6	253	6	http://froogle...	WolfCamera.com		44	1787	3	http://shopping.msn...	Watches for Men pro...	
32	885	6	http://www.go...	braided rug hand...	braided	7	259	0	http://froogle...	WolfCamera.com		45	1790	3	http://www.google.c...	water resistant 100...	water resistant 100
33	891	10	http://www.co...	Custom Braided R...		8	259	18	http://www.w...	WolfCamera.com		46	1793	15	http://froogle.googl...	Froogle Search: wate...	water resistant 100
34	901	2	http://www.go...	braided rug hand...	braided	9	277	4	http://froogle...	Froogle Search: nik...	nikon coolpi...	47	1808	10	http://froogle.googl...	Froogle Search: wate...	water resistant 100
4						10	321	16	http://www.co...	WolfCamera.com		48	1818	7	http://froogle.googl...	Froogle Product Swis...	

Use-case Scenario: Compare between aggregates

- Expected the populations to look similar, as the question variant were assumed to be isomorphic
- But the “Camera” task population has shorter sessions with fewer events

“Camera” Task Population

“Watch” Task Population



Use-case Scenario: Compare between aggregates

Directed, closed, information search*

How many megapixels is the image resolution of the Nikon Coolpix 4600?

Information locate*

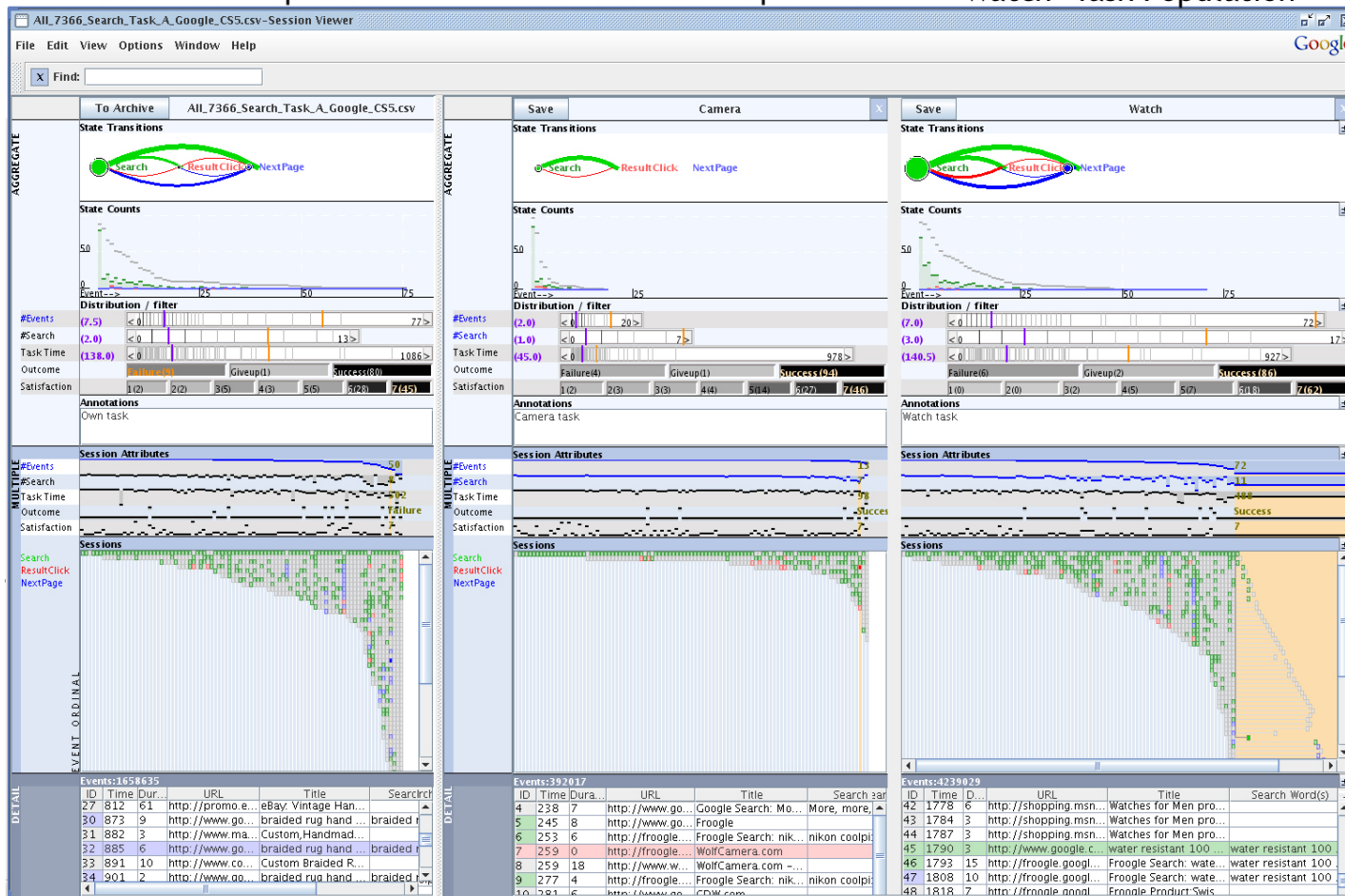
*based on Rose & Levinson 2004

Find a water-resistant watch for under \$100

"Own" Task Population

"Camera" Task Population

"Watch" Task Population

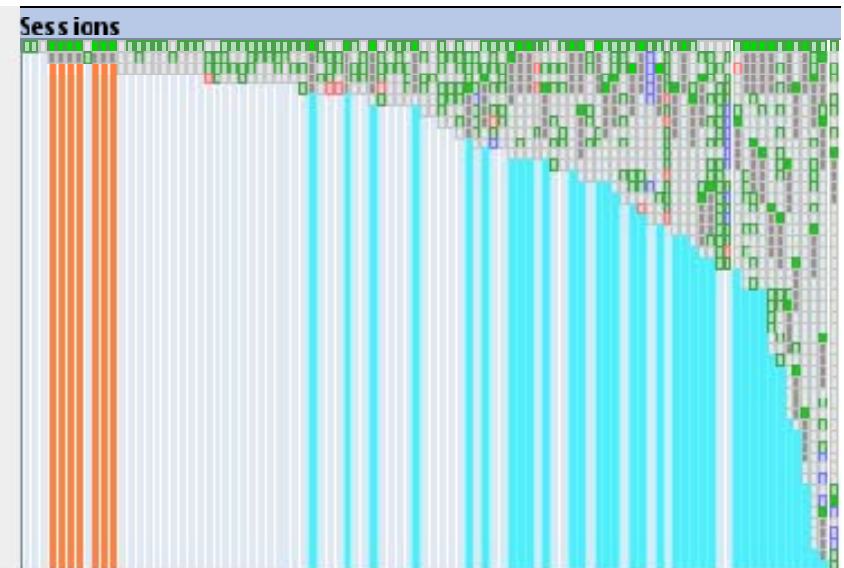


Use-case scenario: Usage-pattern distributions

- How do these populations differ?
- Iteratively defined usage patterns:
 - Short navigation: S[Start] → X[End]
 - Topic exploration: S → X → X → X
- More Short navigations in Camera-Task population
More Topic explorations in Watch-Task population



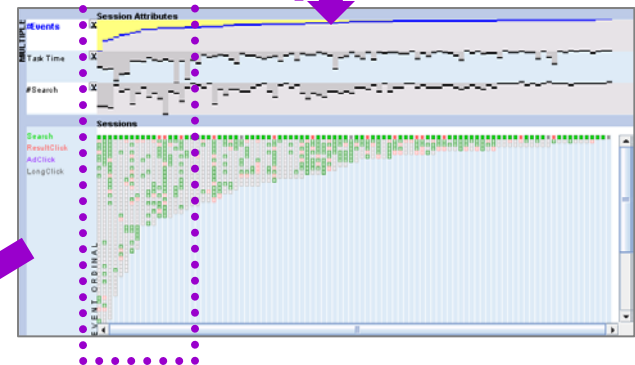
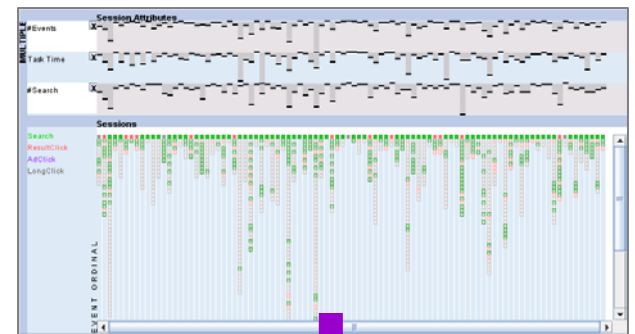
Camera Task Population



Watch Task Population

Use-case scenario: Usage pattern details

- Short-navigation makes sense for direct, closed information task (look for image resolution in Nikon Coolpix 4600)
- What is Topic Exploration ($S \rightarrow X \rightarrow X \rightarrow X$)? What were the participants doing in those non-search engine events?



1. Sorted sessions by event count
2. Focused on sessions with larger number of events
3. Expand sessions to better view usage patterns

ID	Time	Durat.	Action	Prop.	URL	Title
27	604	12.0	(None)	(All)	http://www.amazon.com/exec/obidos/fg/detail-...	Amazon.com: Jewelry & Watches: Buy F...
28	700	12.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...
29	712	8.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...
30	720	6.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...
31	726	3.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...
32	729	5.0	(None)	(All)	http://www.amazon.com/exec/obidos/fg/detail-...	Amazon.com: Jewelry & Watches: Build...
33	734	5.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...
34	739	20.0	(None)	(All)	http://www.amazon.com/exec/obidos/fg/detail-...	Amazon.com: Jewelry & Watches: Build...
35	759	5.0	(None)	(All)	http://www.amazon.com/gp/search.html?103-0...	Amazon.com Jewelry & Watches: By Fe...

Use-case scenario: 2D expanded sessions

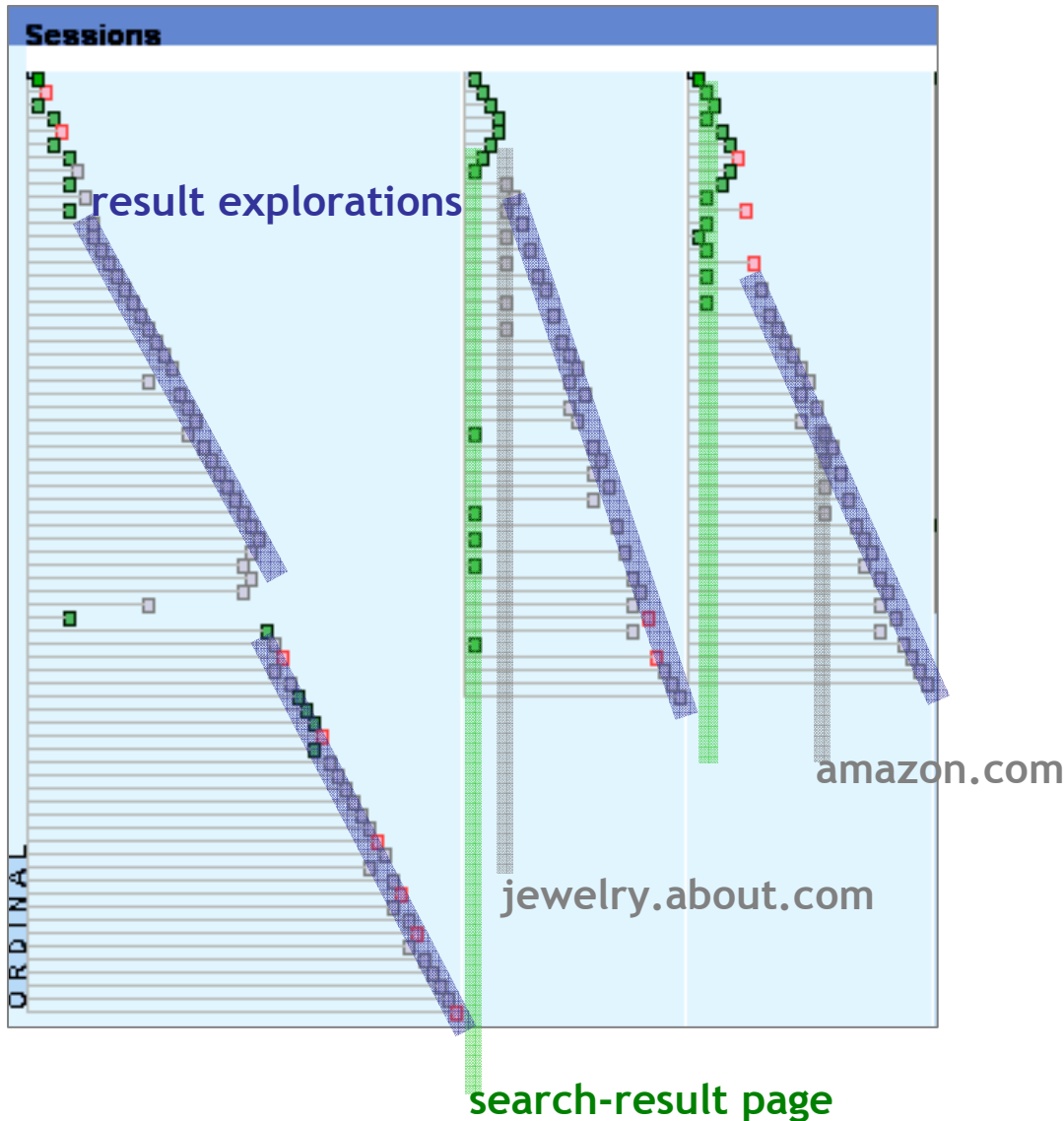


amazon.com

search-result page

URL	Title
http://froogle.google.com/froogle?hl=en&lr&oi...	Froogle Search: water resistant watches
http://froogle.google.com/froogle?q=water+re...	Froogle Search: water resistant watches
http://www.google.com/search?hl=en&lr=&q=...	water resistant watches - Google Search
http://www.google.com/url?sa=l&ai=Bf465ug...	Timepieces International Inc - (Klaus Kobec and ...
http://www.google.com/search?hl=en&lr=&q=...	water resistant watches - Google Search
http://www.google.com/search?hl=en&q=wat...	watches - Google Search
http://www.google.com/search?hl=en&lr=&q=...	water resistant watches - Google Search
http://www.google.com/url?sa=l&ai=B5rwKug...	The Sharper Image - Search Results
http://www.google.com/search?hl=en&lr=&q=...	water resistant watches - Google Search
http://www.chronocentric.com/watches/wresi...	Chronocentric: Water Resistance
http://www.google.com/search?hl=en&lr=&q=...	water resistant watches - Google Search
http://www.amazon.com/gp/browse.html?_en...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/gp/browse.html?rh=...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/gp/search.html/sr=3-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/exec/obidos/tg/detail...	Amazon.com: Jewelry & Watches: Bulova Carave...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
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http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/exec/obidos/tg/detail...	Amazon.com: Jewelry & Watches: Bulova Carave...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/exec/obidos/tg/detail...	Amazon.com: Jewelry & Watches: Pulsar Men's ...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
http://www.amazon.com/exec/obidos/tg/detail...	Amazon.com: Jewelry & Watches: Bulova Carave...
http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...
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http://www.amazon.com/gp/search.html/103-...	Amazon.com Jewelry & Watches: By Feature / W...

Use-case scenario: Usage pattern details

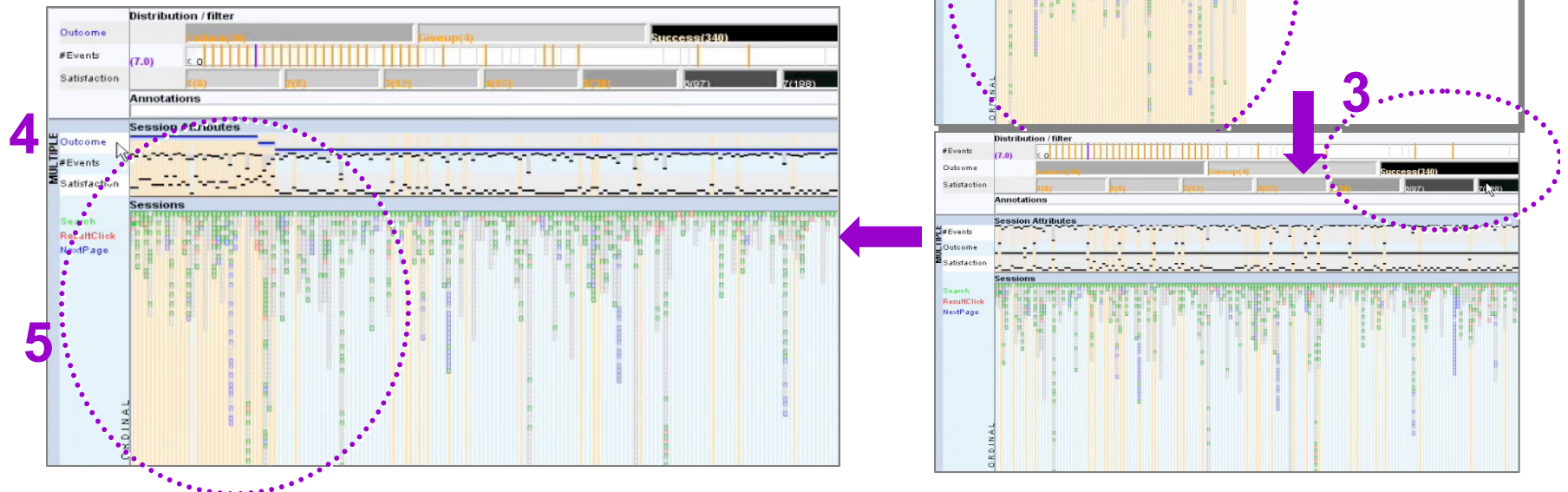


Patterns found:

- Search-engine searches
- 3rd Party searches
- Result explorations

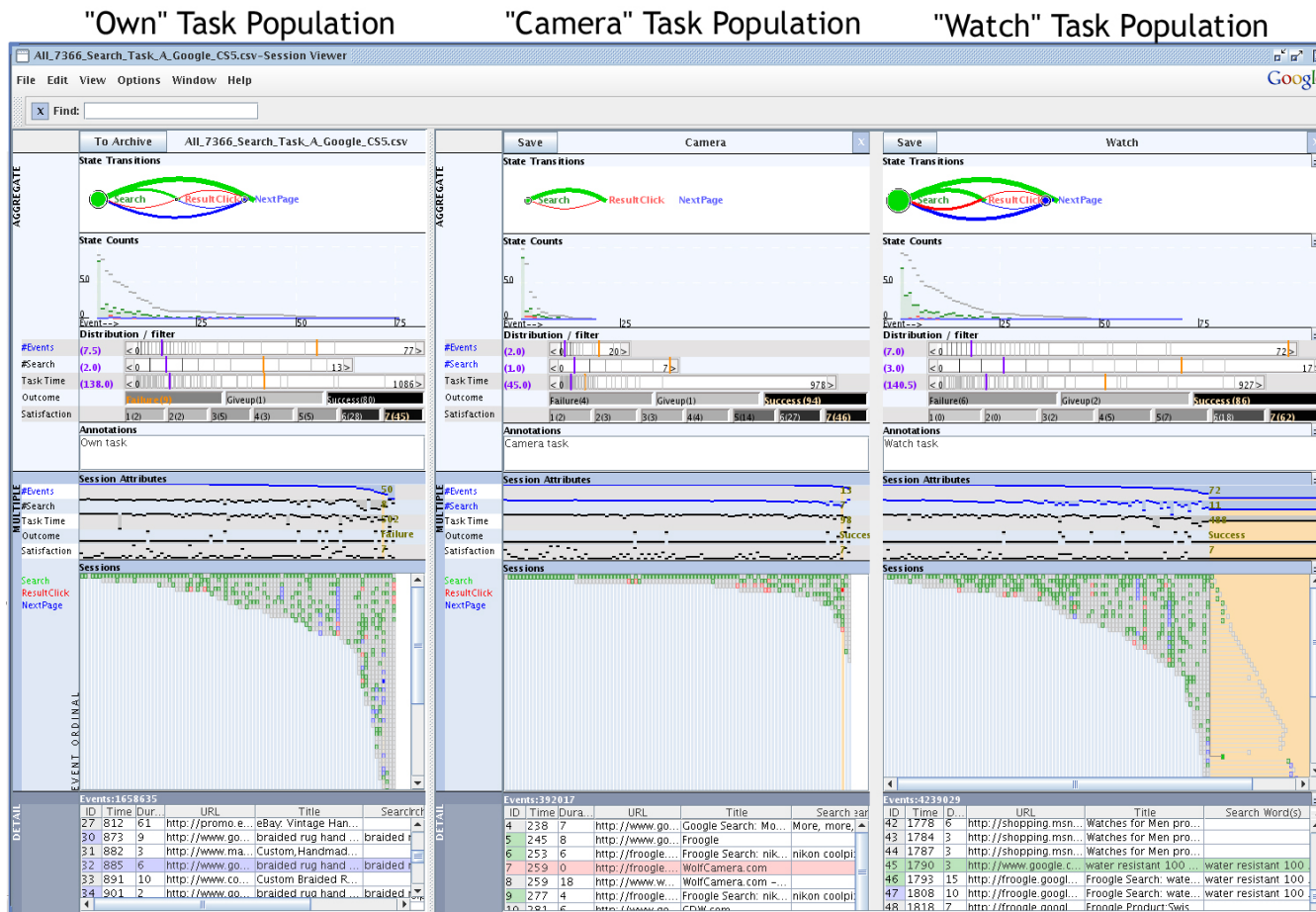
Use-case scenario: Correlations

- Does participant's outcome correlate with their satisfaction score?
 - Outcome (Success/Failure/Given-up)
Score (1 - 7, 7=most satisfied)
- 1. Remove sessions with scores of 6 and 7
- 2. Highlight remaining sessions (≤ 4)
- 3. Add the high-score sessions back
- 4. Reorder by Task Outcome
- 5. Highlighted low-score sessions clustered at the poor-outcome end suggests high correlation



Session Viewer and Analysis: Multiple Populations

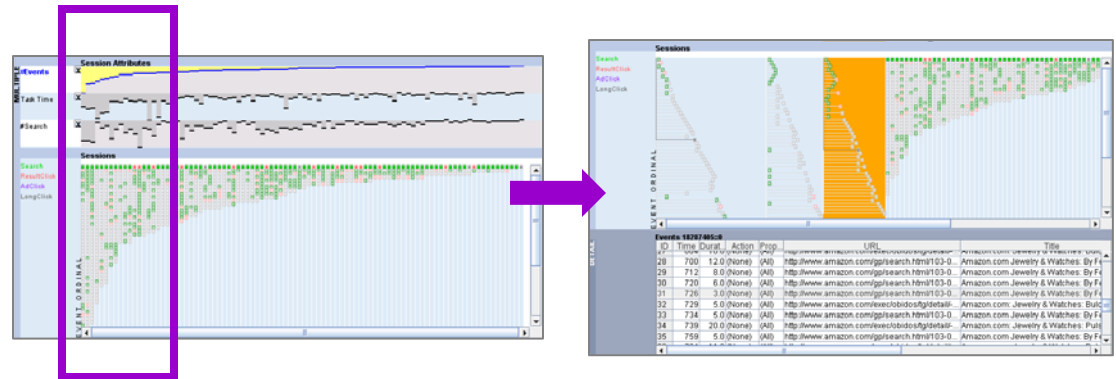
- Provides **multiple views** for side-by-side comparisons to quickly get a sense of population characteristics based on aggregates
- Camera-Task population looks different



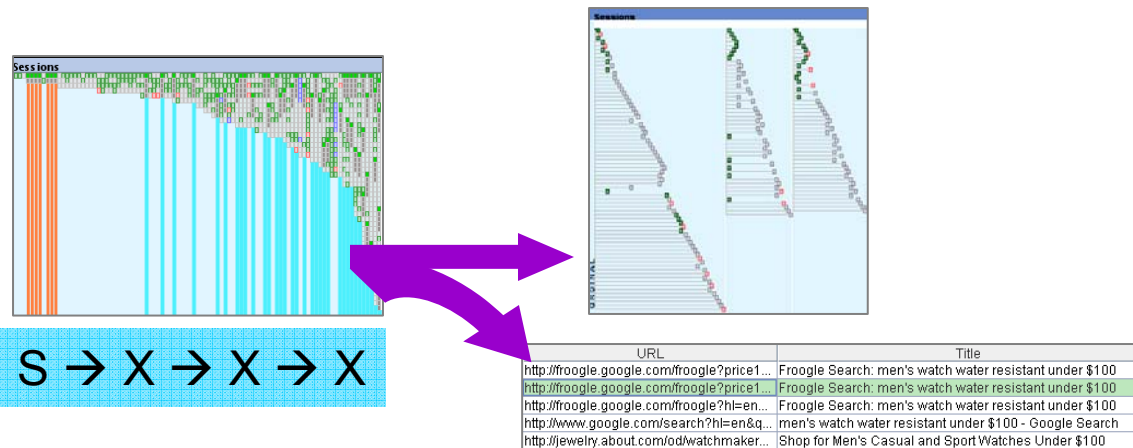
Session Viewer and Analysis: Multiple Levels

- Displays **multiple data levels** to bridge between the high-level statistical and low-level detailed analysis approaches

- **Detailed analysis:**
Reordered session helps select interesting sessions to focus analysis



- **Statistical analysis:**
Linked views provides content and context to interpret results



Summary

- Web session log analyses tend to take either the high-level statistical or low-level detailed approach
- Session Viewer provides a visual analytic tool that
 - Bridges between the two analysis levels and facilitate cross-level analysis with multiple data levels
 - Provides side-by-side population comparisons with multiple views
- We found that task type is an important factor in session analysis, and task nature is reflected in different event-sequence patterns in sessions
- In a later work, we conducted a field study with 7 analysts where they used their own data and tasks with Session Viewer

Acknowledgements

- The project was funded by Google as internships and a university grant
- I'd like to thank Dan Russell and Diane Tang for hosting me at Google