

# Personalizing Web Sites for Mobile Users

---

Corin R. Anderson

Pedro Domingos

Daniel S. Weld

University of Washington


Seattle, WA, USA


CNET.com - Welcome to CNET! - Microsoft Internet Explorer

File Edit View Favorites Tools Help

Address <http://www.cnet.com/>

[CNET](#) | [News](#) | [Hardware](#) | [Downloads](#) | [Builder](#) | [Games](#) | [Jobs](#) | [Auctions](#) | [Prices](#) | [Tech Help](#) [Free Email](#)

 **CNET.com**  
The source for computers and technology.

**Download now!**  
It's free! 


**Monday, November 27**

ADVERTISEMENT [Great Deals!](#) Search  All CNET Go! [Site Map](#) Premier desktop sponsor: [Gateway](#)

**Today on CNET**



[Malicious mail: Protect your business from viruses](#)



[CNET previews the second beta of Microsoft Office 10](#)



[Mobile computing news from Comdex](#)

Find the perfect present with [CNET's Holiday Gift Guide](#) ▶

**CNET Services**

**Hardware Reviews**  
[Desktops](#), [Notebooks](#), [Storage](#), [Monitors](#)...

**Latest Prices**  
[Desktops](#), [Memory](#), [Games](#), [Notebooks](#)...

**Consumer Electronics**  
[Wireless](#), [Handhelds](#), [Digital Photo](#), [DVDs](#)...

**Software Reviews**  
[Operating Systems](#), [Utilities](#), [Internet](#), [Webware](#)...

**Enterprise Business**  
[E-commerce](#), [IS](#), [Security](#), [Linux](#), [App Dev](#)...

**Web Services**  
[Access](#), [Web Hosting](#), [Web Developers](#)...

**Tech News**  
[Enterprise Computing](#), [E-business](#)...

**Finance & Investing**  
[Real-Time Stock Quotes](#), [My Portfolio](#), [IPOs](#)...

**Tech Auctions**  
[Desktops](#), [Monitors](#), [Storage](#)...

**Free Downloads**  
[Games](#), [Internet](#), [Most Popular](#), [Linux](#), [Mac](#)...

**Free Newsletters**  
Keep current on the latest [news](#), [products](#), and [business trends](#).

**Tech News** CNET NEWS.COM  
[Merger to create largest maker of computer, TV screens](#)

[Commentary: Business has yet to give its stamp to Net postage](#)

[E-tail sites crash over holiday weekend](#)

[Intel targets Texas Instruments in cell phone chips](#)

[Kyocera gets "smart" with cell phone-PDA combo](#)

**More CNET News**

**Quote Snapshot**

▲ <a href="#">DJIA</a>	10546.07	+75.84
▼ <a href="#">NASDAQ</a>	2880.49	-23.89

Internet



# The problem

- Most web sites designed “one-size-fits-all”
- But one size does *not* fit all
  - Visitors may have small screens
  - Visitors may want different content than immediately available
- *Sites must adapt to **information needs** and **browser constraints** of all visitors*

# Web personalization

- Content tailored to a specific audience
- Current techniques for mobile browsing
  - **Visitor** selects content (Mobile channels)
  - **Designer** builds mobile site (mobile.msn.com)
  - **Third-parties** simplify complex HTML (AvantGo)
- Useful techniques, but many weaknesses
- Instead, need **automatic** personalization

# Web site personalizers

- An intermediary between server and visitor

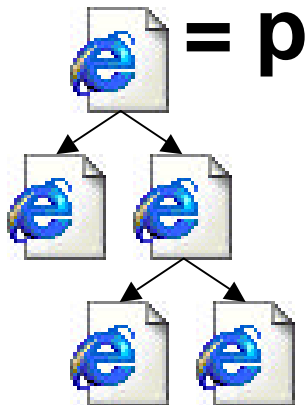


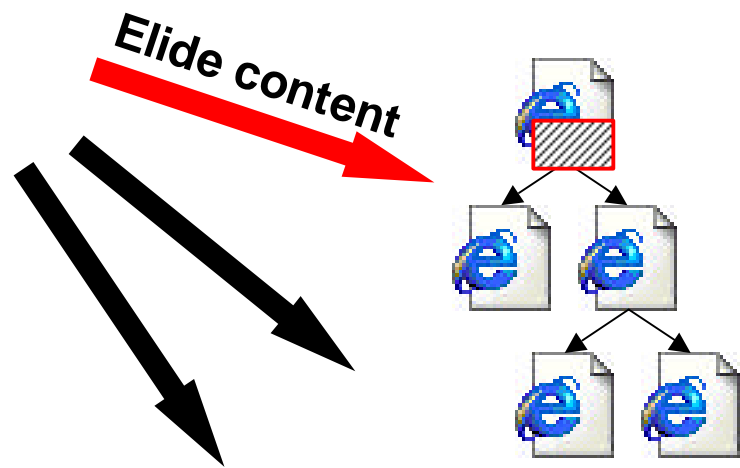
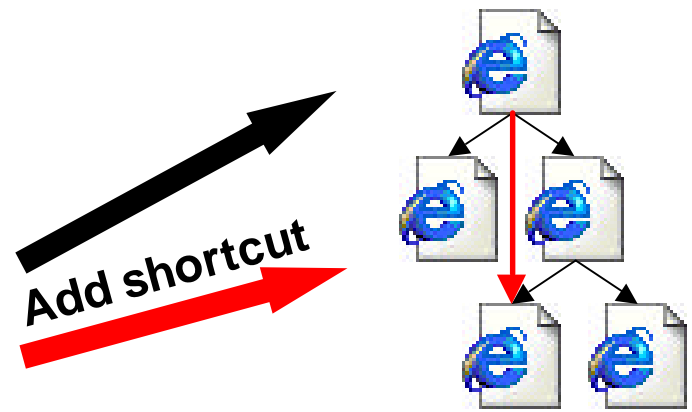
- **Automatically** adapts and customizes site for each visitor
- Personalizing in two steps:
  1. **Learn** model of visitor from access logs
  2. **Transform** content per learned model

# Proteus

---

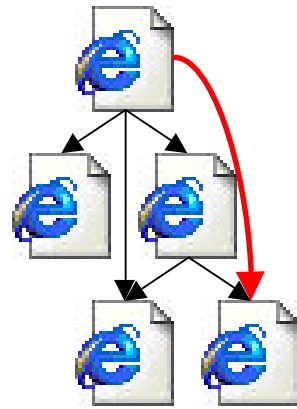
- Hill-climbing **search** over personalized web sites:



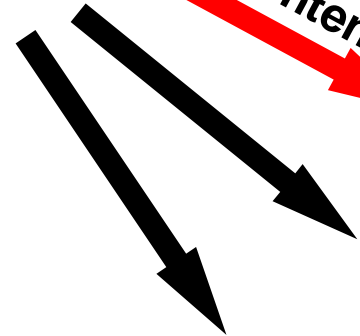
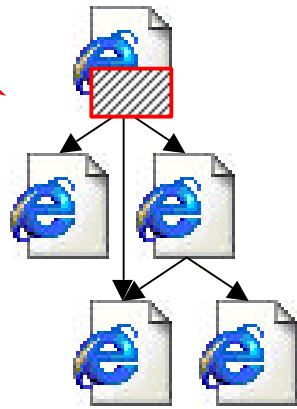




**Add shortcut**

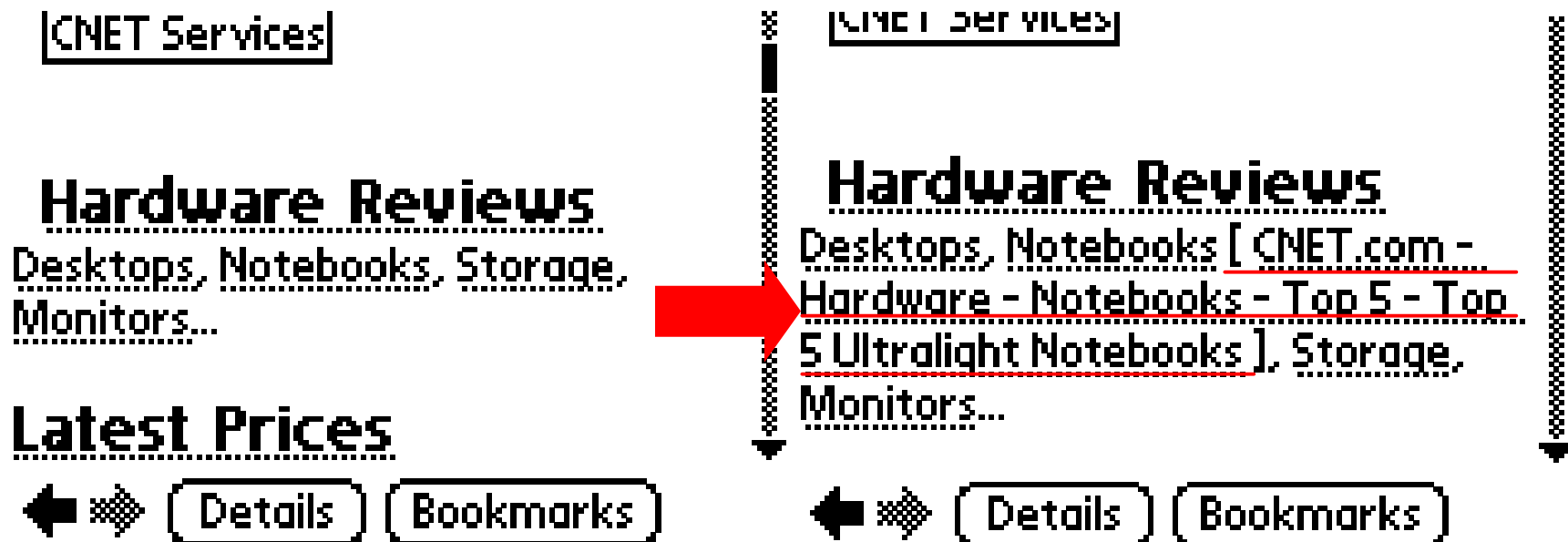


**Elide content**



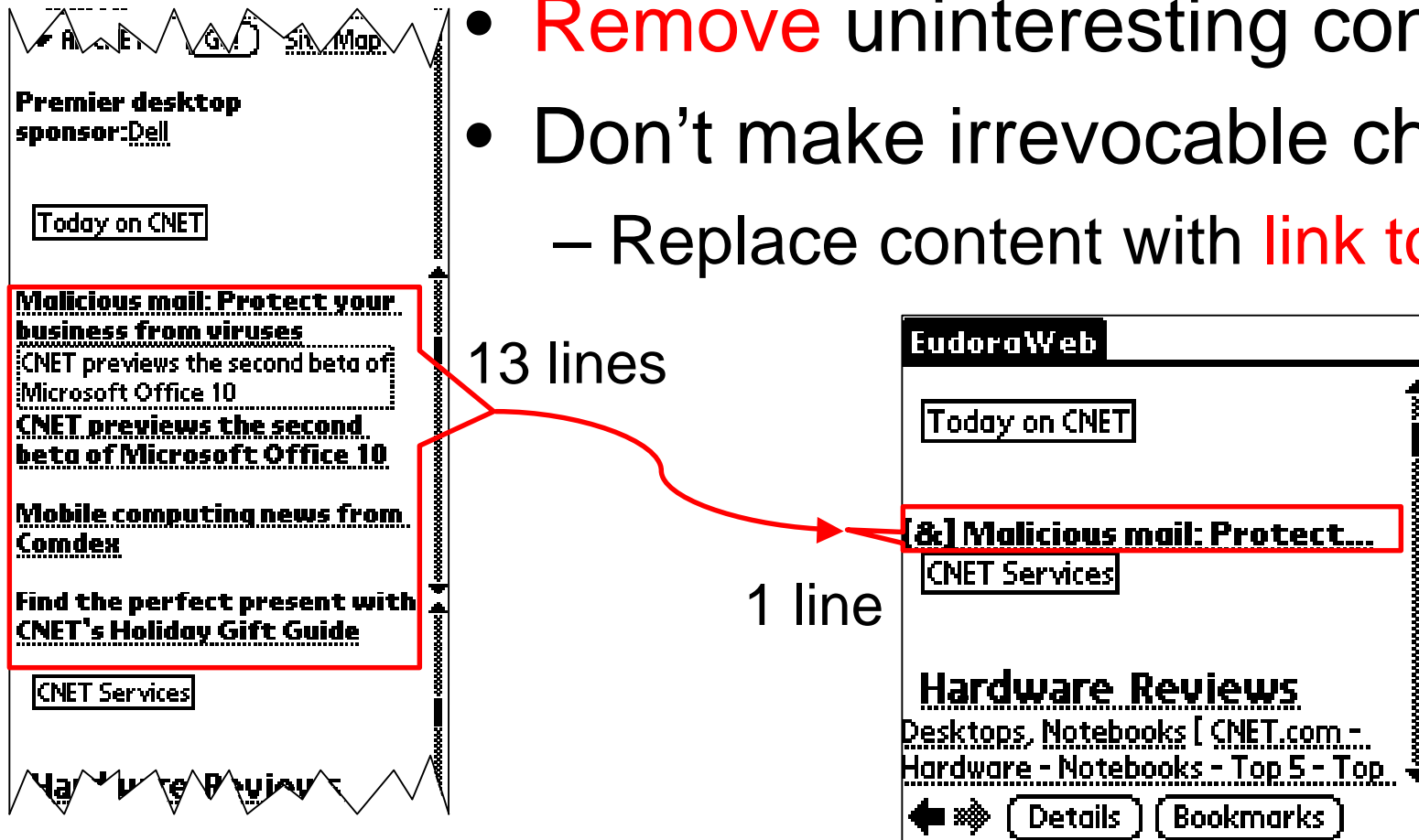
# add-shortcut

- A link that makes a **long path shorter**
  - A → B → C → D suggests adding A → D



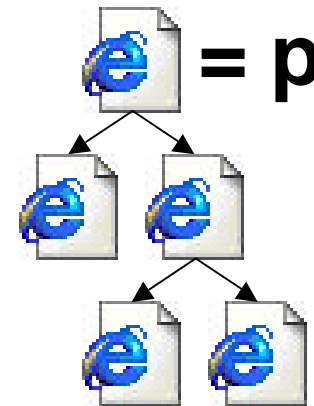
# elide-content

- **Remove** uninteresting content
- Don't make irrevocable changes!
  - Replace content with **link to original**



# Web site evaluation

- **Expected utility** based on model of visitor
  - Model learned by mining server access logs
- **Sum up value** of each screen of each page
- **Discount by difficulty** of reaching screen from **p**
  - Depends on how many **links** followed and how much **scrolling** required



# Evaluating a screen of content

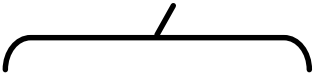
$$E[U(s_{ij})] =$$

$$\mathbf{w}_{sim} sim(s_{ij}) + \mathbf{w}_{freq} freq(s_{ij}) +$$

$$P(scroll) (E[U(s_{i,j+1})] - \mathbf{g}(scroll)) +$$


$$\sum_{\substack{\text{links} \\ L_k}} [P(L_k) (E[U(L_k.dest)] - \mathbf{g}(L_k))]$$

Expected  
utility of  $s_{ij}$



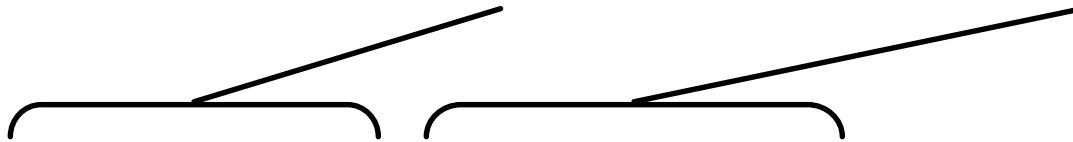
Intrinsic  
utility

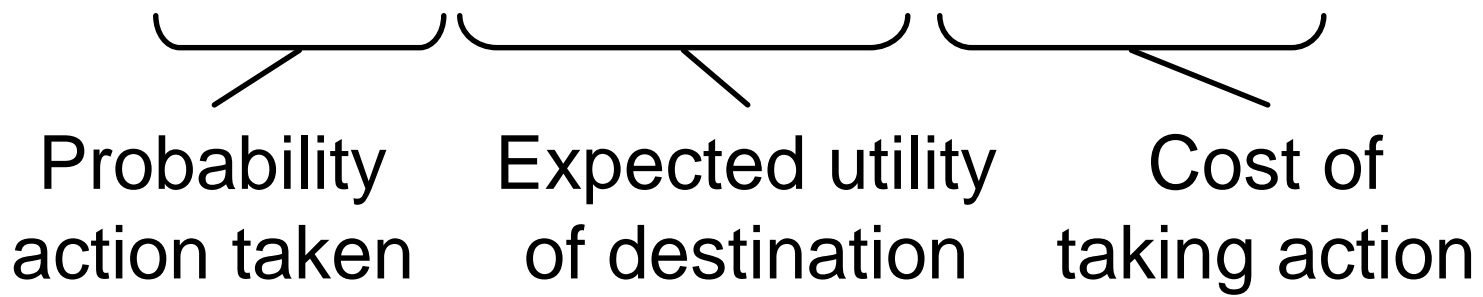
Extrinsic  
utility



Similarity to  
past content

Frequency of  
past visits







# Review of Proteus

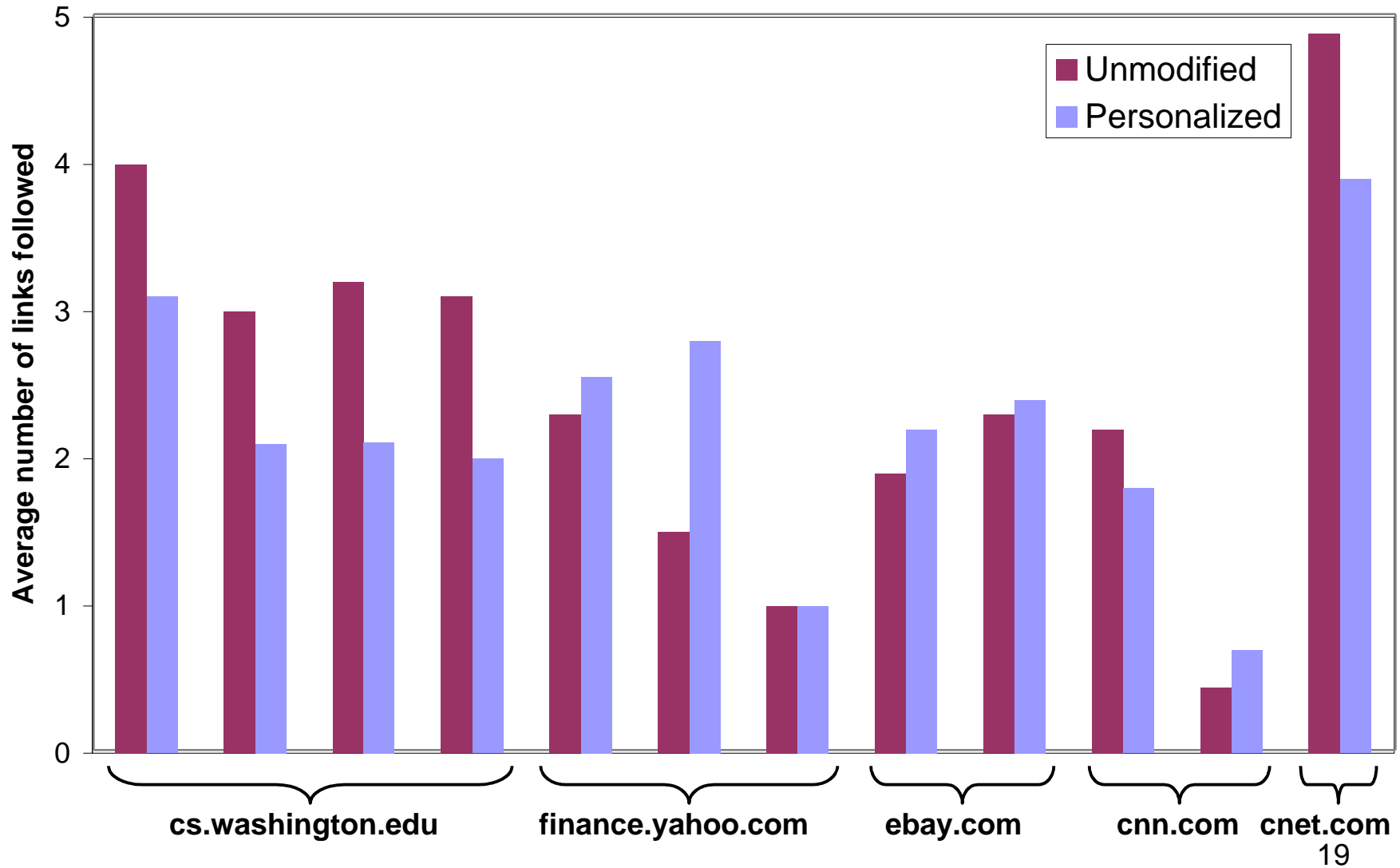
---

- Hill-climbing search
- Search operators
  - add-shortcut
  - elide-content
- Evaluation with expected utility

# Empirical study of Proteus

- **Observe** real users on the desktop
  - Info-seeking goals drawn from random distribution
- **Personalize** based on observations
- **Measure** performance on mobile device
  - Number of links and scrolls, amount of time
  - Compare unmodified and personalized sites
    - Half users did unmodified first, others vice versa

# Average number links followed



# Analysis of Proteus

- Why Proteus worked well
  - Suggested useful shortcuts
  - Elided only unnecessary content
- Why Proteus worked poorly
  - **Users** did not find shortcut, although it existed
  - Proteus incorrectly elided useful content
  - *Not flaws with Proteus approach – simply weaknesses of implementation*

# Related work

---

- Adapting content for small screens
  - Digestor [Bickmore & Schilit]
  - Pythia [Fox & Brewer]
- Adapting site by mining usage logs
  - PageGather and IndexFinder [Perkowitz & Etzioni]
  - Content recommendation [Mobasher, et. al]

# Conclusions

---

- Mobile web must be **personalized**
- **Web site personalizers** are effective at meeting visitor's needs
- Empirical evidence indicates Proteus **saves visitors time and effort** in mobile web browsing

# Future work

---

- Improve shortcut links
  - Concise, descriptive anchor text
  - Faster shortcut finding algorithm (IJCAI '01)
- Incorporate declarative model of site
  - Separate personalization of presentation, content, and navigation
  - Make use of site's "original" data, not obfuscated HTML representation