Shall I trust a recommendation?

(Towards evaluating trust in recommender sites)



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Wolf Huijsen

Mark Melenhorst

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The Greatest Show on Earth: The Evidence for Evolution

by Richard Dawkins (Sep 3, 2009) Average Customer Review: In stock

RRP: £20.00 Price: £9.99

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3.

1.

Irrationality

by Stuart Sutherland (Jan 10, 2007) Average Customer Review: *** (30) In stock

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Bad Science

by Ben Goldacre (April 2, 2009) Average Customer Review: *** (173)

RRP: £8.99 Price: £3.60

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26 used & new from £3.45

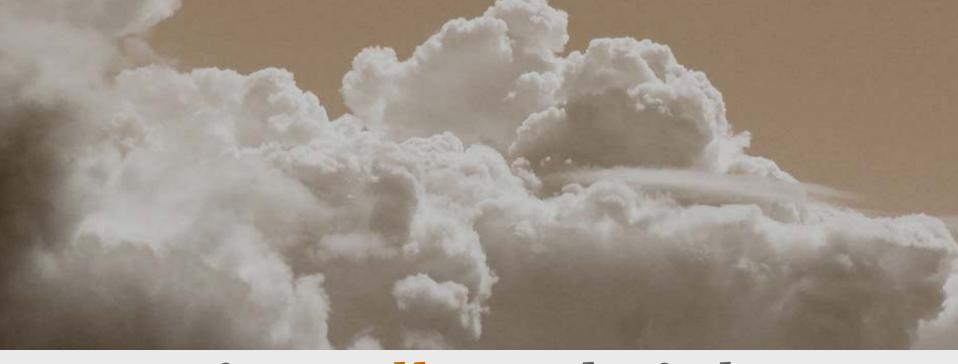


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Happy End



Is it really so bright?



Information CAN BE overwelming

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Information CAN BE misleading



So what? We need Trust

HCI studies proved that people can have

(trust) relationships with ICT

"Individuals can be induced to behave as if computers warranted human treatment, although users know that machines do not actually warrant this treatment'

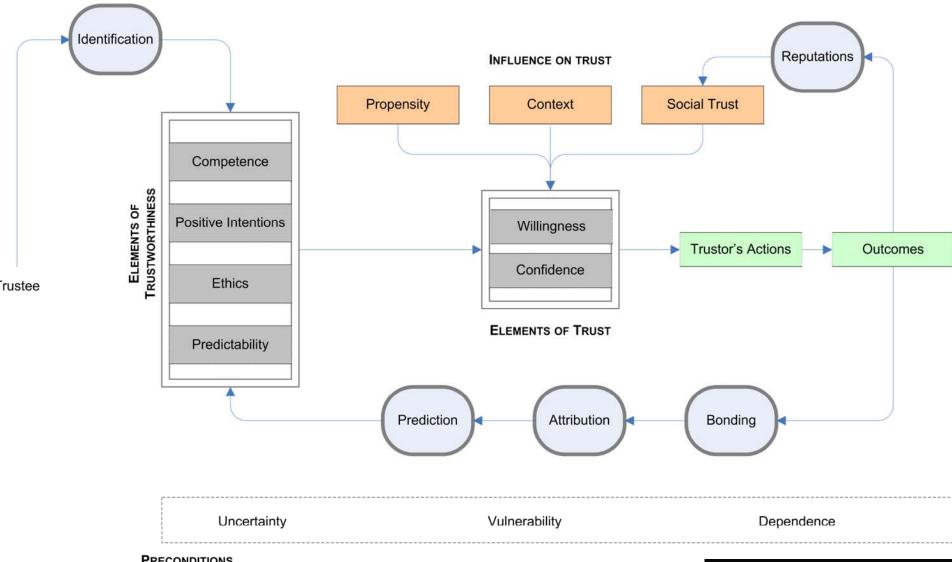
[Nass et al, 'Can computer be team-mates?', 1996]



[Muir, 'Trust in automation?', 1997]

Quality Trust Usage

Trust model for digital information



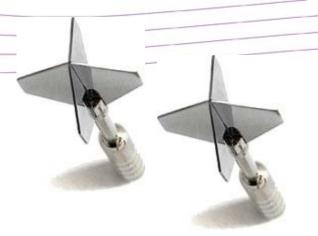
PRECONDITIONS

Kelton et al, 2008

Which is our target?

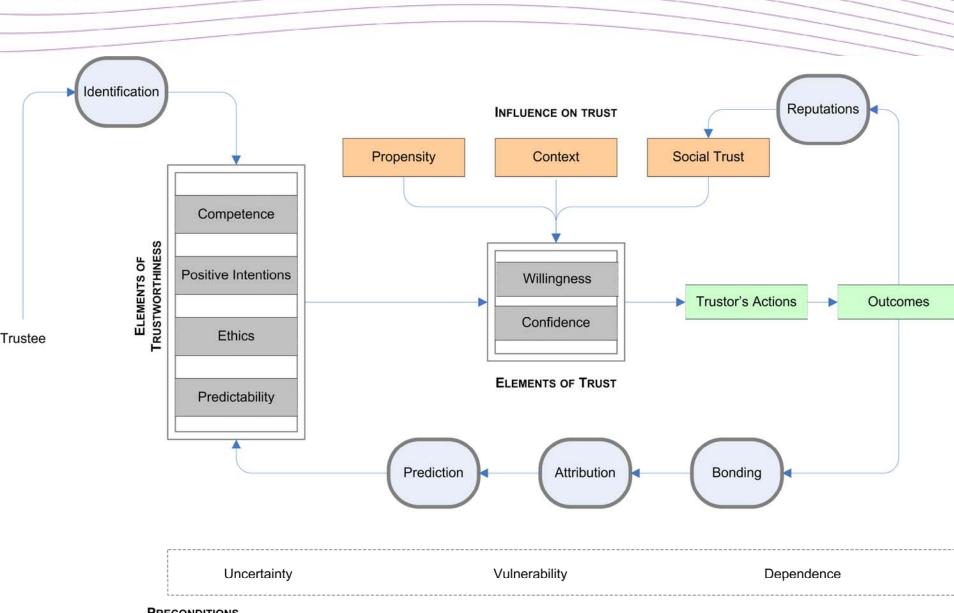


Understanding aspects that influence the users' perception of trust

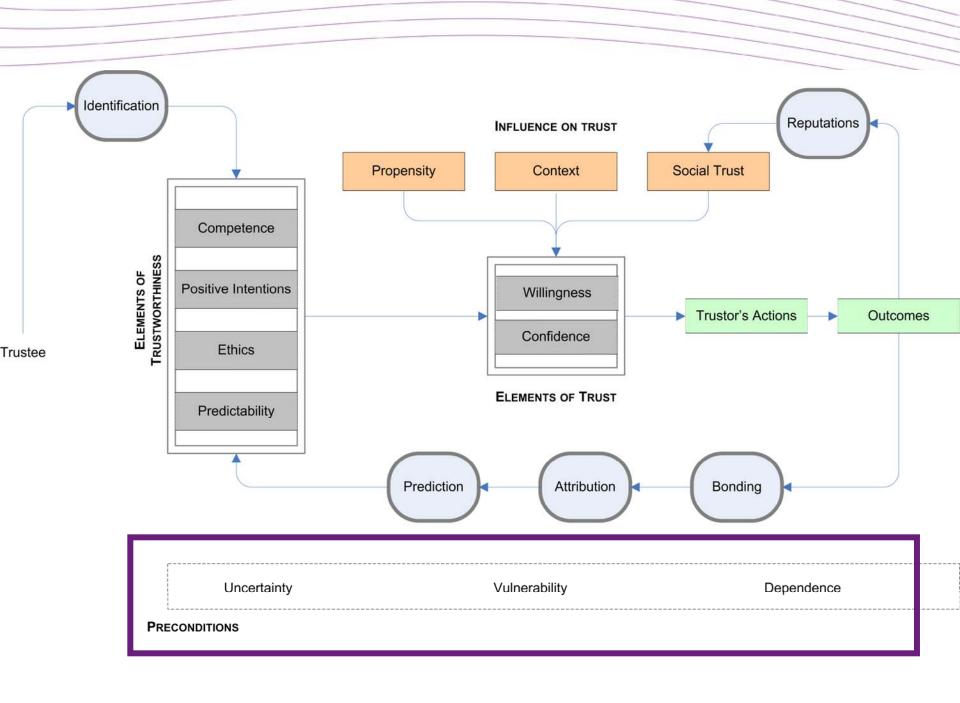


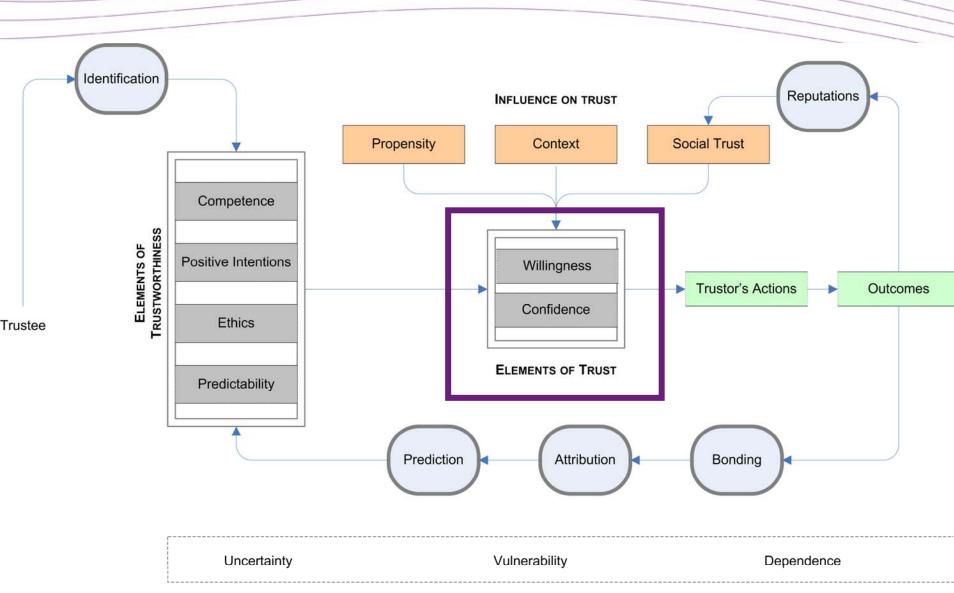
Defining a criterion for the evaluation of sites' perceived trust

Questions, so far?

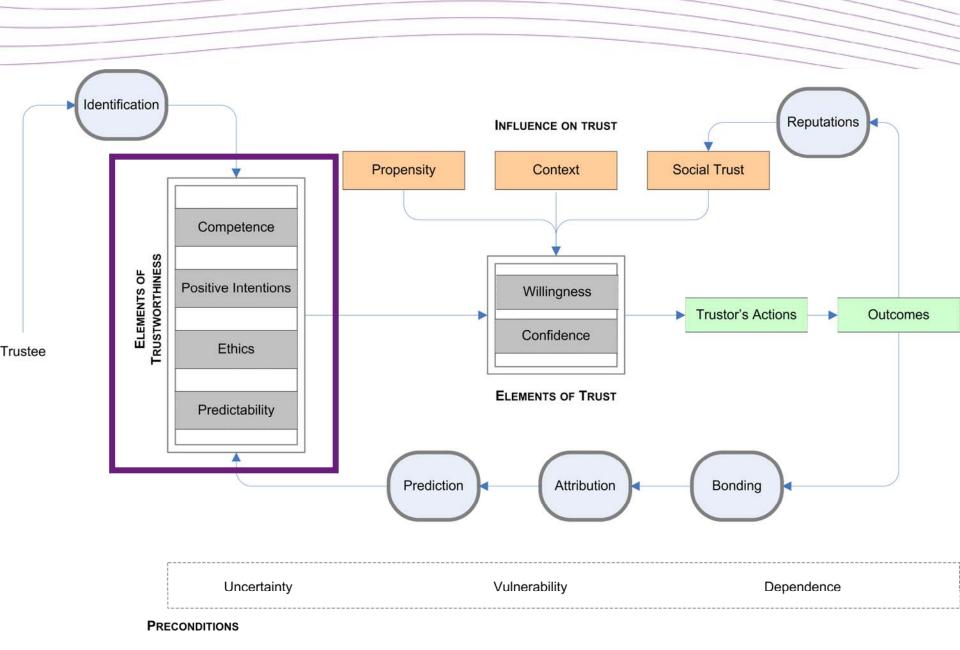


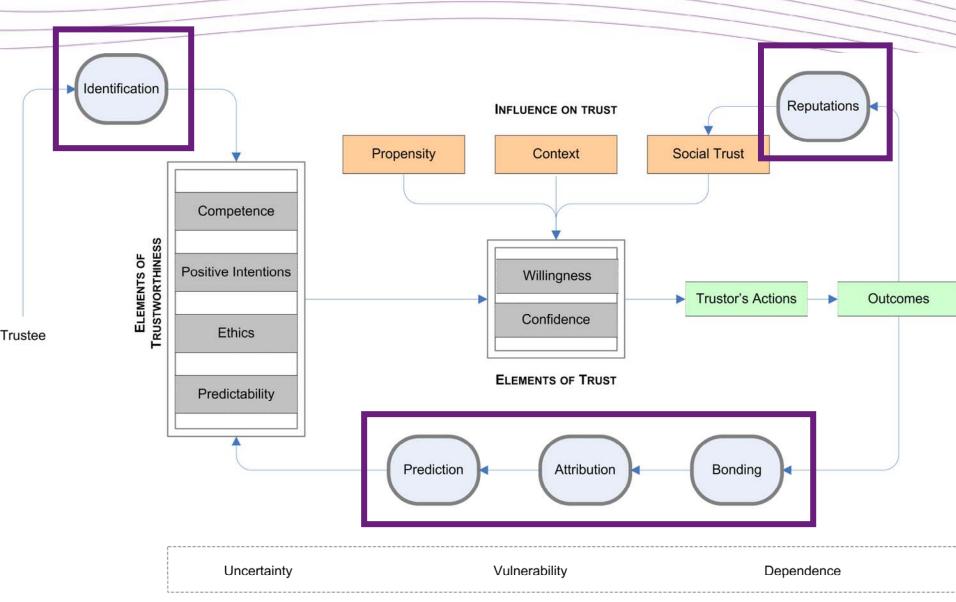
PRECONDITIONS



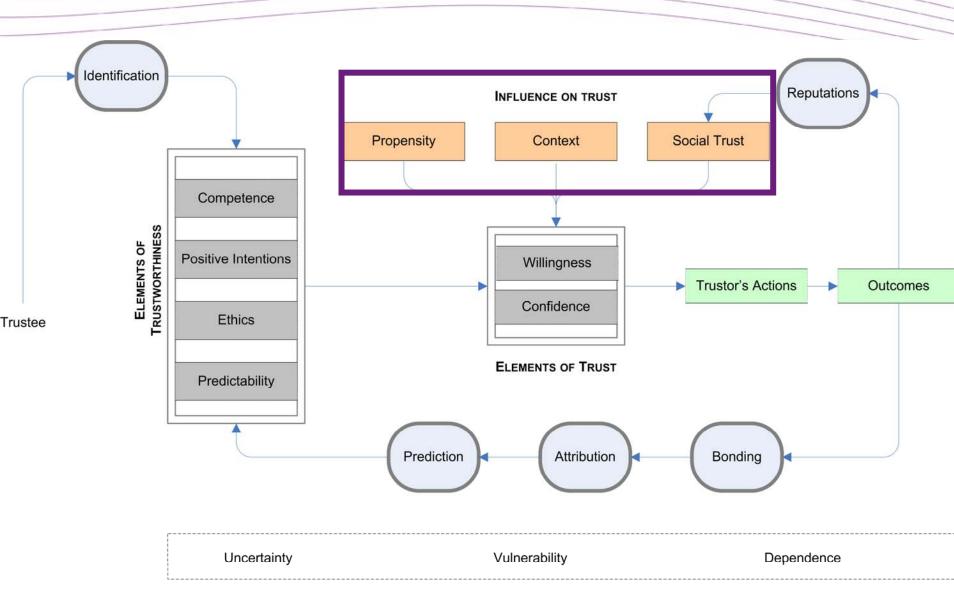


PRECONDITIONS





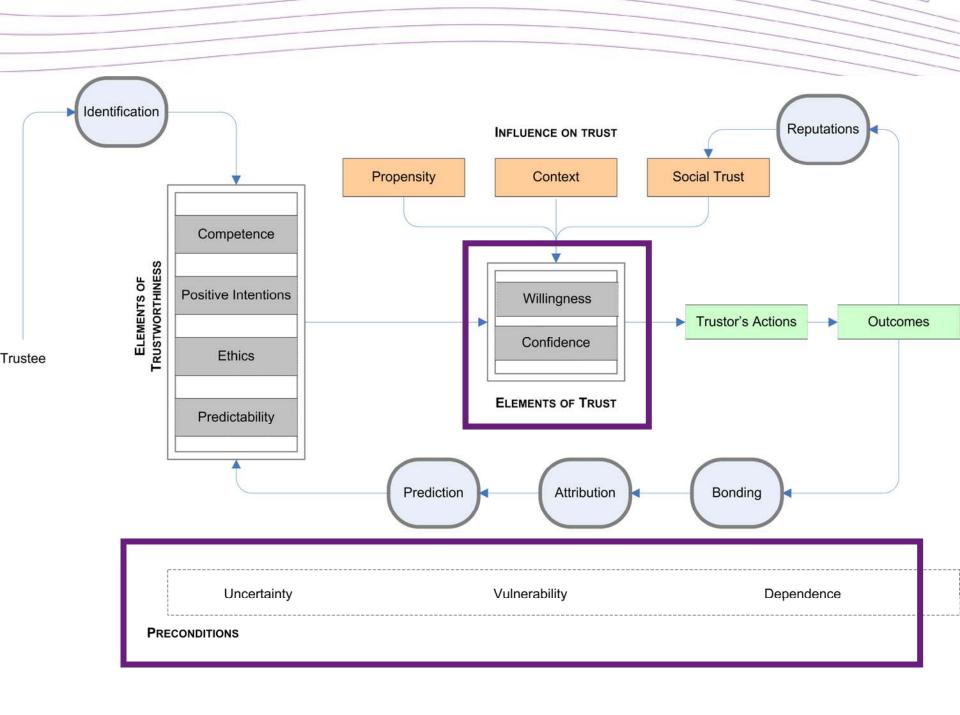
PRECONDITIONS



PRECONDITIONS

Does Kelton's model fit recommender sites?





Our approach in evaluating trust in recommendations

- 1. User Interface
- 2. Linguistic content
- 3. Quality of recommendation/reviews

User Interface

Guidelines to a trust-inspiring user interface [Shneidermann, 2004]

- Patterns of past performance
- Reference of past / current users
- Show certification from third parties
- Easy to locate and read policies

What might affect recommendations' perception of trust? [Tseng and Fogg, 2004]

- First-hand experience
- Reputation of the reviewer
- Surface attribute (language)
- Stereotypes



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Apple iPod nano chromatic Black (8 GB) MP3 Player

Overall Rating: *****

10 consumer reviews

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Linguïstisch Analysis

Analysis of Content? (Trust Indicators)

- Contact Information
- Grammar and Spelling
- Duplication
- Publication date
- Source of Reputation
- Subjectivity

Product Rating: ★★★★★

IMAC 2.4 Ghz 320 GR Lard Dirve

by ttble, Jan 19'08

Pros: Great looking, fast, great screen. Takes up little desk space, easy to set up

Cons: Needs more memory, keyboard is a little small.

Price Range: \$1080 - \$1080

COMPARE PRICES

I love it. It really hums compared to my older IMAC. The only thing I would add is extra memory and maybe a wireless keyboard. I find that the keyboard is a little small. I added the extra 1g after about a month of use and it helped things out when using ...

Read the full review

Product Rating: ★★★★

Perfect Design, Great Performance

by cml67, Jan 08 '08

Pros: Perfect design, great performance and reliability, very user-friendly

Cons: none

Price Range: \$1080 - \$1080

COMPARE PRICES

After working with a PC computer for 7 years, I finally decided to switch back to Mac, and it was one of the best decisions I've made in a long time. First of all, the design is a dream. With my old PC, half of my desk was cluttered with cables, and ...

Read the full review

Automatic Analysis of Content?

- Contact Information
- Grammar and Spelling
- Duplication
- Publication date
- Source of Reputation
- Subjectivity

[Martin M.,

'Reliability and Verification of Natural Text on the WWW', 2005]

Automatic Analysis of Content?

- Contact Information
- Grammar and Spelling
- Duplication
- Publication date
- Source of Recommendations
- Subjectivity

[Virgin Griffith, 'WikiScanner', 2007]

"WikiScanner, makes it possible to figure out which organization made which edits to a Wikipedia entry by cross-referencing IP addresses with a database of IP address owners" [NY times, 2008]

Automatic Analysis of Content?

- Contact Information
- Grammar and Spelling
- Duplication
- Publication date
- Source of Recommendations
- Subjectivity

[Vox Populi.nl, 2007]



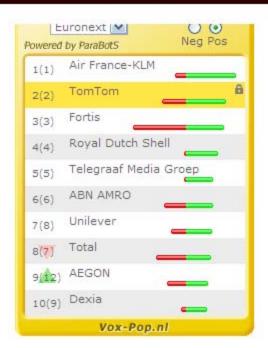
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Quality of Recommendations

Quality of Recommendations (Trust Indicators)

- Better understanding of users
- Robustness
- Multi-criteria ratings
- Recognition of Roles
- Rewards mechanisms
- Personalization
- Web-of-Trust

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Traveler Reviews

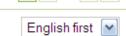
Excellent Very good Average Poor Terrible

100% Recommend

By trip type

▶ All (47) Business (1) Couples (15) Family (7) Friends getaway (3) Solo travel (5)

1-10 of 47



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"HIghly recommendend"

Aug 11, 2009 - nzsuze

"It was comforting to know that at the end of a long day, we had a place to go to that was almost like home."

Jul 18, 2009 - calebsmomMontreal

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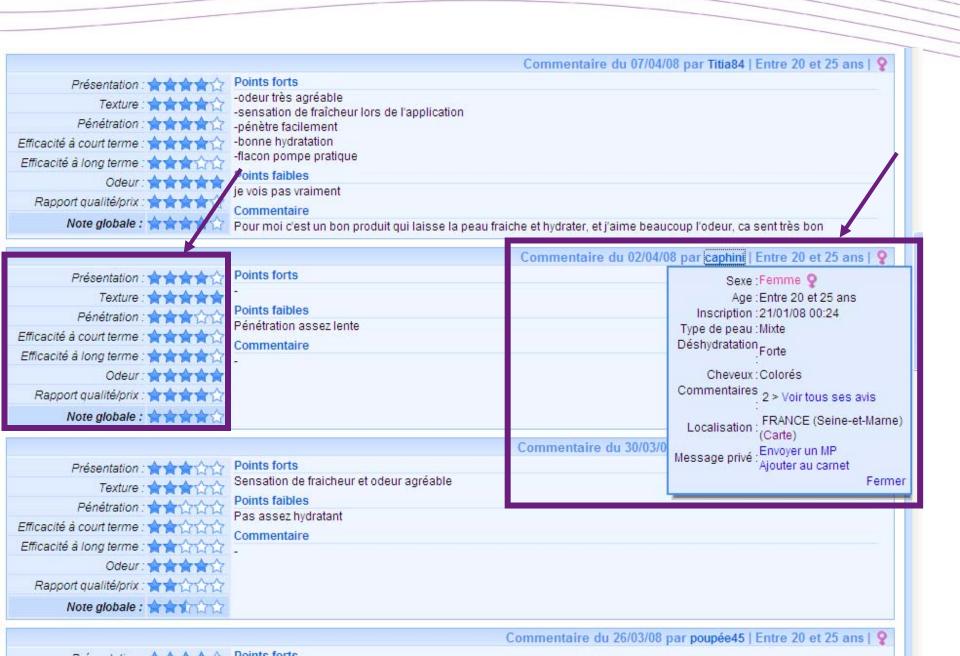
Hotel Liene

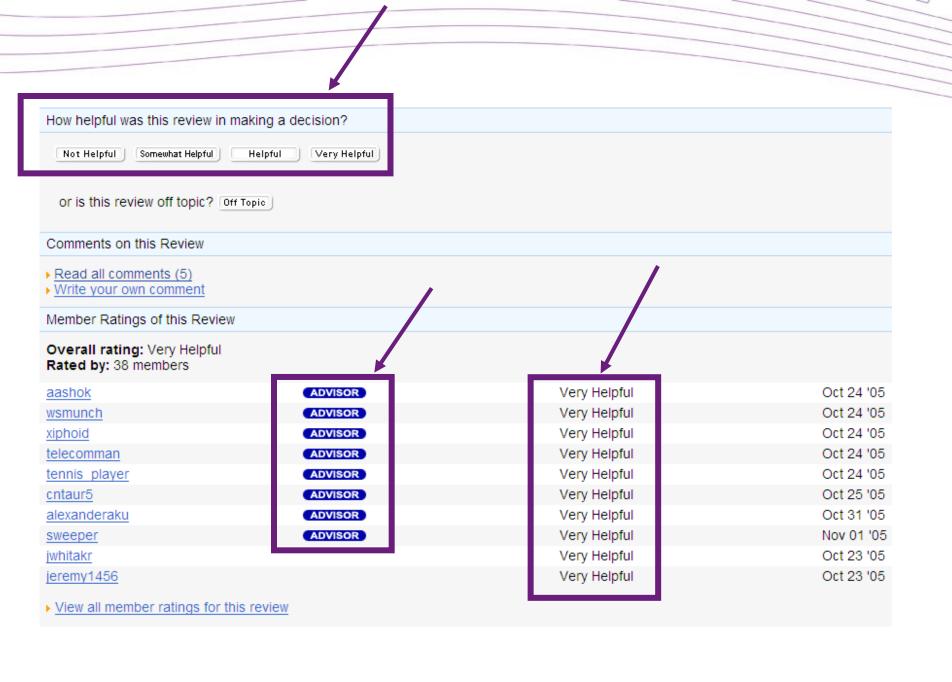
●●●●●●● 88% recommend

€35^{*}

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ensive digital camera that provides great photos then this is for you.

ind the bay. My in law had just bought their very first digital camera (this Canon s to their computer. Basically I had the whole weekend with this camera and taught lus tax.

n camera died and they like the digital idea better. They also liked the idea that they re these pictures quickly and easily was also another reason.

al viewfinder. The image that you see on the LCD will be what gets captured and le picture that will get captured (it only shows about 80 to 85 percent or the image). I ry life. The LCD on this camera has 120,000 pixels resolution which is bright and clear

About the Author



Epinions.com ID:

vchand

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Web of Trust



Conclusion: preliminary check list

User Interface	Content Analysis	Recommendations
Certification from trusted parties; Management info; Past reviews patterns; References from past and current users; Offer/Compare reviews; Source of reviews easy to check; Reputation of the reviews managed.	Contact info; Grammar/Spelling; Duplication; Publication date; Source reputation; Subjectivity.	Robustness; Multi-criteria reviews; Recognition and roles; Rewards mechanisms; Personalization; Web-of-Trust.

Future work

- Validation is required
- How to quantify?
- How to visualize the results?

- What is the effect on the purchasing
- How to incorporate indicator in current web sites?

