### WikiRep: Digital Reputations in Virtual Communities

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### **Outline**

- Motivation, context, and assumptions
  - Virtual communities and digital reputations
  - Virtual environment case study: Wiki
- WikiRep key ideas
  - Structure of a wiki-page: tree model
  - Comparing page versions: adoption coefficients
  - Rating inheritance
  - Feedback allocation
- WikiRep implementation details
  - Calculating adoption coefficients
  - Representing digital reputations

### Virtual Communities and Environments

### Definition from Wikipedia

A virtual community is a group whose participants are engaged in a dialog by means of information technologies, typically the Internet, to share information and values.

(also online community and mediated community)

#### Non-Collaborative

- forum/message-board
- electronic mailing list
- peer review system
- chat
- online games

#### Collaborative

- wiki
- CVS
- co-authoring
- online games

## Digital reputations

### Definition from Wikipedia

Reputation is the general opinion (social evaluation) of the public toward a person, a group of people, or an organization. (we also use interchangeably with rating or opinion toward an object)

Digital reputation is a reputation handled by virtual environment, measured and expressed as number(s)

reputation is measured by analyzing feedbacks

Advantages of using digital reputations:

- automate maintenance, require less human effort
- better scalability
- affordable for a wider range of situations
- provide motivation for active participation

(slashdot.org, epinions.com, ebay.com, amazon.com)

# Digital reputations: what is missing

#### Available systems assume:

- each object has a single responsible 'owner'
- objects are independent from each other
- objects are static, complete

#### This does not hold for a collaborative environment!

- each object contains contributions of many users
- versions are closely related objects
- dynamic nature of content:
  often modifications → evaluations become irrelevant

#### We suggest:

- allocate feedback among (co-)authors (author allocation factors)
- keep track of evaluations for individual versions:
  - allocate feedback among versions (content allocation factors)
  - reuse previous evaluations (rating inheritance)

## Reputations: how to digitize

- Single scalar value is not enough!
  - not only 'good' vs. 'bad',
  - but also 'unknown' vs. 'time-proved'
- Pair of numbers may be ok
  - we use pair (value; quality)
  - value = the evaluation of object's merit ('good-bad' scale)
  - quality = significance of the evaluation

### quality

- weight, normalized to the [0, 1] interval
- 0 means a completely unreliable evaluation (never considered)
- 1 means a fully reliable evaluation (e.g. the source is trusted)
- Other approaches exist with 2 or more numbers

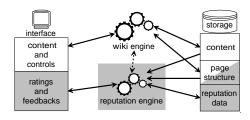
## Case study virtual environment: Wiki

#### Wiki

web-site with pages created and maintained by visitors

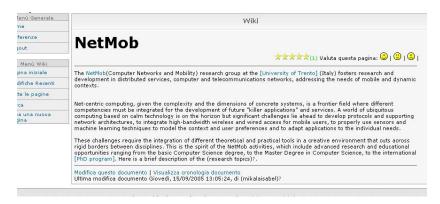
- Collaborative editing tool
  - each page has many version
  - each version has an author
  - the last version is shown by default
  - but any version is accessible
- Concept and first implementation by Ward Cuningham in 1995
- Many implementations and installations exist
  - most known and successful: Wikipedia
- None employs digital reputations for usability and content quality
  - why?

## WikiRep := Wiki + digital reputations



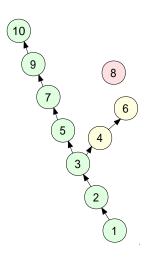
- Reputation mechanism is an add-on to the base Wiki system:
  - reputation data and additional information about pages structure
  - interface elements to visualize reputations and collect feedbacks
  - engine to manage reputations and interact with the base system
- Stored reputation data:
  - 'local' member-about-member opinions
  - 'global' object reputations (page ratings)
- Not stored:
  - global user reputations are derived from local opinions
  - each user can evaluate each page version only once

### WikiRep Look-and-Feel



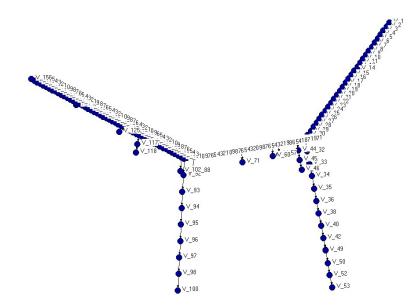
- based on eGroupWare
- modifications made do not lower the ease of use of Wiki
  - we aim at simplicity and high usability
- only two elements are added to the page visualization interface
  - a symbolic representation of page rating
  - buttons to leave feedback

### Wiki page structure: tree model



- Versions of the same document have similar content
  - we need a model for the structure
- Tree model reasonably simple and captures a typical Wiki well
  - linear model is too simple
  - grid model is too complex
- Each version j has at most one parent(j)
- A completely original version has no parent

## Tree example: Wikipedia article Virtual Community



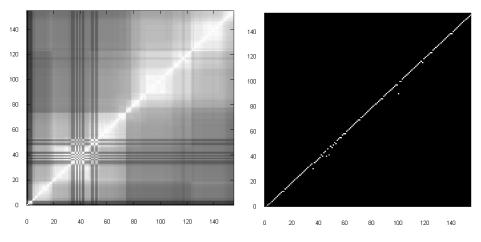
# Adoption Coefficients: measure of versions' similarity

### Adoption coefficient $a_{i,j}$

characterizes numerically similarity between version *i* (older) and version *j* (newer)

- measures how much content of version i is preserved in version j
- on the [0, 1] scale:
  - 0 for independent versions
  - 1 when j is a copy of i
- any automated algorithm to calculate is feasible
  - from naive text comparison
  - up to semantic-aware tools
  - depending on particular environment
- simplified notation for the tree page model:  $a_j := a_{parent(j),j}$

# AC example: Wikipedia article Virtual Community



full AC matrix

only parents (stored data)

### Rating inheritance

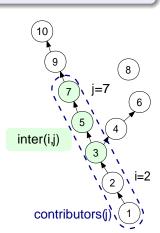
#### mechanism to reuse existing evaluations for parent version

- New version of a page partially inherits rating of its ancestor
  - proportionally to similarity (adoption coefficient to parent a<sub>i</sub>)
  - ► let parent's rating be (R<sub>parent(j)</sub>; quality<sub>parent(j)</sub>)
  - ▶ then new page is initiated with  $(R_{parent(j)}; a_j \cdot quality_{parent(j)})$
- The value of the rating stays the same
- But its reliability (quality) decreases:
  - only fraction a<sub>i</sub> of the content is inherited, and so is rating weight
  - the other part,  $(1 a_j)$ , is new, not evaluated, has zero reliability

#### Feedback allocation

#### mechanism to distribute credit between versions and authors

- Reader leaves a feedback: mark M
  - during reading version j
  - clicks one of the buttons <a> \bigcup\$</a> <a> \bigcup\$</a>
- affects previous versions and authors
  - all involved page versions and authors get 'fractions' of the feedback
  - contributors(j) = versions (re-)used in j
  - the addition is a weighted summation
  - weight w<sub>i,i</sub> is content allocation factor
  - weight u<sub>i,i</sub> is author allocation factor
- Each i from contributors(j) gets:
  - (M; w<sub>i</sub>) for its content
  - ► (M; u<sub>i,i</sub>) for its author



# Content allocation factor $w_{i,j}$

$$w_{i,j} = \begin{cases} 0 & \text{if } i \notin contributors(j) \\ 1 & \text{if } i = j \\ \prod_{k \in inter(i,j)} a_k & \text{if } i \in contributors(j) \text{ and } i \neq j \end{cases}$$

- inter(i, j) = set of j's ancestors between j and i
  - excluding i and including j
- characterizes merit of the page version as a whole
  - not just the added value beyond its ancestors
- for itself  $w_{i,j} = 1$ 
  - the version that attracted the feedback gets the 'full' weight
  - because it is what the reader expects
- each parent in the chain gets a<sub>i</sub>-less evaluation
  - because *a<sub>i</sub>* fraction of the parent's content is reused

# Author allocation factor $u_{i,j}$

$$u_{i,j} = \begin{cases} 0 & \text{if } i \notin contributors(j) \\ 1 - a_j & \text{if } i = j \\ (1 - a_i) \prod_{k \in inter(i,j)} a_k & \text{if } i \in contributors(j) \text{ and } i \neq j \end{cases}$$

Measures the original contribution of version j compared to i

#### **Theorem**

Sum of  $u_{i,j}$  between a given version and all other versions is 1

$$\sum_{i} u_{i,j} = 1, for any j$$

user can never gain reputation by creating superfluous versions

## WikiRep: calculating adoption coefficients

- Whenever a new version of a Wiki page is saved
  - calculate adoption coefficients to all previous versions
  - the largest (latest if a tie) determines the parent
- Each version has:
  - text
  - author
  - modification time
- Adoption coefficients are calculated by comparing texts:
  - the two texts are divided into blocks, separators are . , : ; ! ?
  - ▶ a form of *edit distance* is found, using the blocks as characters
  - ▶ minimal number of insert and delete operations on characters, needed to transform one text into the other: (N<sub>inserted</sub> + N<sub>deleted</sub>)
  - normalize to the [0,1] range
  - subtract from 1 to obtain similarity

$$a_{old,new} = 1 - \frac{N_{inserted} + N_{deleted}}{N_{total,new} + N_{deleted}}$$

### WikiRep: reputation representation

- based on the ROCQ (Reputations, Opinion, Credibility and Quality) scheme, opinion or reputation is a pair (value; quality)
- value is a real number in the [0,1] range
- quality characterizes significance of the evaluation
- quality = probability that interval [value  $-\Delta_r/2$ ; value  $+\Delta_r/2$ ] holds the actual mean of the underlying mark distribution
  - ▶ assume that marks are independent → mean has normal distribution (the central limit theorem)
  - $ightharpoonup \Delta_r$  is a parameter to be chosen

quality = 
$$1 - I_{(N-1)/(N-1+t^2)} \left( \frac{N-1}{2}, \frac{1}{2} \right)$$

where  $I_x(a, b)$  is incomplete beta function, and

$$t^{2} = \left(\frac{\Delta_{r}}{2}\right)^{2} \frac{N^{2}(N-1)}{N \cdot S_{q} - (S)^{2}}$$

 $S_a$  is the weighted sum of squares of collected evaluations marks

#### Conclusions

- Extends reputation algorithms for user-managed virtual communities with multi-authored, multi-versioned objects.
- The algorithm relies on
  - maintaining reputations of individual page versions
  - proper allocating of feedback credit
  - established page reputations are reused
- Implemented using Wiki as the base system
  - the system is currently being deployed