

## More into Reputation Systems

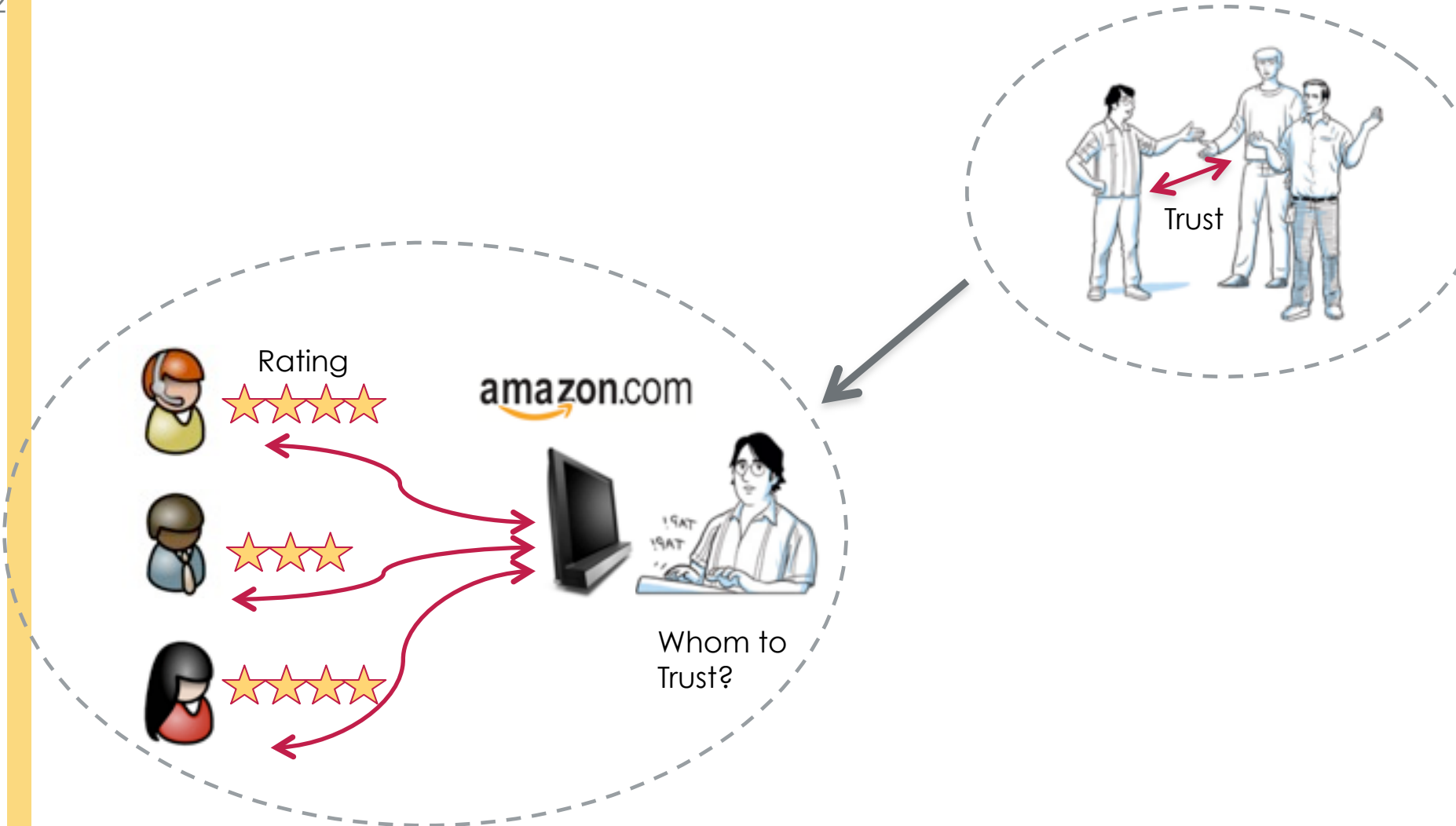
**Dr. Rehab Alnemr**

Prof. Dr. Christoph Meinel

Chair of Internet Technologies  
Hasso Plattner Institute  
Potsdam, Germany

# Trust and Reputation

2





# Where do we see it?

3



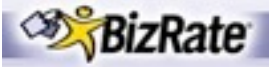
E-Markets



Social/  
Entertainment



Opinions & Activities



## Online Reputation Systems

News



Business/Jobs network



# Other Reputation Systems

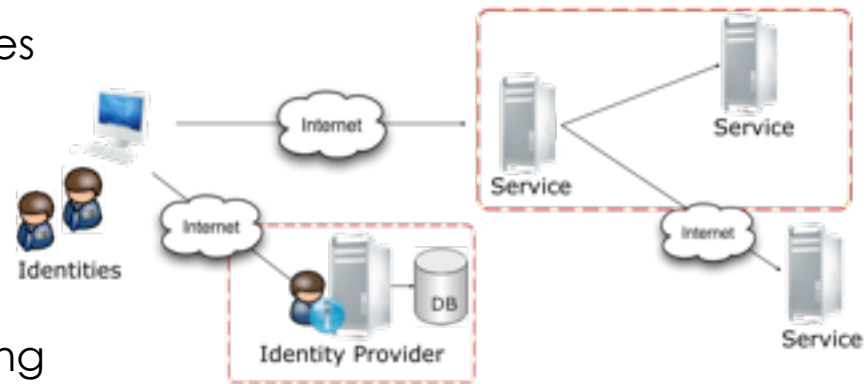
4

- **Peer-to-peer systems**

- Sharing movies, music, ....
- Rings any bell? Not judging here!

- **Web Services**

- Service consumer rates services
- Services rate services
- Monitoring and analysis
- Evaluating service providers
- And naturally Cloud Computing



- **Indirect**

- Graph Reputation Systems: Degree Rank



# Reputation Concepts

5

- **Reputation Model**

all of the reputation statements, events, and processes for a particular context

- **Reputation Context**

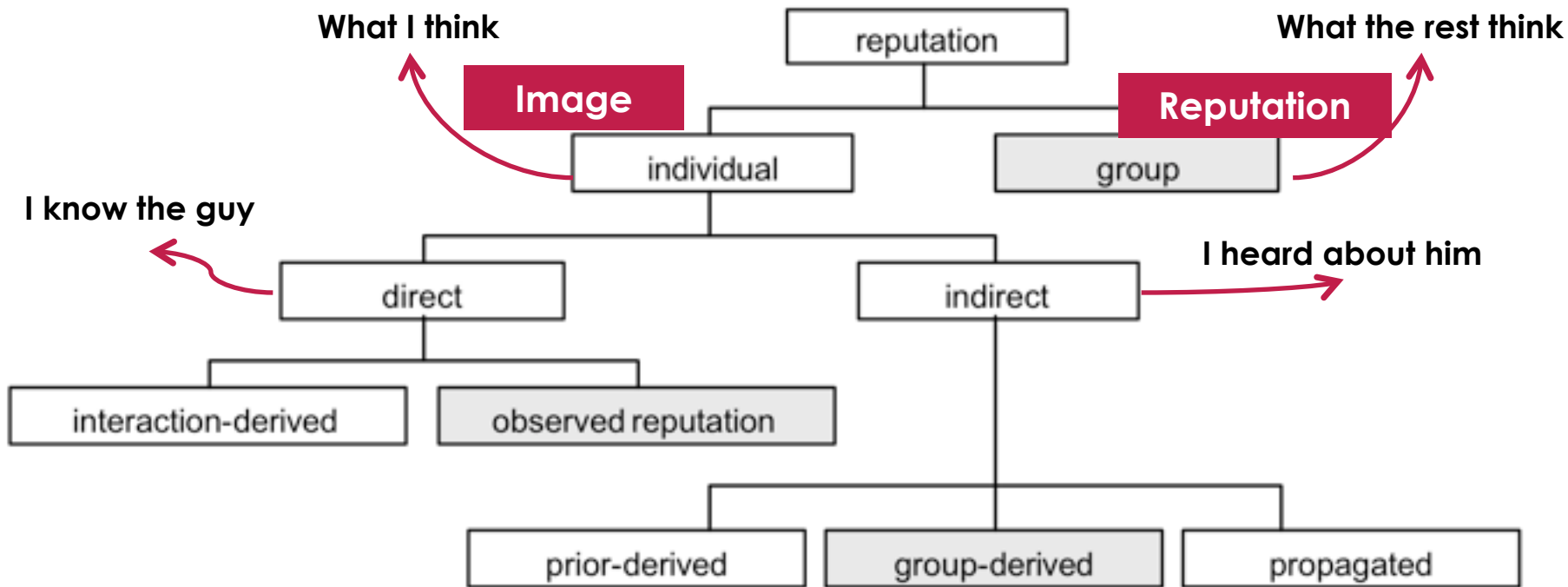
the relevant category for a specific reputation

- **Reputation Target**

users, movies, products, blog posts, videos, tags, companies, and IP addresses

# Reputation Topology

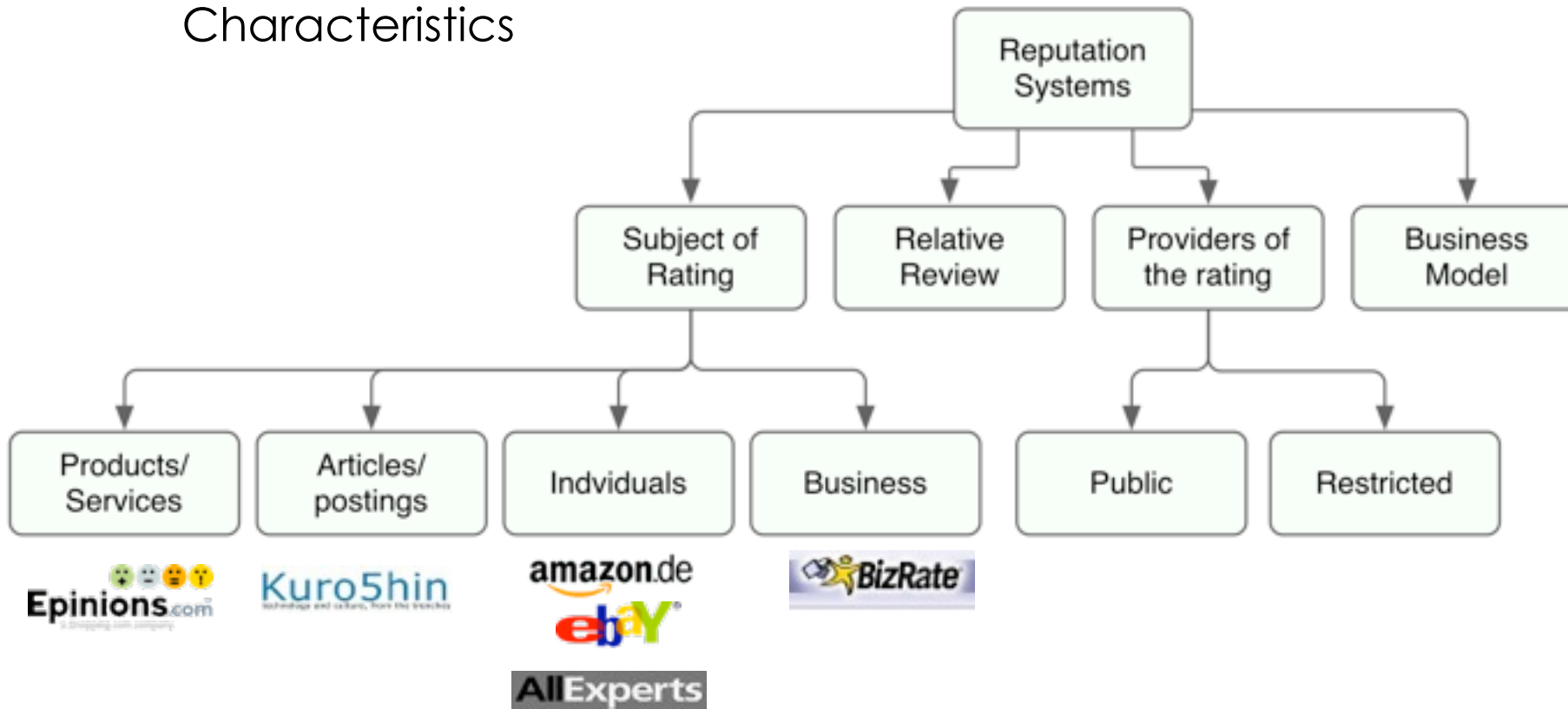
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# Reputation Systems Categorized

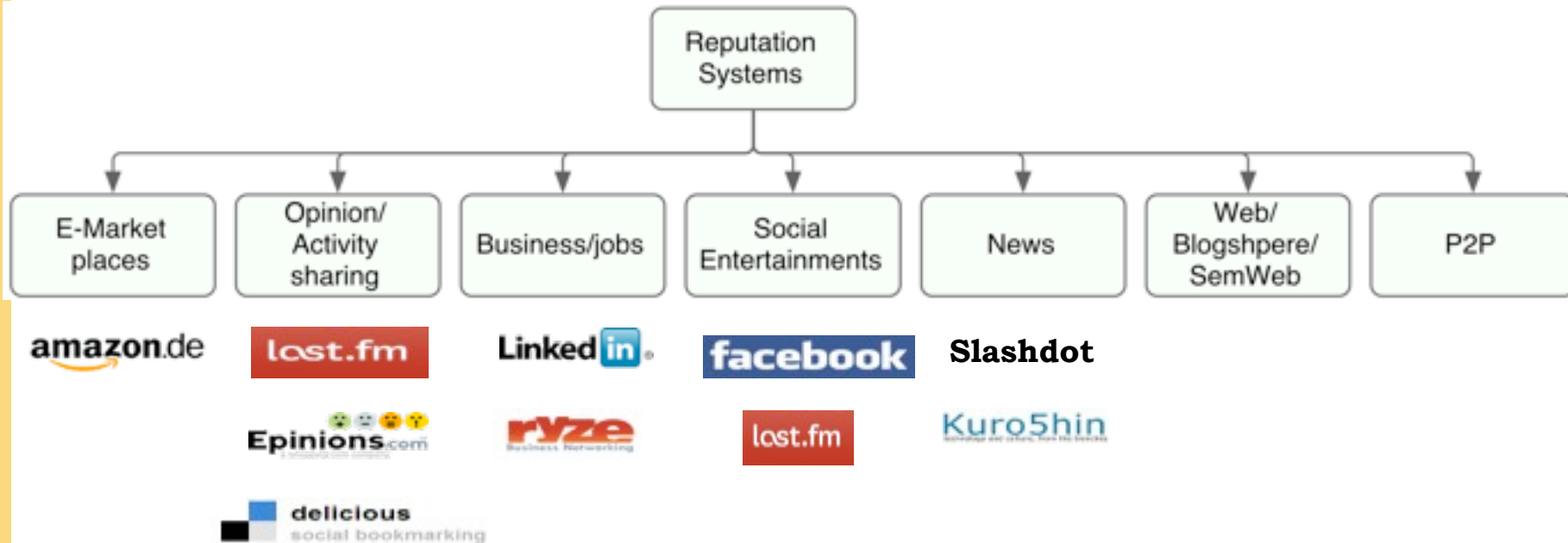
7

## Characteristics



# Reputation Systems Categorized

8

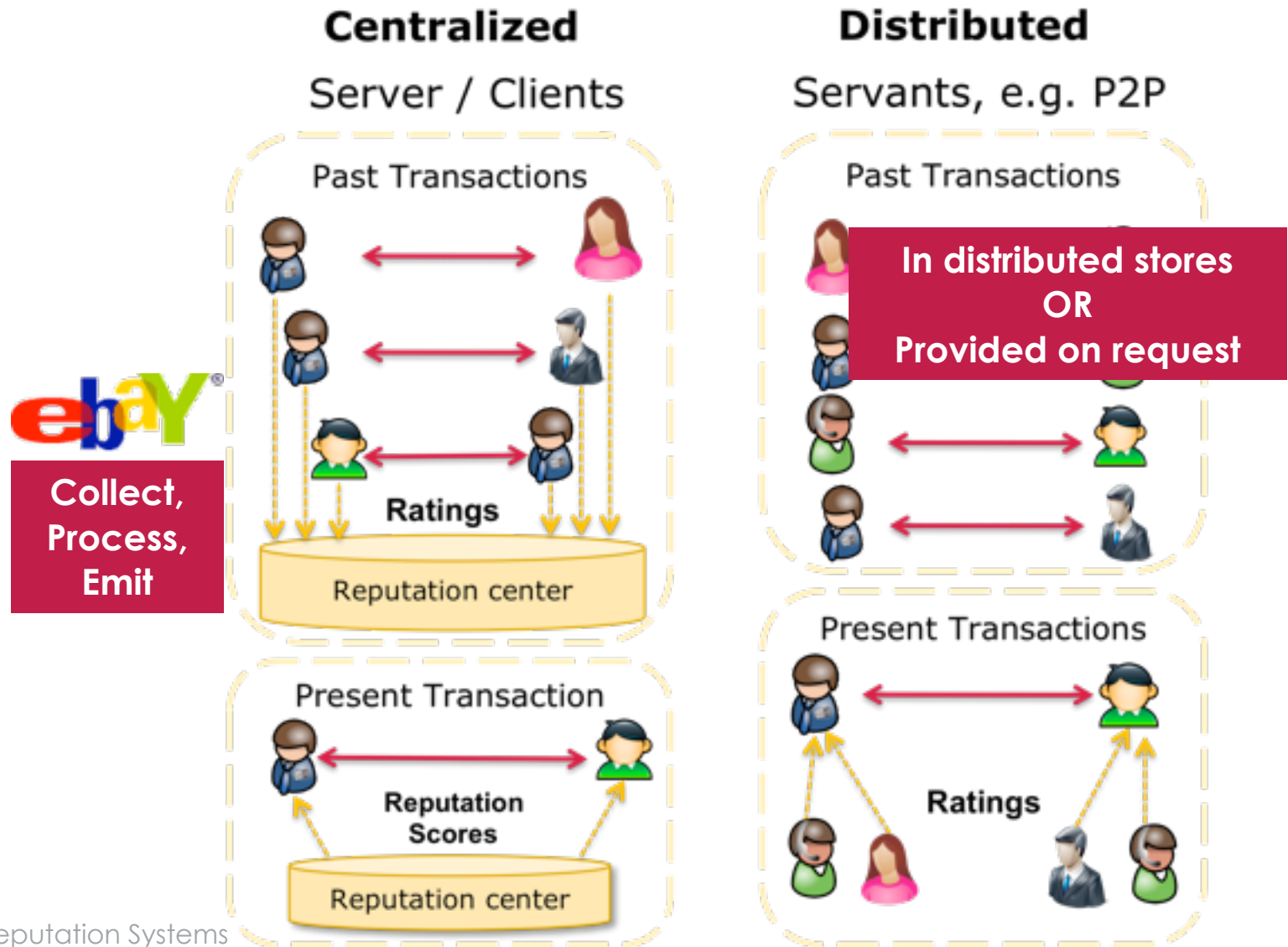


Features and properties



# Reputation Systems Architecture

9



# It is everywhere!

10

- E-Commerce
  - eBay
  - Amazon
  - Epinions
  
- Web 2.0
  - Qype
  - Slashdot
  
- Crowdsourcing
  - Yahoo! Answers
  
- Gaming
  - XBox

# Ratings Methods/Models

# It is not only rating...

12

- Ratings
- Favorites and Flags
  - Vote to Promote)
  - Favorites
  - Report Abuse
- This-or-That Voting
- Reviews
- Points
- Karma

# It is not only STAR rating: Different Kinds



















13

- Different Ratings  
*(explicit opinion about the quality of something: stars, bars, 10-p scale, meters,..)*

# It is not only STAR rating: Different Kinds

13











- Different Ratings  
*(explicit opinion about the quality of something: stars, bars, 10-p scale, meters,..)*

Series	Website audience / TV audience	Nielsen viewers (MM)
1 american idol	19.5% 	30.4 
2 deal or no deal	16.9% 	12.2 
3 dancing with the stars	9.8% 	19.6 
4 grey's anatomy	7.6% 	19.5 
5 lost	5.3% 	14.6 
6 heroes	5.3% 	14.3 
7 bachelor	5.0% 	9.4 
8 the office	4.4% 	8.3 
9 friday night lights	3.7% 	6.1 

# It is not only STAR rating: Different Kinds

13

- Different Ratings  
(explicit opinion about the quality of something: stars, bars, 10-p scale, meters,..)

Series	Season	Program	Network	Rating
1 americ	1950–1951	<i>Texaco Star Theater</i>	NBC	61.6
2 deal o	1951–1952	<i>Arthur Godfrey's Talent Scouts</i>	CBS	53.8
3 dancir	1952–1953	<i>I Love Lucy</i>		<b>67.3</b>
4 grey's	1953–1954			58.8
5 lost		5.3% 		14.6 
6 heroes		5.3% 	14.3 	
7 bachelor		5.0% 	9.4 	
8 the office		4.4% 	8.3 	
9 friday night lights		3.7% 	6.1 	

# It is not only rating: Favorites and Flags

14

- Favorites and Flags
  - Vote to Promote (*Promoting in general: Digg, Reddit, and Yahoo! Buzz*)
  - Favorites (*counting how many times a user bookmark a content item* )
  - Report Abuse



# It is not only rating: Favorites and Flags

14

- Favorites and Flags



**Matt Seaton** @mattseaton

1h

Time to take a historic stand against Big Energy's reckless despoliation of our planet, says @dhlovelife: [guardian.co.uk/commentisfree/...](http://guardian.co.uk/commentisfree/...)

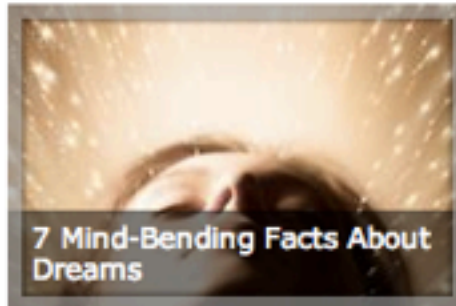
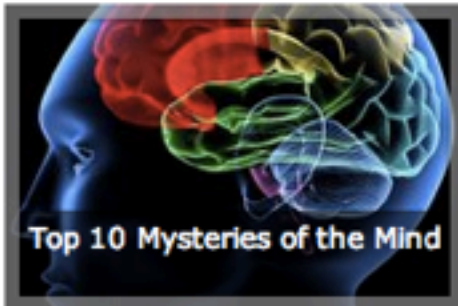
← Reply ↻ Retweet ★ Favorite

**13**  
RETWEETS

**3**  
FAVORITES



- Home
- Space
- Animals
- Health
- Environment
- Technology
- Culture
- History
- Strang



Article:

# Why Some People See Sound

Charles Choi, LiveScience Contributor

Date: 23 October 2012 Time: 07:01 PM ET

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g +1 20

in Share 7

# It is not only rating: This-or-That Voting

15

- This-or-That Voting  
*(vote on the usefulness, accuracy, or appeal of something)*

Bounded set of options (not like vote-to-promote)

# It is not only rating: This-or-That Voting

15

- This-or-That Voting  
(vote on the usefulness, accuracy, or appeal of something)

## THE BEST HOLIDAY SONG

ROUND 1

HAS ENDED

NAT KING COLE  
The CHRISTMAS SONG



The Christmas Song  70%

or

RUN  
DMC CHRISTMAS  
IN HOLLIS



Christmas in Hollis  30%



# It is not only rating: This-or-That Voting

- This-or-That Voting  
(vote on the usefulness, accuracy, or appeal of something)

## THE BEST HOLIDAY SONG

“Was this review helpful?”



The Christmas Song  70%

or



Christmas in Hollis  30%

# It is not only rating: Reviews and Points

16

- Reviews

## User Reviews

★★★★★★★★★ **The Wachowskis join forces with Tom Tykwer and overhaul the mea**  
8 September 2012 | by [torontodog](#) (Toronto) – [See all my reviews](#)

Kudos to all the filmmakers for adapting this famously "unfilmable" novel in such an invent switch after every scene, but instead of the plot, the narrative continuity follows the theme theme, it is no longer confusing when the story jumps from a runaway slave in the 1800s to some of the last humans remaining on earth.

All this audacious style and structure makes Cloud Atlas a curiosity to say the least, but the the all-star ensemble cast. This impressive collection of actors fires off amazing performan

- Points

*(hits, actions, and activities that users engage in)*



# It is not only rating: Reviews and Points

16

## Points Table

Action	Points
Begin participating on Yahoo! Answers	One Time: 100
Ask a question	-5
Choose a best answer for your question	3
No Best Answer was selected by voters on your question	Points Returned: 5
Answer a question	2
Self-deleting an answer	-2
Log in to Yahoo! Answers	Once daily: 1
Vote for an answer	1
Vote for No best answer	0
Have your answer selected as the best answer	10
Receive a "thumbs-up" rating on a best answer that you wrote (up to 50 thumbs-up are counted)	1 per "thumbs-up"
Receive a violation	-10

# It is not only rating: Karma

- Karma = Reputation for Users

*(usually create incentives for user behavior: amount and quality of participation)*  
*(usually combined with other rating models)*



# It is not only rating: Karma

- Karma = Reputation for Users

## Feedback earned for transactions on eBay

[View your eBay My World page](#)

**Positive Feedback: 99.9%**  
**Feedback score: 9423**  
[\[How is Feedback calculated?\]](#)

### Detailed Seller Ratings (last 12 months) ?

Criteria	Average rating	Number of ratings
Item as described	★★★★★	1254
Communication	★★★★★	1248
Shipping time	★★★★★	1252
Shipping and handling charges	★★★★★	1246

### Latest Feedback

[◀](#) [||](#) [▶](#) [See all](#)



Recommend to all. Oct-28-12 08:55

Buyer: [jimijam](#) (363 ★ )



Thanks! As Described! Oct-28-12 08:28

Item #: 4003197366

# Rating Methods in Online Societies

18

	Rating Levels	Entities Rated	Rating Semantics	Seller Feedback	Selling/ Financial transaction	Overall/ Detailed Rating	Rating Source
Amazon	5	Sellers Products	+ve : 5 or 4 Neutral: 3 -ve: 2 or 1	No	Yes	Yes	Customers Spotlight
		Reviews	Hated it: 1 Loved it: 5				
eBay	Starts at 3 Till 10	Members		Yes	Yes	Yes	Members
Epinions	5	Sellers Products	Excellent: 5 Poor: 1		No	Yes	Trusted Agents Customers
	4	Reviews Reviewers					
BizRate	5	Products Merchants		No	No	No	Customers Trusted Agents
	4	Reviews					
Yahoo	6	Sellers Products	Excellent: 5 Poor: 1	Yes	Yes	Yes	Members
	2	Reviews	Helpful Not Helpful				

# Implicit vs. Explicit Ratings

Where are you going to do your graduate studies?



I'm going to Stanford. I just got accepted 2 days ago.



Why Stanford? You could go to Yale or Harvard.



**Explicit: the statement**

Stanford has the best Design Thinking program. They were the 1<sup>st</sup> ones to start the discipline



# Implicit vs. Explicit Ratings

19

Where are you

**Implicit: Actually going there**

your graduate studies?



I'm going to Stanford. I just t accepted 2 days ago.



Why Stanford?  
You could go to Yale or Harvard.



**Explicit: the statement**

Stanford has the best Design Thinking program. They were the 1<sup>st</sup> ones to start the discipline















# Reputation Models and Calculations

# How to Quantify Reputation?

21

- How do we represent trust numerically? fractions, integers, percentages or some other representation?
- What is the range of possible values for a trust value? What meaning can we assign to a particular value?

Trustworthiness level	Trustworthiness value (user defined)	Visual representation (star rating system)
Level -1	$x = -1$	Not displayed
Level 0	$x = 0$	Not displayed
Level 1	$0 < x \leq 1$	From  to 
Level 2	$1 < x \leq 2$	From   to  
Level 3	$2 < x \leq 3$	From    to   

# Calculation Methods

22

provide a method for calculating the trustworthiness value for use in the current timeslot. Such as:

- Sum
- Average
- deterministic
- Bayesian
- fuzzy systems
- .....

# Calculation Factors

23

(a) Deterministic approach

$$\begin{aligned}
 T_{RA}(k, n) = & \alpha_1 \sum_i^I TCA(i, n, c) * RA(i, k, n, c) * TFA(i, n, c) \\
 & + \alpha_2 \sum_j^J TCA(j, n, c) * RA(j, k, n, c) * TFA(j, n, c) \\
 & + \alpha_3 \sum_l^L TCA(l, n, c) * RA(l, k, n, c) * TFA(l, n, c)
 \end{aligned}$$

**Credibility or trustworthiness of reputation opinion** (points to  $RA(i, k, n, c)$ )  
**Reputation opinion given by recommending agent i** (points to  $RA(i, k, n, c)$ )  
**Time Factor** (points to  $TFA(i, n, c)$ )

(b) Bayesian approach

$$r_{ab} = \frac{\sum_{i=1}^l w_{ai} r_{ib}}{\sum_{i=1}^l w_{ai}}$$

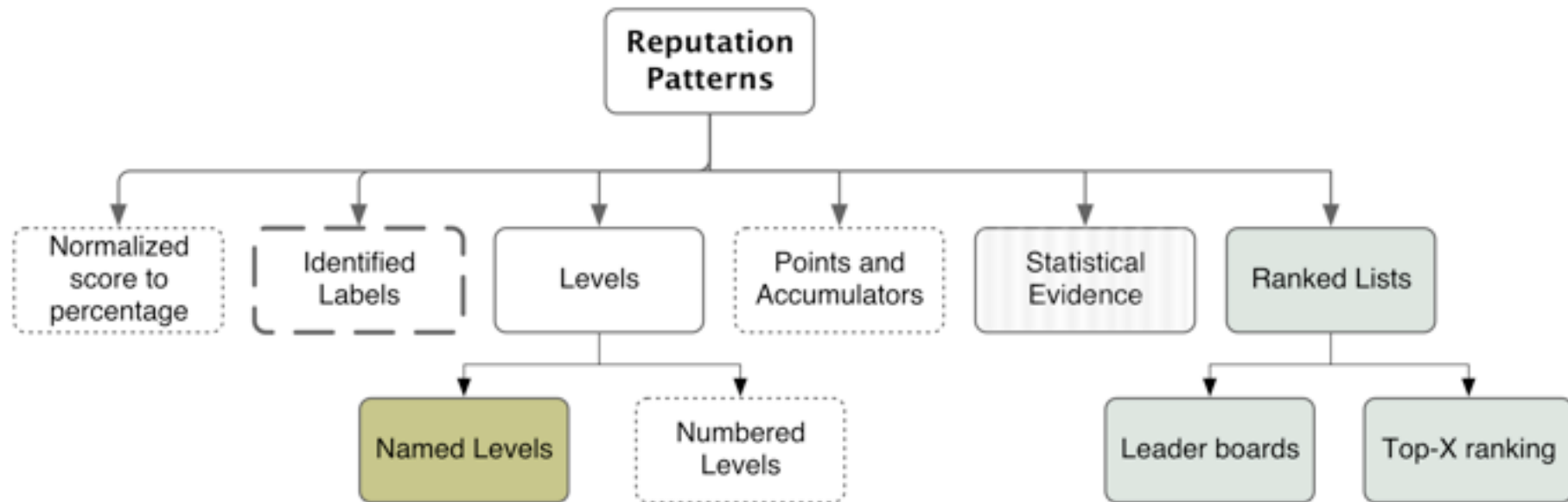
**Credibility** (points to  $w_{ai}$ )      **Reputation** (points to  $r_{ib}$ )



# Community Nature, Patterns and Content Control

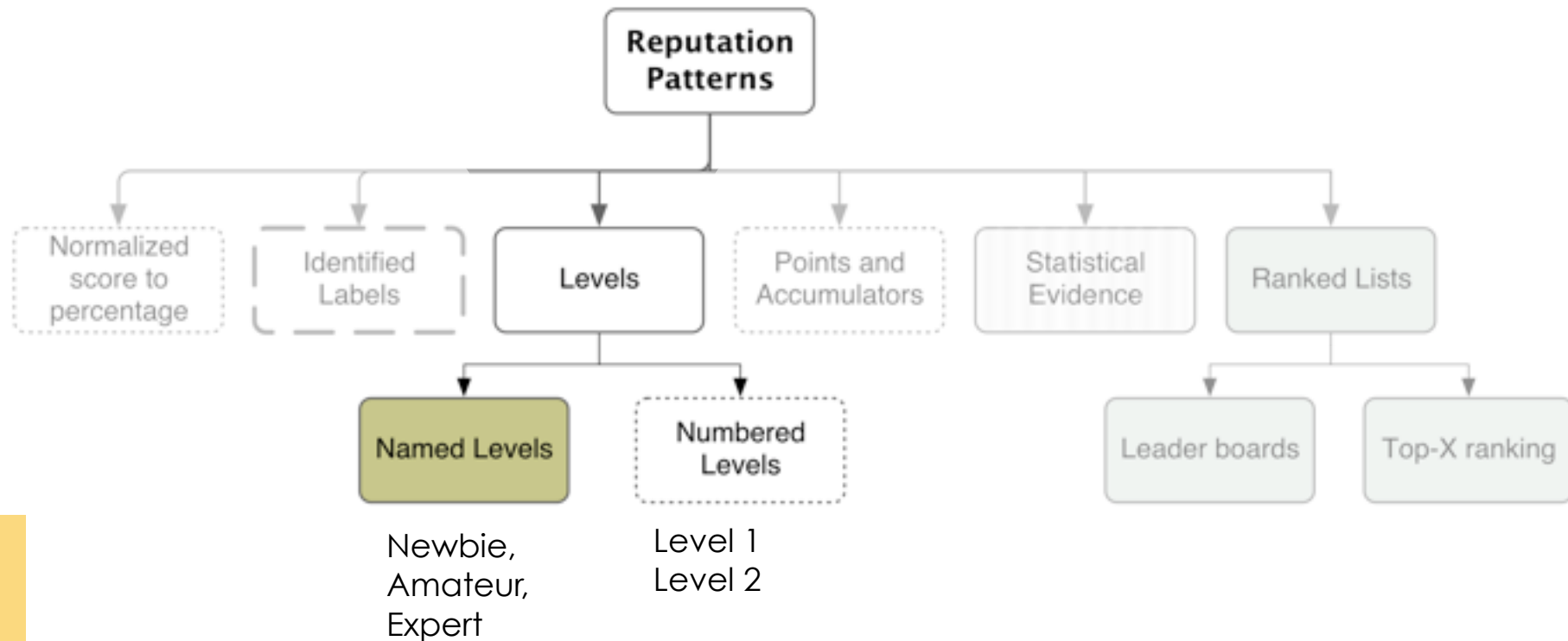
# Reputation Systems Patterns

25



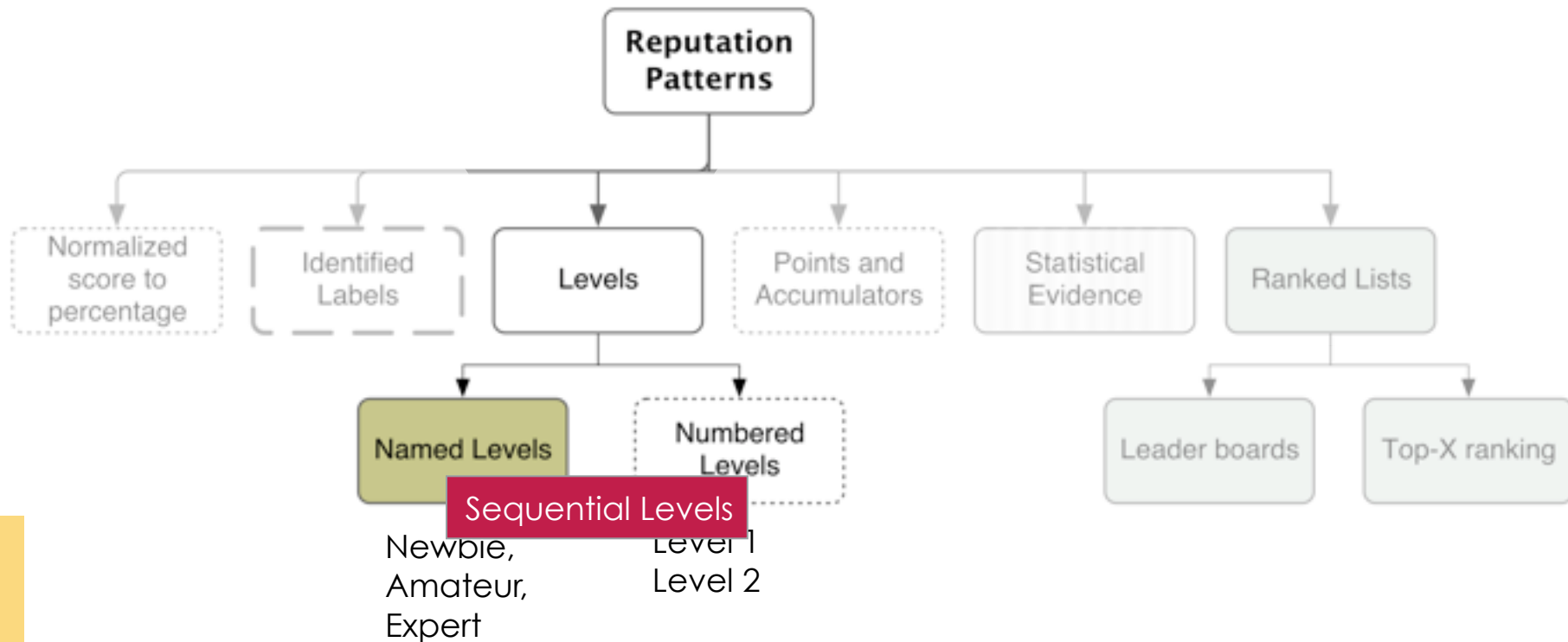
# Reputation Systems Patterns

26



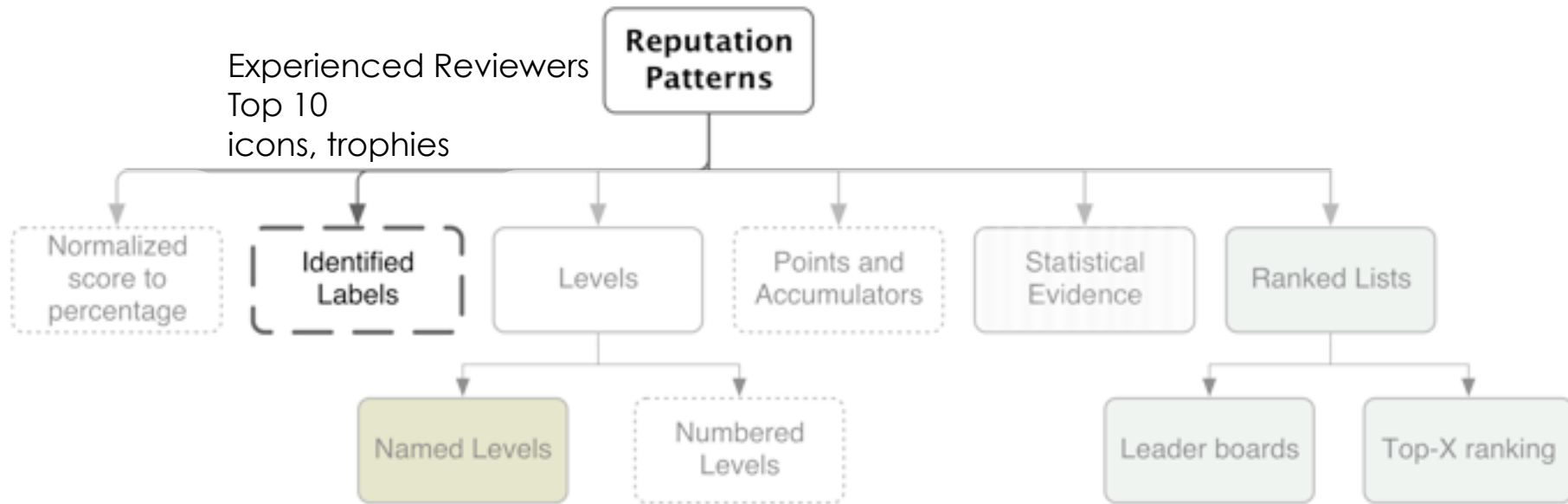
# Reputation Systems Patterns

26



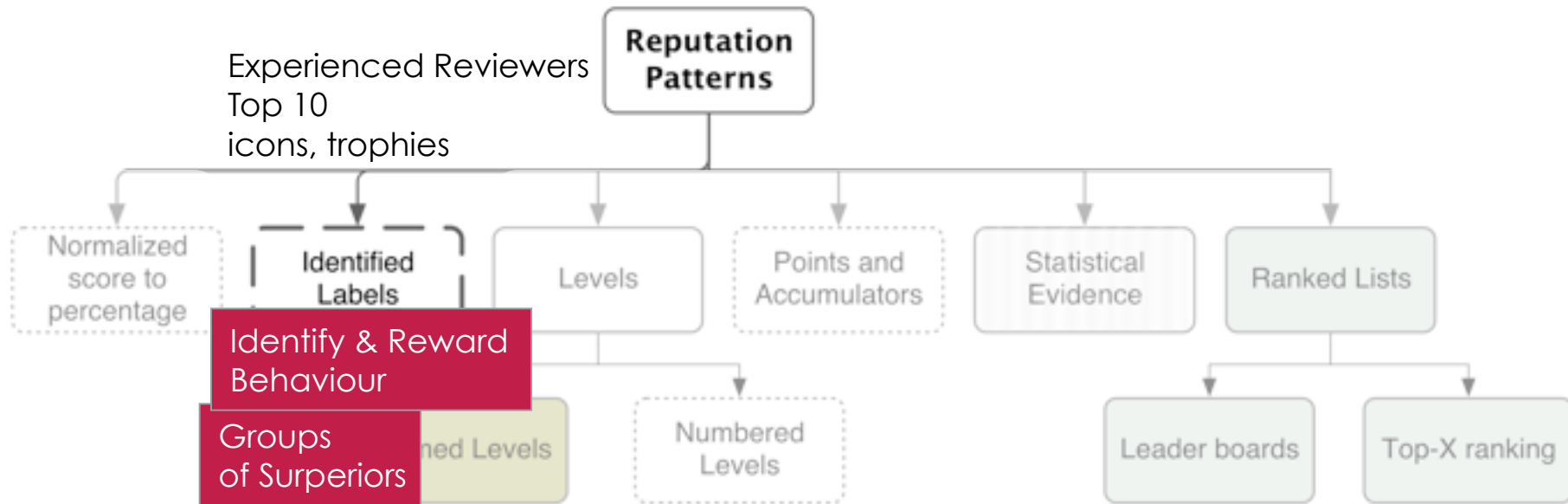
# Reputation Systems Patterns

27



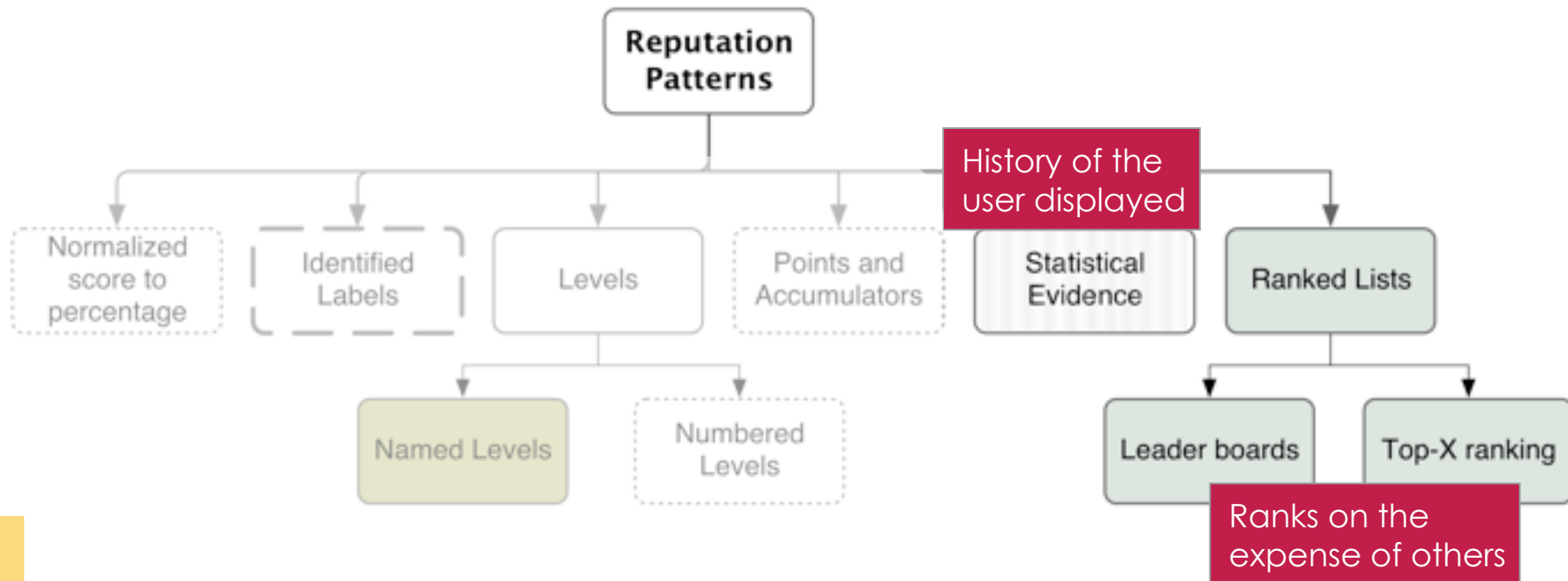
# Reputation Systems Patterns

27



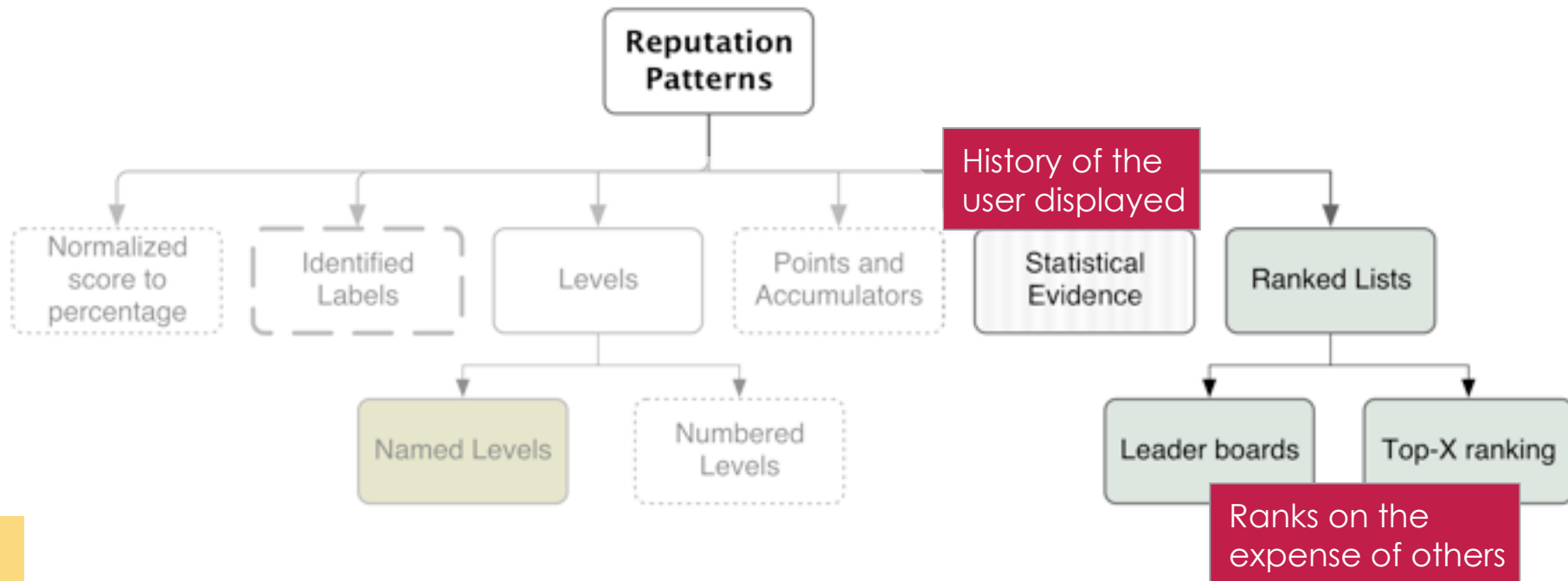
# Reputation Systems Patterns

28



# Reputation Systems Patterns

28



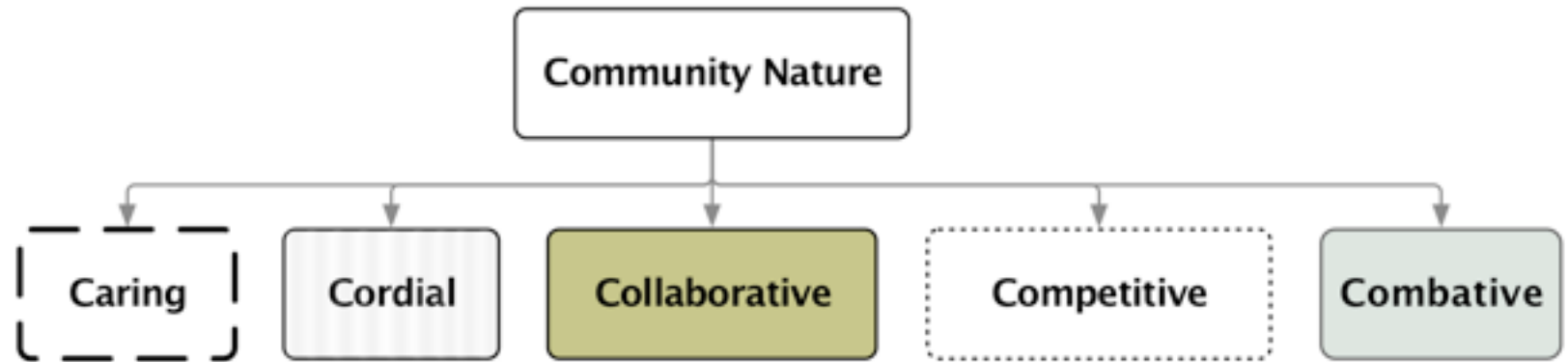
Depends on the business goals

- user engagement a primary goal?
- promoting a certain feature?
- user loyalty?



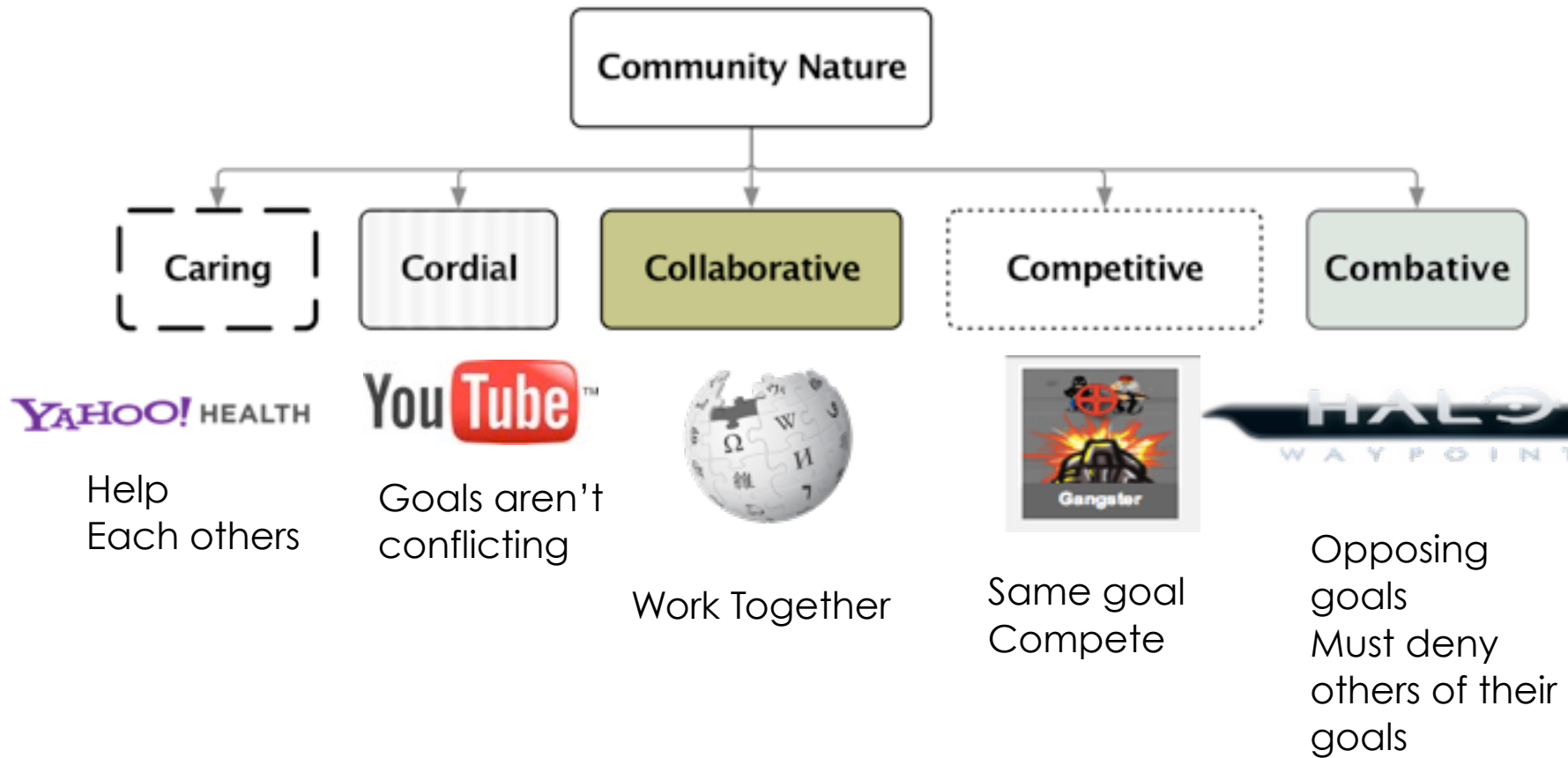
# Community Nature

29

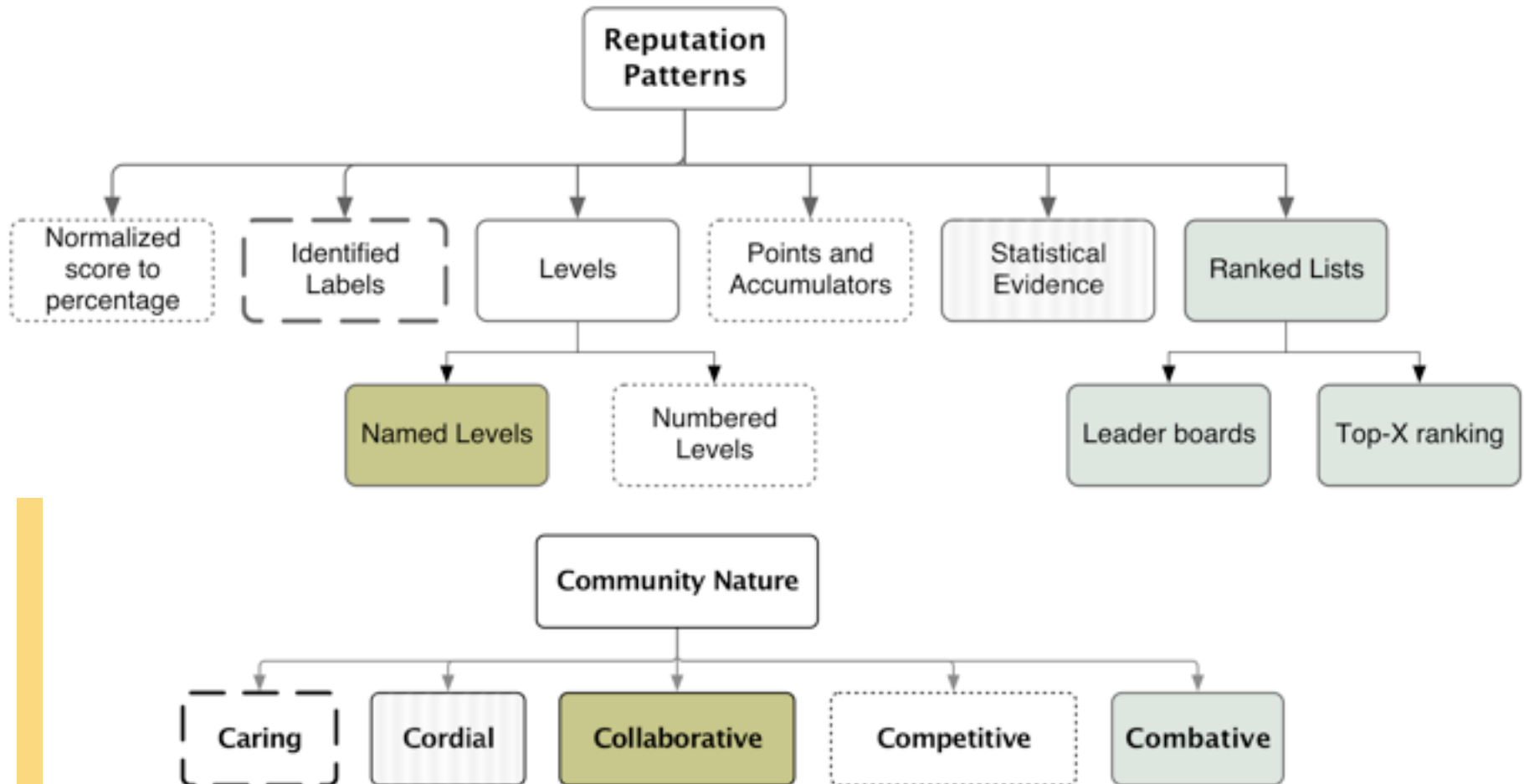


# Community Nature

29



# Reputation Systems Design Decision



# Content control patterns

31

**Create**

**Evaluate**

**Remove**

# Content control patterns

31

Create

Evaluate

Remove

- **Web 1.0:** Staff Creates, Evaluates, and Removes
- **Bug Report:** Staff Creates and Evaluates, Users Remove (*ex. Bugzilla*)
- **Reviews:** Staff Creates and Removes, Users Evaluate (*ex. Amazon.com*)
- **Surveys:** Staff Creates, Users Evaluate and Remove (*ex. American Idol*)
- **Submit-Publish:** Users Create, Staff Evaluates and Removes (*Citizen news sites*)
- **Agents:** Users Create and Remove, Staff Evaluates (*Agents calculate*)
- **Basic Social Media:** Users Create and Evaluate, Staff Removes (*removing when conflict occurs*)
- **Part of Web 2.0:** Users Create, Evaluate, and Remove (*Wikis*)

# Why bother: Incentive to contribute

32

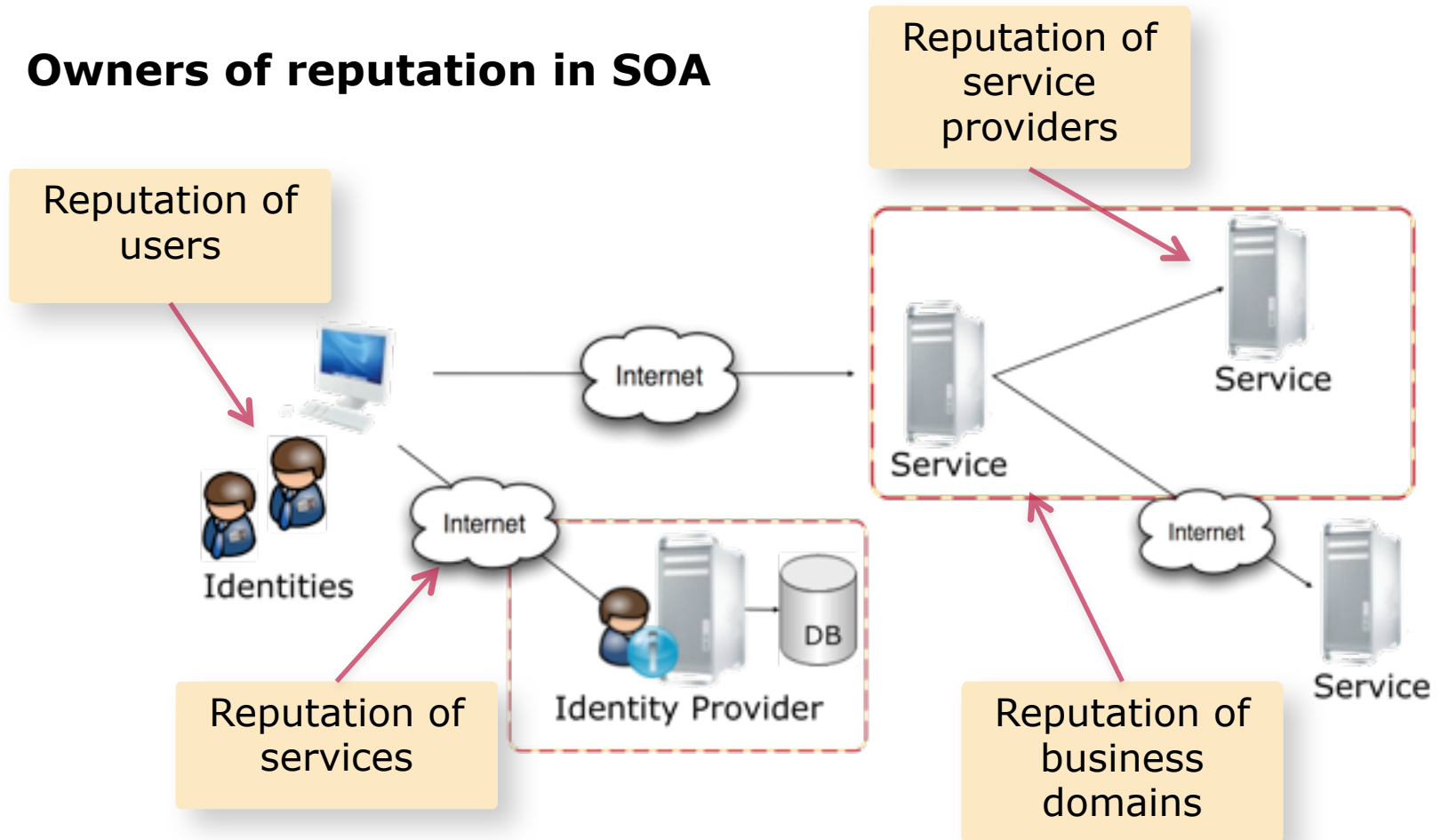
- **Altruistic motivation:** for the good of others
  - Tit-for-tat, community dynamics
- **Financial motivation:** to generate revenue
  - *Epinions* money for reviews, P2P networks,...
- **Egocentric motivation:** for self-gratification
  - user show their accomplishment in their profiles
  - I know it all
  - I am recognized in the community

# Reputation in Service-oriented Architecture

# Reputation in SOA

34

## Owners of reputation in SOA

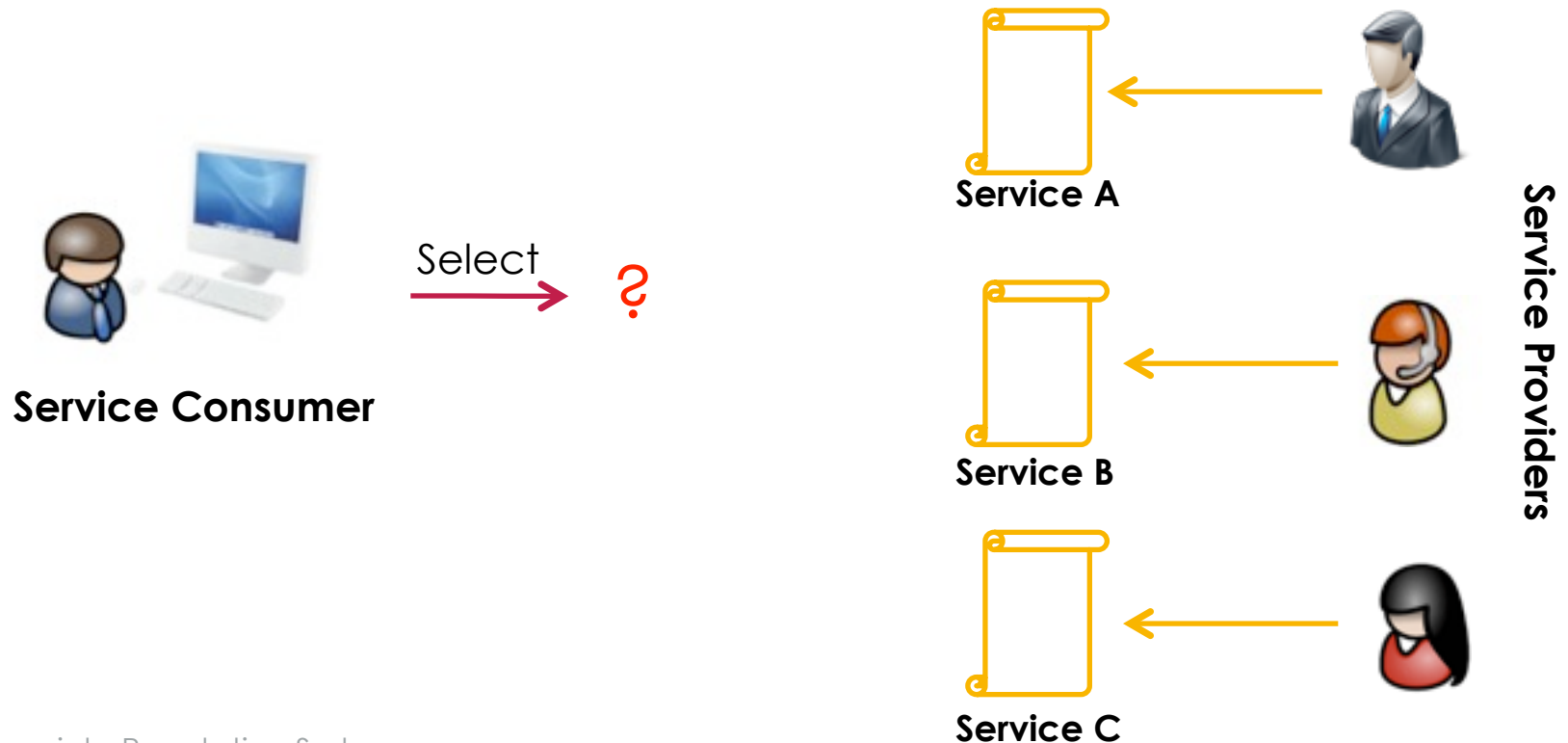




# How it is used in SOA

35

- Service Providers: Publish the description of their services
- Service Consumers: Search for services with specific functionality



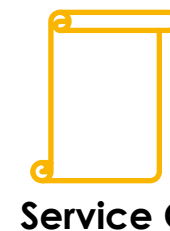
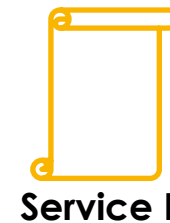
# Service Matching in SOA

36

- Highest service rate
- Best availability of services
- High Bandwidth
- Reasonable Price



Select



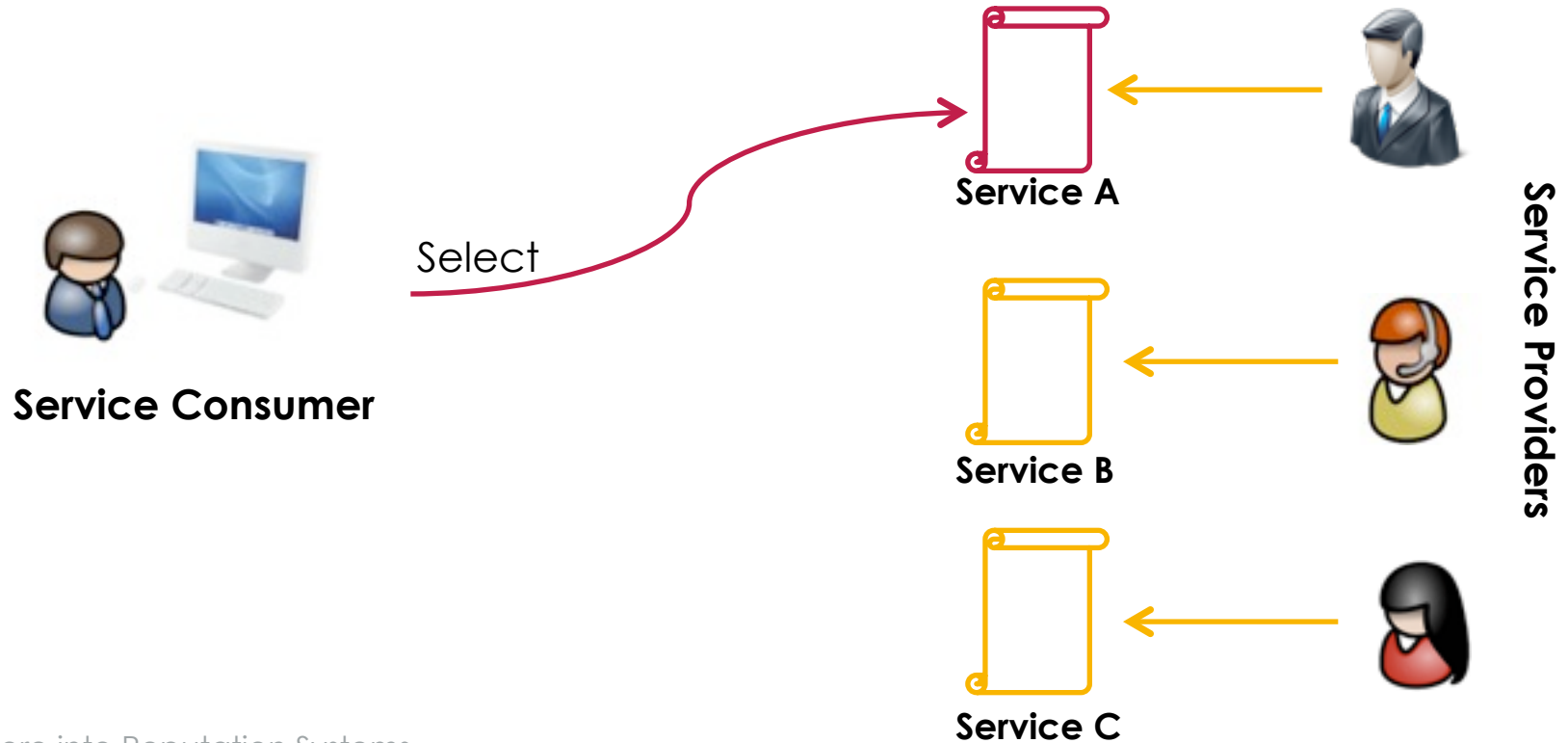
**Service Providers**

# Service Matching in SOA

36

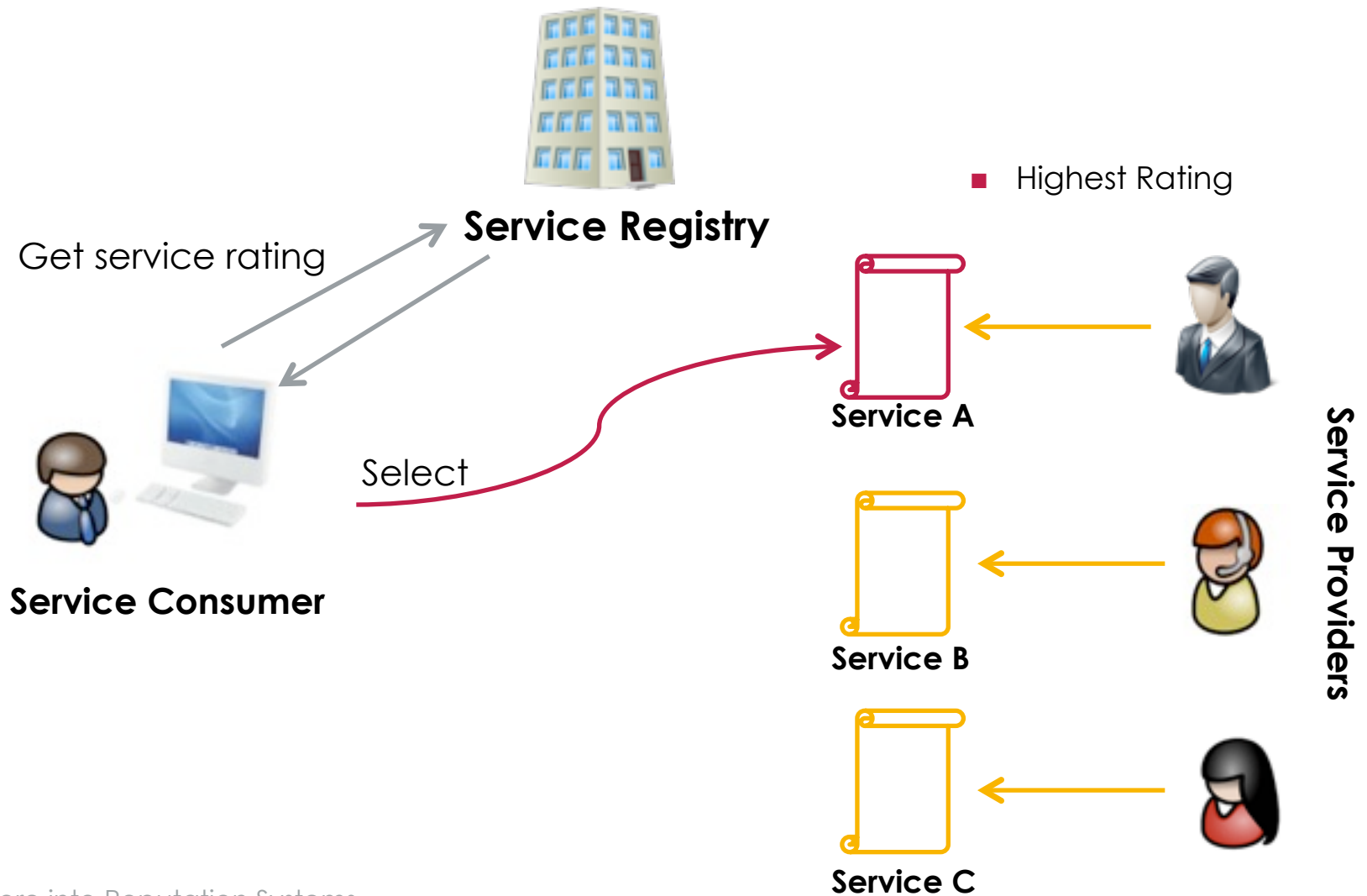
**Quality of Service Metric** = **Reputation Attributes**

- Highest service rate
- Best availability of services
- High Bandwidth
- Reasonable Price



# Service Matching in SOA

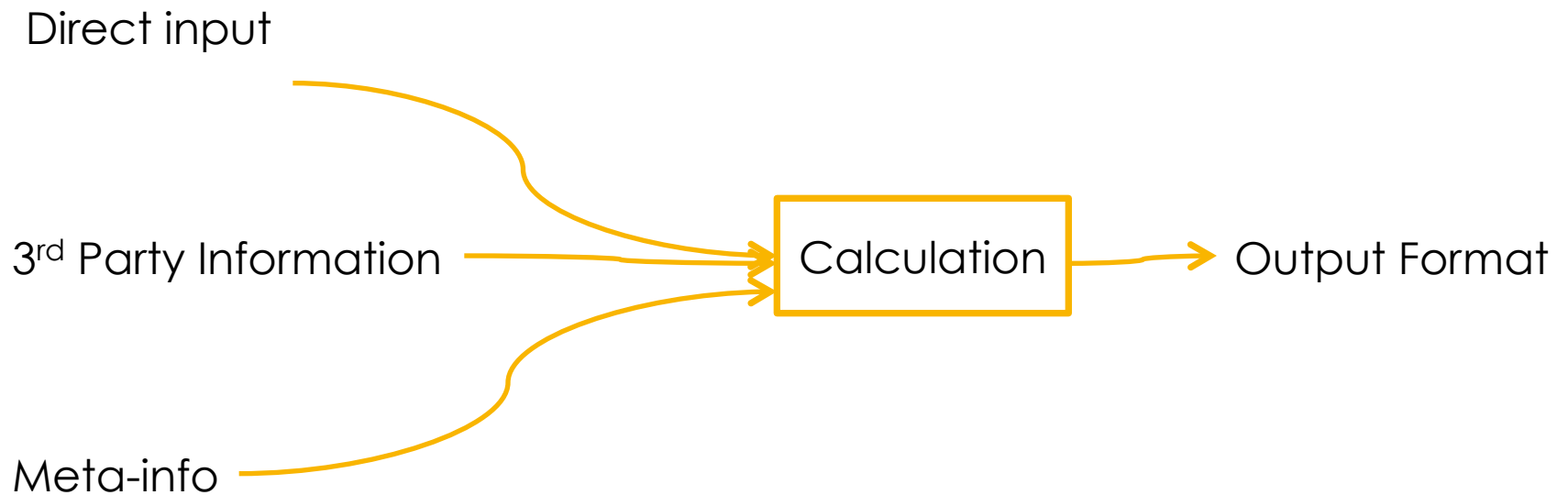
37



# Reputation Systems Design

# Design of Reputation Systems

39



# Reputation Systems Properties

40

- **Reputation Model**

- Capture feedback

Why leave feedback?

- Guide trust decisions

- Persist over time

# Reputation Systems Properties

40

- **Reputation Model**

- Capture feedback

honest feedback?

Why leave ~~feedback?~~

- Guide trust decisions

How to summarize feedback to lead to a decision?

Are all interactions equal? Weighed-Feedback

- Persist over time



# Design of Reputation Systems

41

A reputation system should describe

- **Computation functions/mechanisms**, i.e. how to calculate reputation?
- **Communication model**, i.e. how to collect and disseminate reputation?
- **Participants**, i.e. who uses and/or is affected by reputation?
- **Resources**, i.e. what is the information used to calculate reputation?
- **Representation model**, i.e. how to represent, view, or visualize reputation?
- **Storage**, i.e. where and how is reputation stored?
- **Functionalities and applications**, i.e. what are the benefits of using reputation in the domain of its creation?

# Design of Reputation Systems

42

- In the system design, questions need to be answered
  - What inputs should be solicited ?
  - What outputs should be presented ?
  - How transparent should the rules be ?
  - How should reputation evolve over time ?

# Design: Inputs

43

- What inputs should be solicited ?
  - Internal actions to be recorded
  - Feedback to record
  - Rating of things or rating of people (separately of what they own/create)
  
- How?
  - Audit your system
  - What are the actions users can do
  - Relations between actions
  - Actions to encourage vs discourage

# Design: Outputs


44

- What outputs should be presented?
  - Statistics
  - Star Rating
  - Score/Ranks
  - Name Level
  - Badges
  - Leaderboards
  - ...

# Why do we need Reputation Systems?

45

- Trust
  - Leads to trust decisions
  
- Quality
  - Incentive to quality participation
  - Recognize the relatively best
  
- Matching and Filtering
  - Find what I am looking for
  - Reduce Information overload
  
- Participation
  - Reasons to stay in the community

A 3D rendered white character with a large head and small body, holding a rectangular sign with both hands. The sign contains the text 'Have a question? Contact me!'. The character is standing on a light gray surface against a white background.

Have a  
question?  
Contact me!

Rehab Alnemr  
([rehab.alnemr@hpi.uni-potsdam.de](mailto:rehab.alnemr@hpi.uni-potsdam.de))