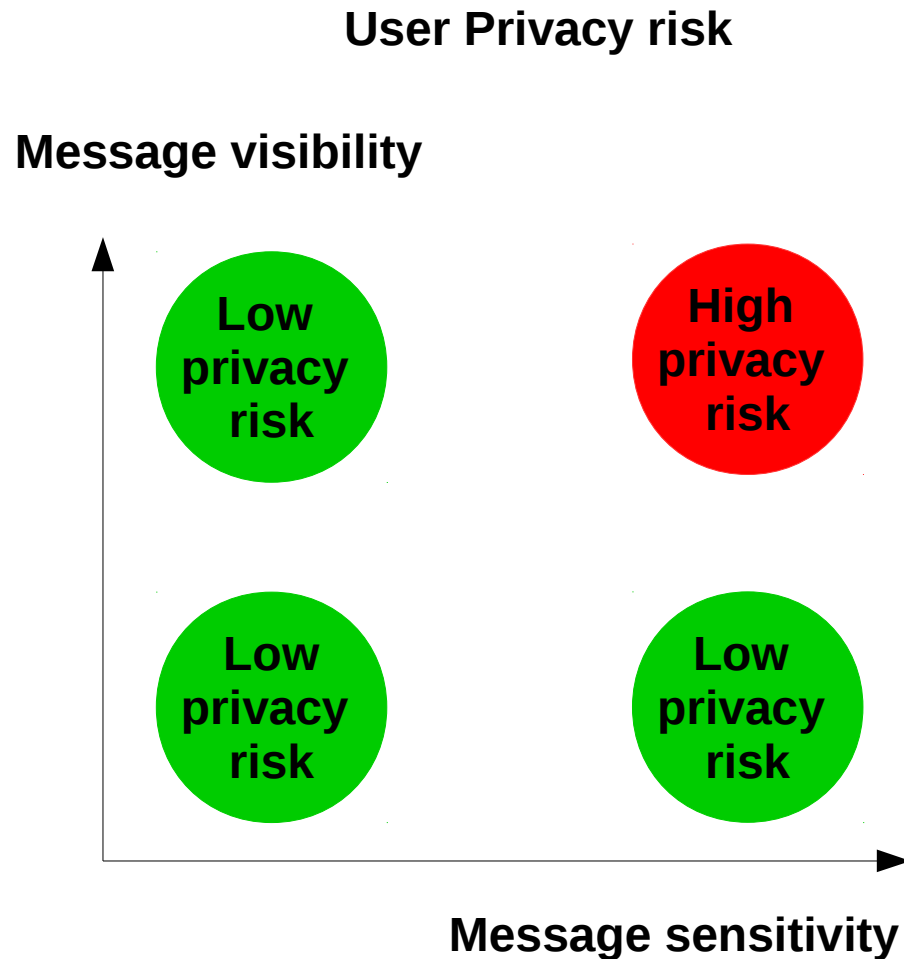


Plan of Presentation

1. Definition
2. Motivation
3. Privacy index
 - Technical
 - Social
 - Behavioral
4. Privacy setting
 - Behavioral
 - **Fuzzy c-means clustering**
 - **Item Response Theory**

1. Definition



- Privacy score is the trade-off between:
 - **Message sensitivity:**
 - Qualitative metric
 - **Message visibility:**
 - Quantitative metric
- Example:
 - Privacy score: 64%
 - 64% of my messages are visible ?
 - OK !
 - Is 64 % of my data it is sensitive ?

2. Motivation

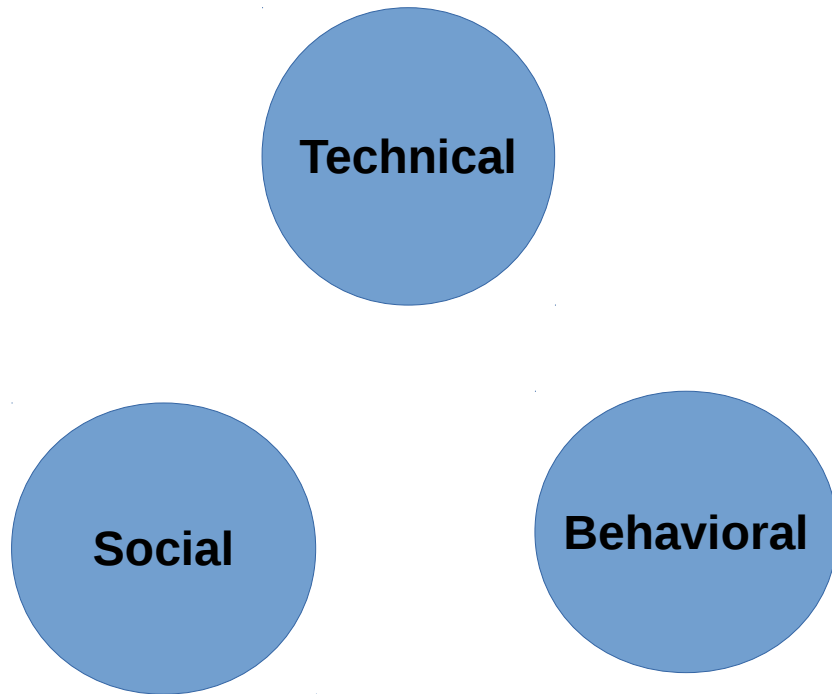
Connection data	<ul style="list-style-type: none">• SSL session• Device / log / Timezone• Cookies / Browsing history
Login data	<ul style="list-style-type: none">• Email / Phone / Password
Mandatory data	<ul style="list-style-type: none">• Name / birthday / gender
Extended profile data	<ul style="list-style-type: none">• Education / hometown / languages• Political / religion / website / work
Application data	<ul style="list-style-type: none">• Usage statistics / Scores• Permissions / Credit card
Interests	<ul style="list-style-type: none">• Hobbies : Books / Music / Movies• Likes / Inspirational_people
Network data	<ul style="list-style-type: none">• Family / Friends / Groups
Contextual data	<ul style="list-style-type: none">• Taggable_friends / Tagged_places
Private communication Data	<ul style="list-style-type: none">• Private message• Inbox / Outbox / Poke
Disclosed data	<ul style="list-style-type: none">• Text post / Photo / Video• Check-in

2. Motivation

Connection data	<ul style="list-style-type: none">• SSL session• Device / log / Timezone• Cookies / Browsing history
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Disclosed data	<ul style="list-style-type: none">• Text post / Photo / Video• Check-in

Where are all this messages ?
Can I measure their privacy ?

3. Privacy index



- **Behavioral**

- Data: text, URL, Code
- Data type: image, video
- Nb of URL / Nb of Hash-tags

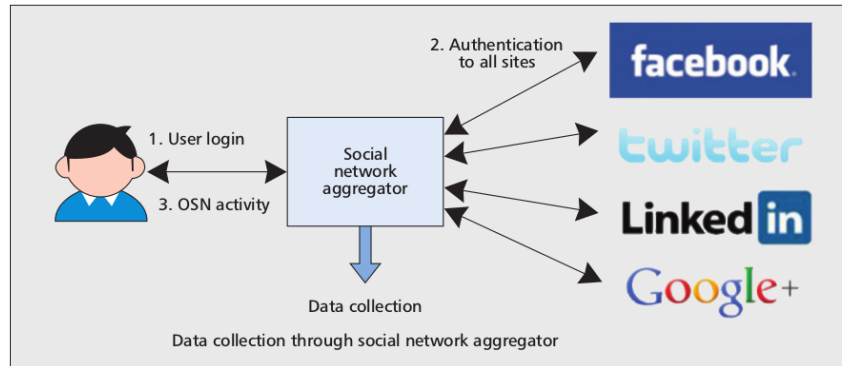
- **Social**

- Family / Friends / Groups
- Spammers / Fake profile

- **Technical**

- SSL session
- Device / log / Timezone
- Cookies / Browsing history

3. Privacy index



- **Behavioral**

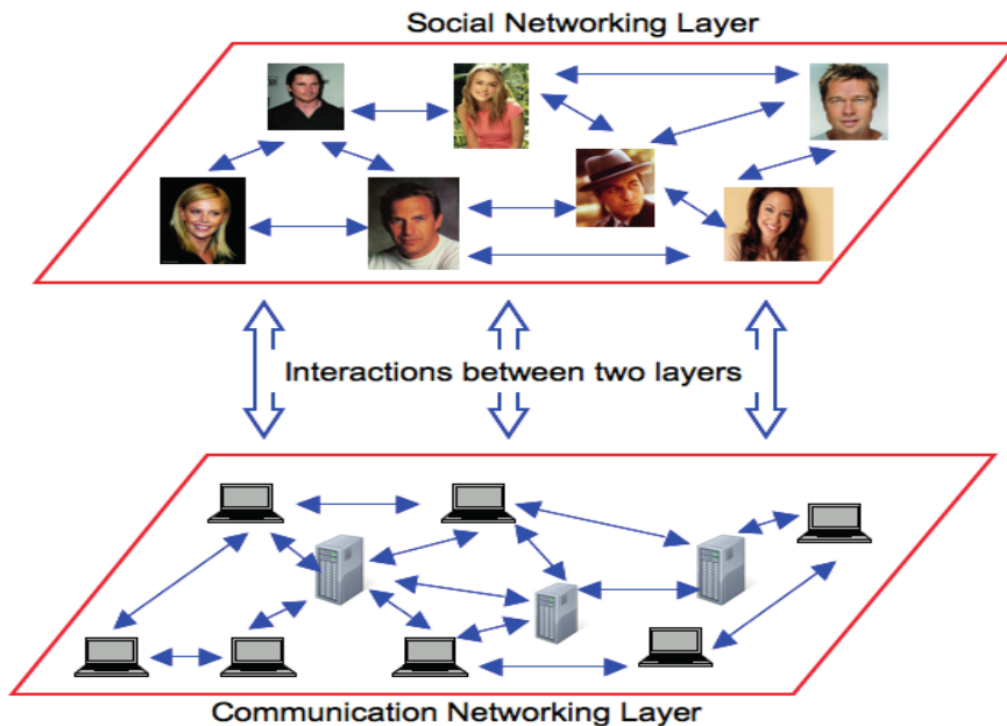
- Data: text, URL, Code
- Data type: image, video
- Nb of URL / Nb of Hash-tags

- **Social**

- Family / Friends / Groups
- Spammers / Fake profile

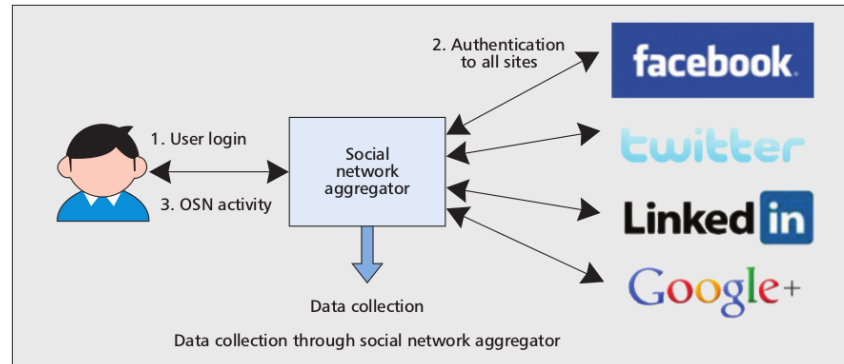
- **Technical**

- SSL session
- Device / log / Timezone
- Cookies / Browsing history



3 privacy layers → 3 privacy values

3. Privacy index



- **Behavioral**

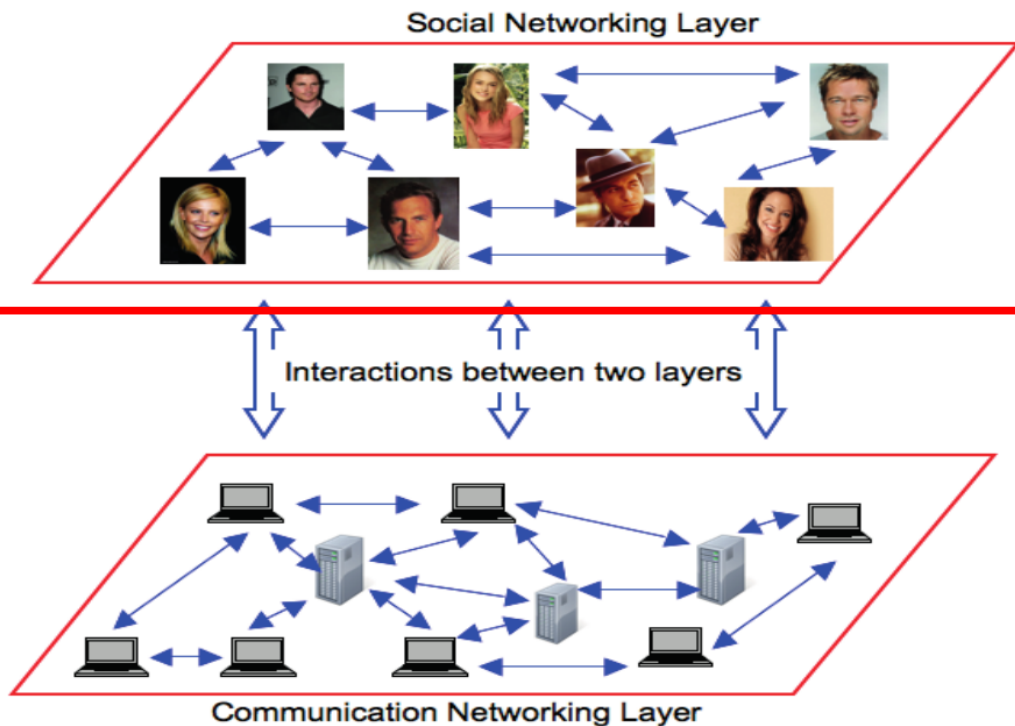
- Data: text, URL, Code
- Data type: image, video
- Nb of URL / Nb of Hash-tags

- **Social**

- Family / Friends / Groups
- Spammers / Fake profile

- **Technical**

- SSL session
- Device / log / Timezone
- Cookies / Browsing history



3 privacy layers → 3 privacy values

3. Privacy index

ACCESS PRIVACY CHECK APPLICATION

Select Information you want to share with this Application

Privacy Risk:

64%

Saved Permissions Select ▼

<input checked="" type="checkbox"/>	Name ⓘ	<input checked="" type="checkbox"/>	Bio ⓘ
<input checked="" type="checkbox"/>	Gender ⓘ	<input checked="" type="checkbox"/>	Education ⓘ
<input checked="" type="checkbox"/>	Birthday ⓘ	<input checked="" type="checkbox"/>	Hometown ⓘ
<input checked="" type="checkbox"/>	Email ⓘ	<input type="checkbox"/>	Political ⓘ
<input checked="" type="checkbox"/>	Location ⓘ	<input checked="" type="checkbox"/>	Relationship Status ⓘ
<input checked="" type="checkbox"/>	Religion ⓘ	<input type="checkbox"/>	Favorite Athletes ⓘ
<input type="checkbox"/>	Sports ⓘ	<input type="checkbox"/>	Inspirational People ⓘ
<input type="checkbox"/>	Favorite Teams ⓘ	<input checked="" type="checkbox"/>	Quotes ⓘ
<input checked="" type="checkbox"/>	Languages ⓘ	<input type="checkbox"/>	Updated Time ⓘ
<input type="checkbox"/>	Timezone ⓘ	<input type="checkbox"/>	Work ⓘ
<input type="checkbox"/>	Website ⓘ	<input checked="" type="checkbox"/>	First Name ⓘ
<input type="checkbox"/>	Photos ⓘ	<input checked="" type="checkbox"/>	Likes ⓘ
<input checked="" type="checkbox"/>	Last Name ⓘ	<input type="checkbox"/>	Upload Photos ⓘ
<input checked="" type="checkbox"/>	Post on Behalf ⓘ	<input type="checkbox"/>	Allow any time access ⓘ
<input checked="" type="checkbox"/>	Post Visibility ⓘ	<input type="checkbox"/>	

Only Me ▼

Save this Permission as *

*You can save this permission for future applications

Allow Allow as Anonymous Dont Allow

4. Privacy settings

Privacy settings Matrix

Sensitivity	β_1	...	β_n
User\Item	msg 1	...	msg n
User 1			
...		visibility	
User N			

- Privacy score is the trade-off between:
 - message sensitivity
 - message visibility

- Items visibility and sensitivity depend on:
 - Privacy settings matrix

- Behavioral privacy
 - Examples
 - 1) Fuzzy c-means clustering
 - 2) Item Response Theory

4. Privacy settings:

4.1 Behavioral privacy (Fuzzy c-means clustering)

- **Input**

- Users: $U = \{ u_1, \dots, u_N \}$
- Privacy settings: $S = \{ s_{(1,1)}, \dots, s_{(i,v)} \}$
 - Data type $I = \{ \text{MyActivity, ContactMe, MyRelations, MyTopics, PersonelInfo, VoteInfo} \}$
 - Visibilities: $V = \{ \text{OnlyMe, Friends, FriendsOfFriends, Public} \}$

- **Method**

- Fuzzy c-means clustering

- **Output**

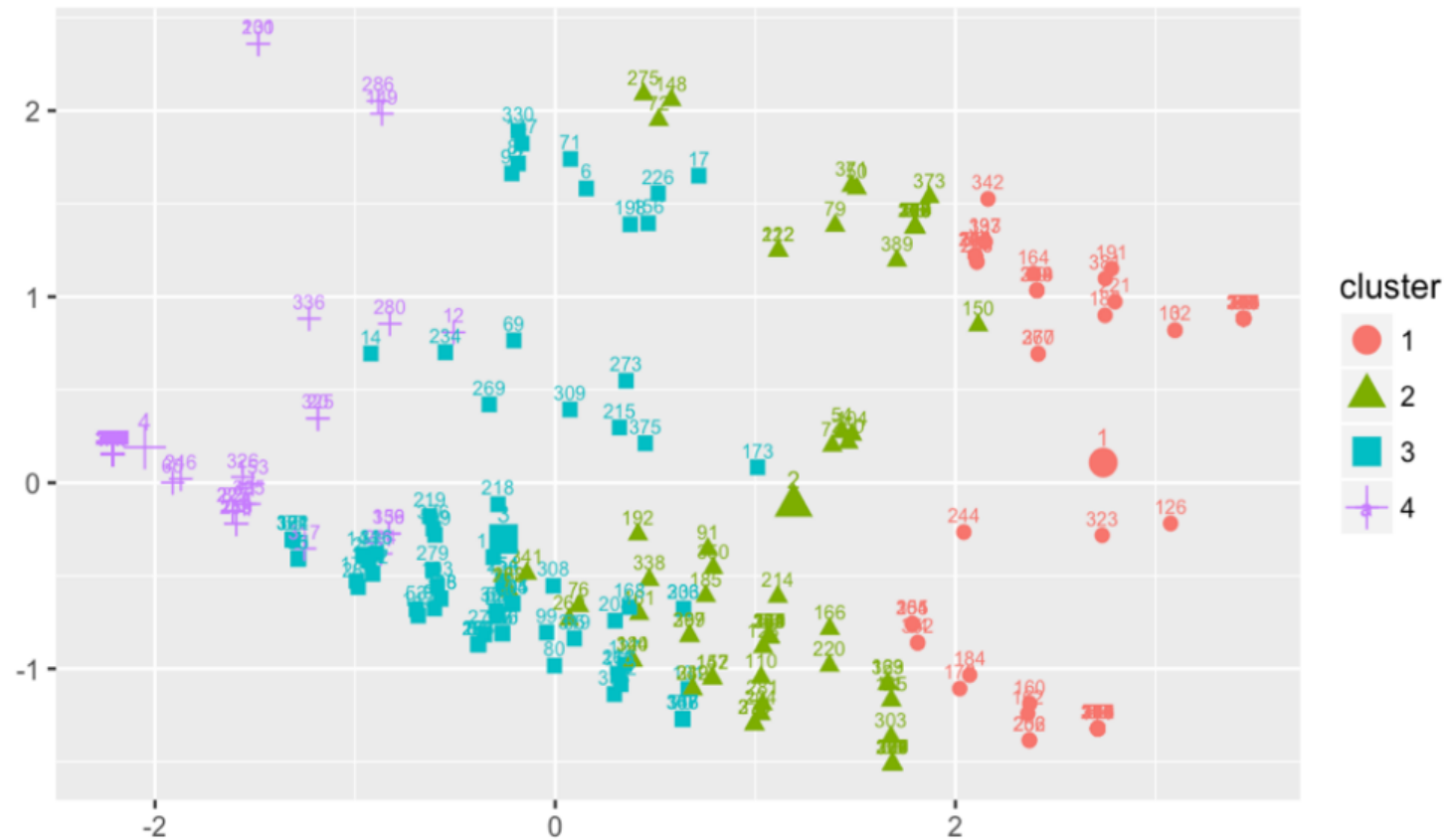
- **Users behavior**

User	My Activity	Contact Me	My Relations	My Topics	Personal Info	Vote Intention
1	2	3	2	3	3	2
...
N	4	4	4	2	2	1

Privacy settings matrix

4. Privacy settings:

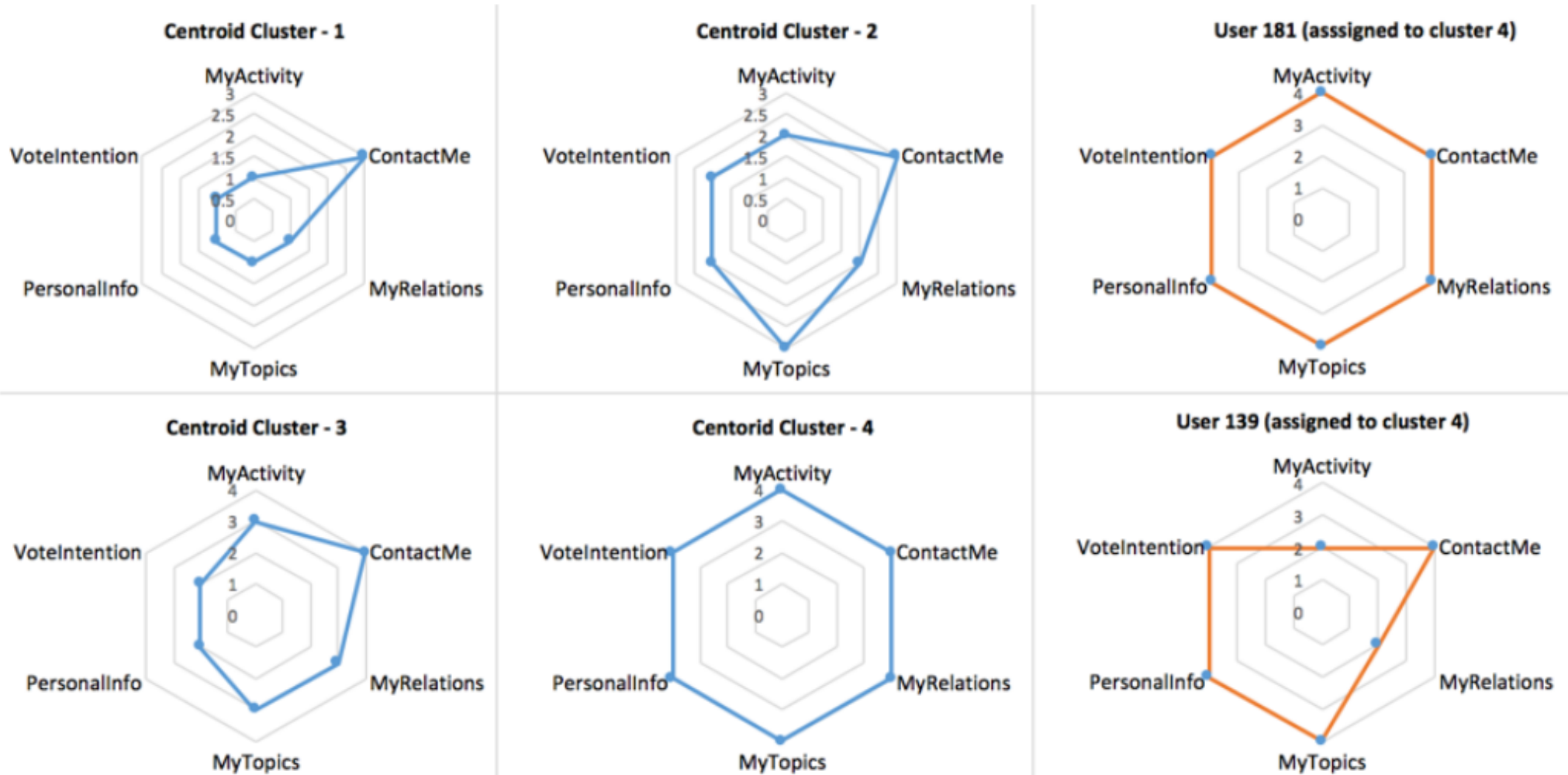
4.1 Behavioral privacy (Fuzzy c-means clustering)



Fuzzy c-means clustering with 4 clusters

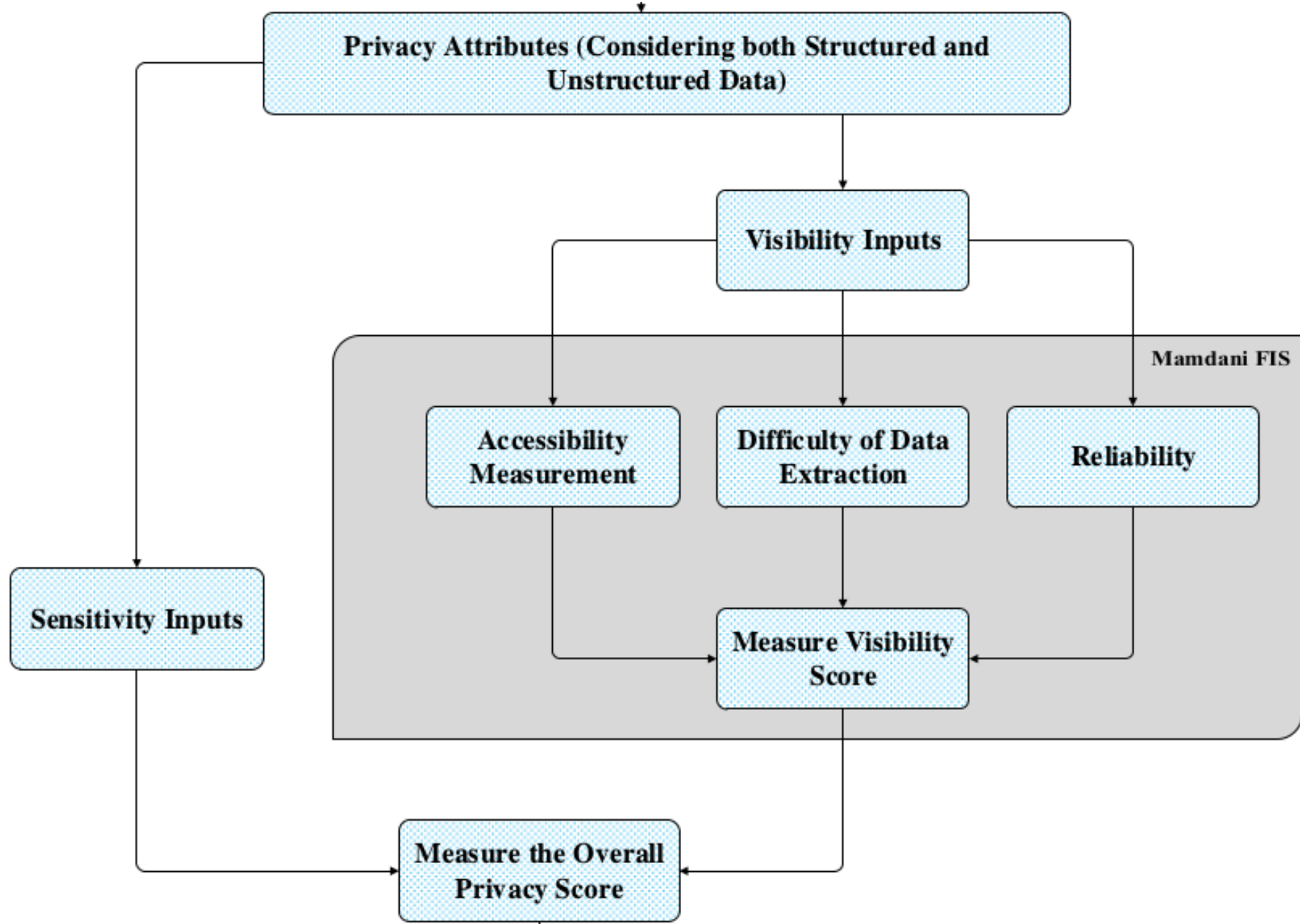
4. Privacy settings:

4.1 Behavioral privacy (Fuzzy c-means clustering)



4. Privacy settings:

4.1 Behavioral privacy (Fuzzy c-means clustering)

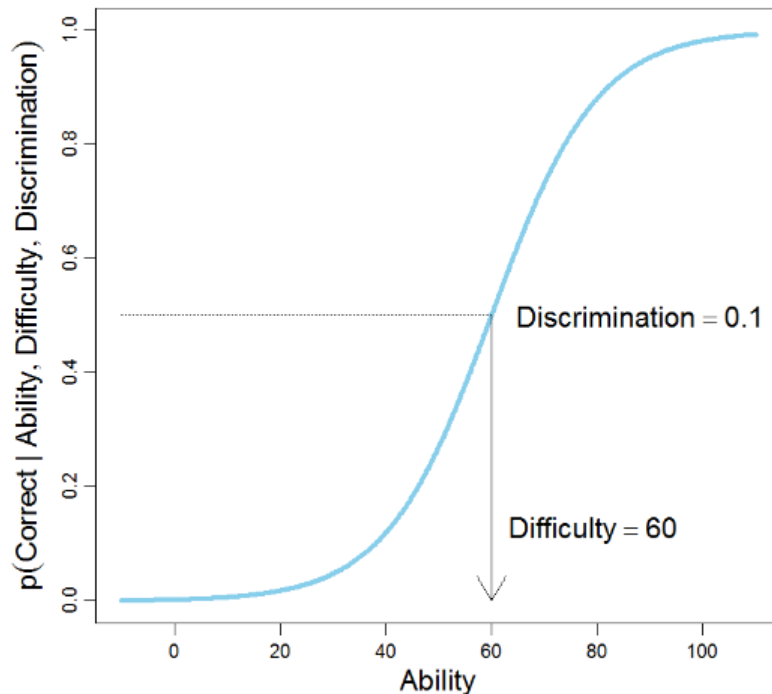


4. Privacy settings:

4.2 Behavioral privacy (Item Response Theory)

Privacy settings Matrix

	Sensitivity	β_1	...	β_n
Attitude	User\Item	Item 1	...	Item n
θ_1	User 1			
	...		$R(i,j)$	
θ_N	User N			



- Privacy score is the trade-off between:

- data sensitivity
- data visibility

- data visibility and sensitivity depend on:

- Privacy settings matrix

- data visibility depends on:

- Response Matrix

$$P_{ij} = \text{Prob}\{R(i,j) = k\}$$

- Item Response Theory (IRT)

$$P_{ij} = \frac{1}{1 + e^{\alpha_i(\theta_j - \beta_i)}}$$

4. Privacy settings:

4.2 Behavioral privacy (Item Response Theory)

		Sensitivity	β_1	...	β_n
Privacy	Attitude	User\Item	Item 1	...	Item n
P_1	θ_1	User 1			
		...		$R(i,j)$	
P_N	θ_N	User N			

- $$P_j = \sum_{i=1}^n \beta_i \cdot V_{ij}$$
- $$V_{ij} = P_{ij}$$
- $$P_{ij} = \frac{1}{1 + e^{\alpha_i(\theta_j - \beta_i)}}$$
- $$P_{ij} = \text{Prob}\{R(i,j) = k\}$$

Thank you for your attention