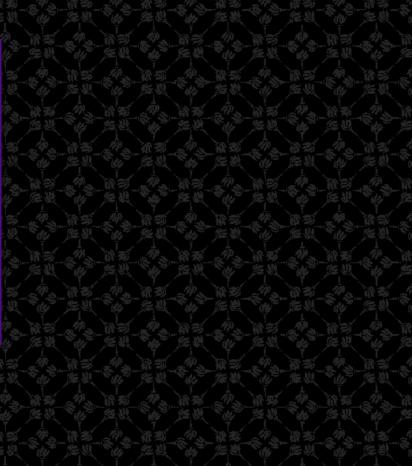
SOK: MANAGING LONGITUDINAL PRIVACY OF PUBLICLY SHARED PERSONAL ONLINE DATA

PETS 2021, The Internet, 12-16 July, 2021

 $\underline{Theodor\ Schnitzler}^{\dagger}, \underline{Shujaat\ Mirza}^{\dagger}, Markus\ D\"{u}rmuth, and\ Christina\ P\"{o}pper$

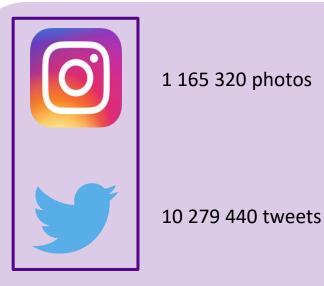
(†: equally contributing authors)







MOTIVATION: LONGITUDINAL PRIVACY CONTROLS



during this talk (18 minutes)

https://www.internetlivestats.com/one-second/

Are Privacy Controls Effective?

- Not meant to be permanent
 → Limited data lifetime (Stories, Fleets)
- Not meant to be for everyone
 → Adjust exposure control (Only share with followers)



RESEARCH ON LONGITUDINAL PRIVACY

HCI Perspective

- Reasons for Data Sharing
- Perception of Exposure
- Reasons for Unsharing

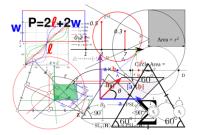
Technical Perspective

- Encrypted Publishing
- Expiration by Time
- No Threats During Data Lifetime



Goal of this SoK

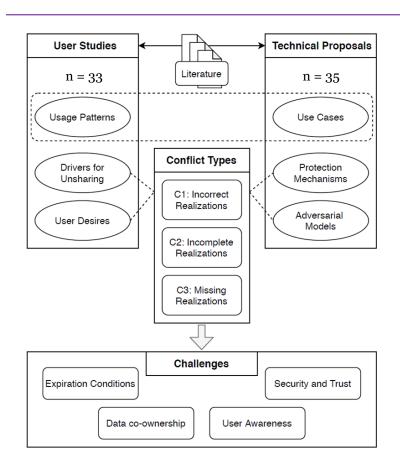
Develop taxonomies and bring together both perspectives



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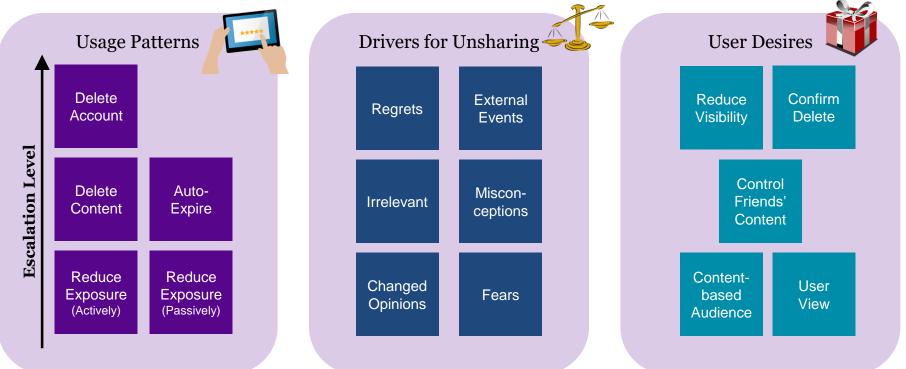
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Systematization of User Studies



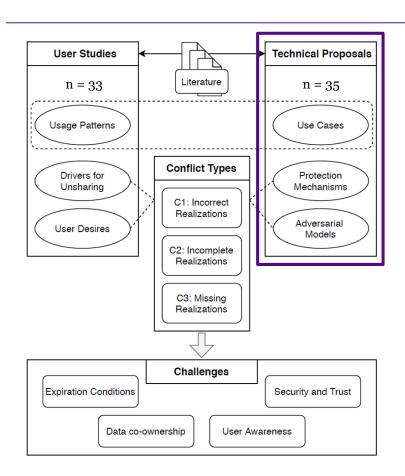
SYSTEMATIZATION OF USER STUDIES

F	Publication	Study Data								Usage Pattern					Drivers for Unsharing						User Desires			
Referen	V _{enue}	Study	Platform	Sample Size	Participants	Female/Male F	Publich 1%	Longitudi	Deles Data	Delet Content	Redi Account	Redin Exposi	Auto Exposition (Actively)	Irreic (Passively)	Chance	Rep. On:	Even.	Misc	Fears Fears	, , ,	reduce Visi	^{cuntent-bas} (Tin	Control Fries Audien	untirn ^{-nds,} ^{-nce} U _{ser} vi _{ew}
[57] [53]	CCS'19 SOUPS'18	R S	FB -	78 30	AMT UNI	69/31 60/40	•	•	0	0	0	0	0	0	•	0	•	0	0	0	0	0	0	0
[60]	SOUPS'18	S	-	22	_	50/50	•	•	•	0	0	0	•	•	•	0	0	0	0	0	0	0	0	0
[41]	CHI'18	R	CL	100	AMT	41/59	●	•	0	0	0	0	0	•	0	0	0	0	0	0	0	0	٠	0
[56]	J-IEEE-IC'17	Р	ТW	100K	[P]	-	•	•	•	•	٠	0	0	0	0	0	0	0	0	0	0	0	0	0
[68]	J-HCI'17	S	FB	272	AMT	61/38	•	•	0	0	0	0	0	٠	0	0	٠	0	0	•	٠	0	0	0
[54]	SOUPS'16	Ρ	тw	100K	[P]	-	•	•	•	٠	٠	0	0	0	0	0	0	0	0	0	0	0	0	0
[9]	WPES'13	R	FB	299	AMT	55/44	•	•	0	0	0	0	0	•	٠	0	•	•	0	0	0	0	0	0
[6]	SOUPS'13	S	FB	193	AMT	40/59	•	•	0	0	0	0	0	•	0	0	•	0	0	•	•	0	0	0
[4]	SOUPS'19	S	FI	30	CON	50/50	•	0	0	0	0	0	0	0	0	0	0	0	•	0	0	0	0	0
[35]	CHI'19	S	SC	1515	Q	57/43	•	0	0	0	0	0	•	0	0	0	0	0	•	0	۲	0	0	0
[77]	SOUPS'18	S	-	23	UNI	52/48	•	0	0	0	0	0	0	0	0	0	0	0	٠	0	0	0	0	0
	CHI'17	S	ΥK	18	UNI	56/44	•	0	0	0	0	0	•	0	0	0	0	0	0	0	0	0	0	0
	WWW'16	Ρ	тw	30K	[P]	-	•	0	•	0	0	0	0	0	0	٠	0	0	0	0	0	0	0	0
	WLSM'16	Ρ	тw	203K	[P]	-	•	0	•	0	0	0	0	0	0	0	0	٠	0	0	0	0	0	0
[25]	J-CHB'15	S	FB	380	CON	52/45	•	0	0	0	0	•	0	0	0	•	0	0	0	0	0	0	0	0
	WLSM'14	P	TW	ALL	[P]	-	•	0	•	•	0	0	0	0	0	0	0	0	0	0	0	0	0	0
[86]	CHI'13	S	TW	1221	AMT	53/46	•	0	0	0	0	0	0	0	•	•	•	•	0	0	0	0	0	0
· ·	HICCS'13	R P	FB	68 2021/		38/62	•	0	0	0	0	0	0	0	•	0	0	•	0	•	0	0	0	0
[3]	CSCW'13 PerCom'12	P S	TW FB	292K 65	[P] UNI	-	-	0	-	0	0	0	0	0	0	-	0	0	0	0	0	0	0	0
[48] [39]	SOUPS'12	s R	FВ	05 260	WEB	62/38 75/25	-	0	-	0	0	-	0	0	-	0	0	-	0	0	0	0	0	0
	SOUPS'12	S	FB	200 569	AMT	64/36	-	0	0	0	0	0	0	0			0			0	0	0	0	0
	CHI'11	E	FB	33	UNI	50/50	-	0	0	0		0	0	0	0	0	0	0	0	0	0	0	0	0
	IFIP-HCI'11	P, S	FB	103	WEB	59/41		0	0	0	•	0	0	0	0	0	0	0	0	0	0	0	0	0
[13]	CHI'10	S	FB	14	UNI	57/43	•	0	0	0	0	ĕ	0	0	ĕ	ĕ	0	0	ĕ	0	0	ĕ	0	0
[44]	UPSEC'8	E	FB	16	UNI	44/56	•	0	0	0	ĕ	0	0	0	0	0	0	0	0	0	0	0	0	ĕ
[23]	PETS'17	S	-	60	AMT	37/63	•	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
[29]	CSCW'17	R	FB	1706	AMT	58/41		0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
[23]	CHI'16	S	-	17	WEB	65/35		0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
[55]	SOUPS'14	R	FB	1239	WEB	24/76	•	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
[94]	JPC'13	P	FB	5076	[P]	-	•	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
	IMC'11	S	FB	200		46/54	•	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0

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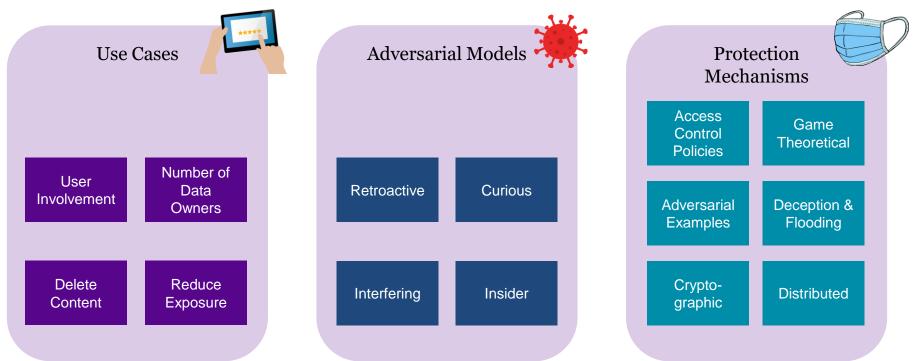
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SYSTEMATIZATION OF TECHNICAL PROPOSALS



SYSTEMATIZATION OF TECHNICAL PROPOSALS

[52] Minaei et al. Lethe: Conceal Content Deletion from Persistent Observers. PETS'19.

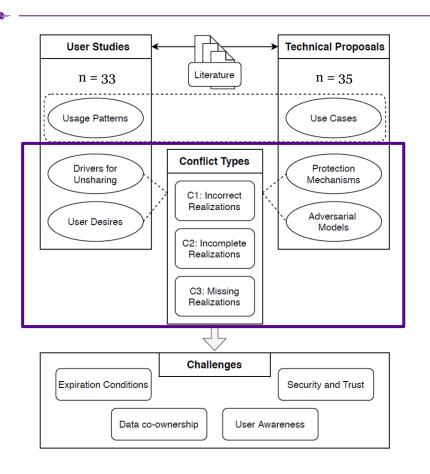
[18] Cao & Yang. Towards Making Systems Forget with Machine Unlearning. S&P'15.

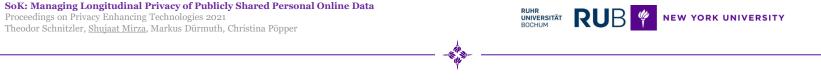
	Publication	Use Cases				A	Adversarial Models					Underlying Protection Mechanisms							
Referen	Venue Venue	Platform	Dek.	Reduce Content	User Expos	≤ Involvente # of D _{ata} O.	Rer	Hone tive	Interst-but-Con	^{LTEring Unious} Insider		Cryptogram	astributed Signa	Dec Sarial F.	Acros & F.	Game Control	Others/Specifical		
[52]	PETS'19	ΤW	0	•	Ρ	1	0	0	•	0	С				0	0	Intermittent withdrawal		
[106]	ForensicSec'19	CL	0	•	Ρ	n	0	•	•	0	•	C		0	•	0	[Attribute-based collaboration]		
[82]	IFIP-SEC'19	PI	•	•	Ρ	1	•	0	0	0	С	С	0	0	0	0	Smart contracts		
[32]	NeurIPS'19	PI	•	0	Ρ	1	•	0	0	0	С	С	0	0	0	0	Quantized k-means		
[66]	NDSS'18	PI	0	٠	А	n	0	٠	٠	0	•	С	•	0	٠	0	Identity management system		
[5]	CODASPY'18	PI	•	0	Ρ	1	0	٠	٠	0	•	•	C	0	0	0	[Time-lock puzzles]		
[38]	CODASPY'17	SN	0	۲	Ρ	n	0	۲	0	•	•	•	C	0	٠	0	[Threshold secret-sharing]		
[65]	ICCV'17	SN	0	٠	Ρ	1	0	٠	٠	0	С	С	•	0	0	٠	[Adversarial Image perturbations]		
[58]	CVPR'17	SN	0	٠	Ρ	1	0	٠	٠	0	С	С	•	0	0	0	[Adversarial Image perturbations]		
[74]	GameSec'17	SN	0	٠	Ρ	n	0	٠	٠	0	С	С	0	0	٠	٠	[Negotiation]		
[104]			•	0	Α	n	0	•	•	•	•	•	C	0	0	0	[Group secret]		
[7]	CCS'16	CL	•	•	A	1	•	•	0	0	•	С	0	0	0	0	Interdependency in encrypted		
[108]	CODASPY'16	PI	•	0	P	1	•	0	0	0	•	•	0	0	0	0	[DNS Caching]		
[95]	TKDE'16 S&P'15	SN	0	•	P P	n 1	0	•	0	0	C	C	-	0	•	0	[Computational conflict resolution]		
[18] [64]	S&P 15 SIGMOD'15	PI PI	•	0	P	1 1	-		-	0	C	C		0	0	0	Machine Unlearning Brain-inspired data retention		
[04]	ACM-SCC'15	CL		0	P	1	0	-	-	0	C	C		0	0	0	Forgetful data structures		
[1]	CCSW'13	CL	0	0	P	1	0	-	-	0	C	C			0	0	Heterogeneous documents		
[15]	NSPW'13	PI	0		A	1	0			•	C	C			0	0	[False attribution]		
[93]	IEEE-PST'13	SN	0	-	A	n	-	-	0	0				0		0	User-to-content relations		
[24]	S&P'12	TW	0		P	1	0			0		C		0	0	0	[Blind RSA signatures]		
[79]	WPES'12	PI	ĕ	õ	P	1	ĕ	•	0	õ		ĕ	0	0	õ	õ	Statistical webpage changes		
[11]	PETS'11	SN	0	•	А	1	0	•	•	0	•	C	0	0	•	0	[OpenPGP]		
[20]	ICNP'11	PI	•	0	Ρ	1	•	0	0	0	•	•	0	0	0	0	[DNS Caching]		
[31]	UW-CSE'11	PI	٠	0	Ρ	1	•	٠	0	0	•	•	0	0	0	0	Integrating diverse mechanisms		
[19]	CollbCom'11	SN	0	•	Ρ	n	0	٠	0	0	С	С	0	0	٠	0	[Aggregation of policies]		
[97]	PETS'10	SN	0	٠	Ρ	n	0	٠	0	0	С	С	0	0	٠	0	[Aggregation of policies]		
[13]	CHI'10	FB	0	٠	А	n	0	0	٠	0	С	С	0	0	٠	0	[Manual conflict resolution]		
[105]	POLICY'10	SN	0	٠	А	n	0	۲	0	0	С	С	0	0	٠	0	[Manual conflict resolution]		
[72]	ACSAC'10	MA	٠	0	Ρ	1	0	0	٠	•	•	С	0	0	0	0	Porter storage		
[30]	USENIX'09	PI	٠	0	Р	1	•	0	0	0	•	•	C	0	0	0	[DHTs of P2P networks]		
[91]	WWW'09	SN	0	•	Р	n	0	٠	0	0	С	С	0	0	٠	•	Auction-based inference		
[47]	CSE'09	SN	0	•	P	1	0	•	•	0	•	С		•	0	0	Third party storage server		
[16]	SecureCom'09	PI	0	•	A	1	0	0	•	•	C	С	_	•	0	0	Bait information		
[70]	SMLI'05	MA	٠	0	Ρ	1	•	0	•	0	•	С	0	0	0	0	[Centralized server storing keys]		

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CONFLICT TYPES

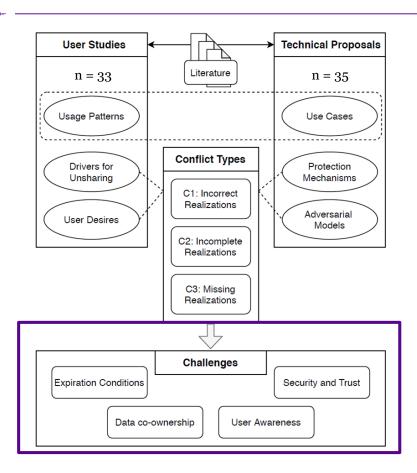
User-centric approach: Reflection of user desires and their drivers for unsharing in technical proposals



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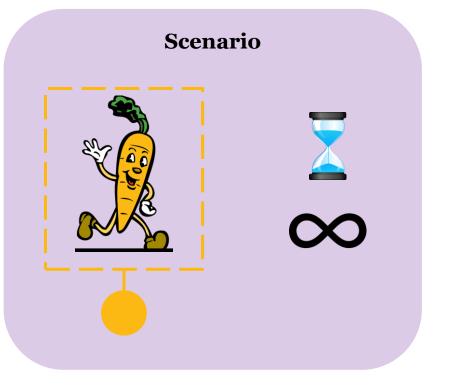


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EXPIRATION CONDITIONS



Time based Expiration

- Lack of flexibility
- Appropriate time for revocation?

Difficult to predict in advance

No Expiration Condition

- Major life events
- Inactivity of the post
- Content's sensitivity could evolve

Flexible, nuanced expiration conditions may be required

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EXPIRATION CONDITIONS

User Studies

- Lack of desire for content to fade away wholesale with age Bauer et al., WPES'13 [9] Khan et al., CHI'18 [41]
- Desire to incorporate interactions of the posts Mondal et al., SOUPS'16 [54]
- Audience related considerations on per post basis Habib et al., CHI'19 [35]

Technical Proposals

- Time passed since publication Reimann et al., WPES'12 [79] Geambasu et al., USENIX'09 [30]
- Interactions with content Zarras et al., CODASPY'16 [108]
- Implemented as an explicit feature

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EXPIRATION CONDITIONS

CHALLENGE

Missing realization of deletion as a context-dependent, implicit feature

 \rightarrow Context-based Expiration

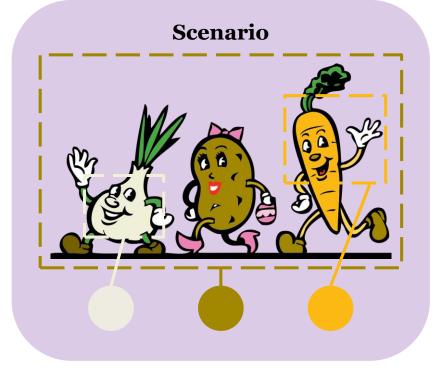
CHALLENGE

Incomplete realization of users' desire to **delete** data for certain **audiences**

 \rightarrow Audience-based Expiration



DATA CO-OWNERSHIP



What can happen?

- People can change their opinion
- Relationships can change

Adaptability of exposure may be required

Who can take action?

- Owner can remove the photo
- Others can remove their references **Power Imbalance** between users



DATA CO-OWNERSHIP

User Studies

- Mitigation strategies
 - O Untagging Dhir et al., J.Comp. Hum. Beh.'16 [25]
 - Not taking photos at all Rashidi et al., SOUPS'18 [77]
 - O Revisiting privacy settings Johnson et al., SOUPS'12 [39] Madejski et al., PERCOM'12 [48]
- Desire to control friends' contents Besmer et al., CHI'10 [13]

Technical Proposals

- Collaborative privacy controls Squicciarini et al., WWW'09 [91] Wishart et al., POLICY'10 [105]
- Voting mechanisms
 Carminati et al., CollaborateCom'11 [19]
 Thomas et al., PETS'10 [97]
- Automated resolution Such et al., TKDE'16 [95]
- Opt-in for exposure Olteanu et al., NDSS'18 [66]

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DATA CO-OWNERSHIP

CHALLENGE

Missing realization of users' desire to control their friends' content wrt. the adaptability of exposure controls

 \rightarrow Adaptability

CHALLENGE

Incorrect realization of users' desire to control their friends' content wrt. power imbalance between users

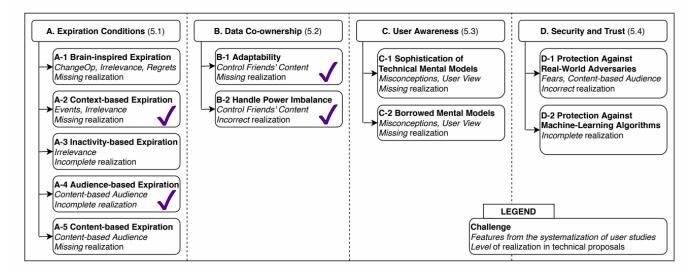
 \rightarrow Handling Power Imbalance

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IN THE PAPER

- More Challenges
 - User Awareness
 - Security and Trust
- Further Issues
 - Metadata
 - Privacy Paradox
 - ✤ ... and more



Theodor Schnitzler^{†*}, Shujaat Mirza[†], Markus Dürmuth, and Christina Pöpper

SoK: Managing Longitudinal Privacy of Publicly Shared Personal Online Data

Author Contact Information

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Key Takeaways

- New Taxonomy for Managing Longitudinal Privacy in Online Social Networks
- Conflicts between User Interaction and Technical Proposals
- Challenges and Open Questions for Future Research on Data Revocation