

Privacy Threat Modeling

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Uber



Introduction



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PhD in Ethics of Technology
(Algorithmic Bias in Personalization)



Technical Privacy Consulting

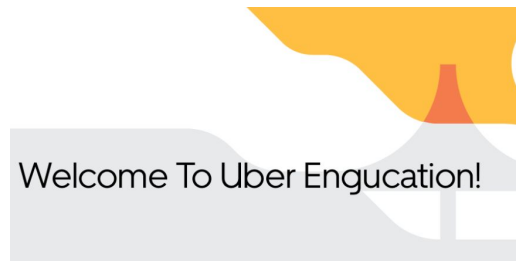
Privacy Reviews



Mitigation Tracking



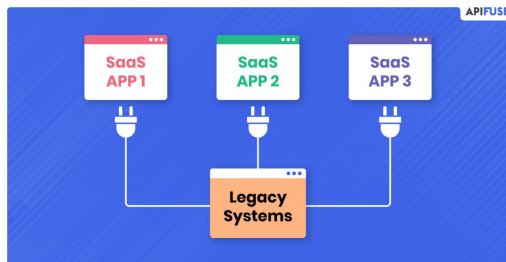
Technical Privacy Trainings



3rd Party Assessments



Legacy Platforms



Guidelines



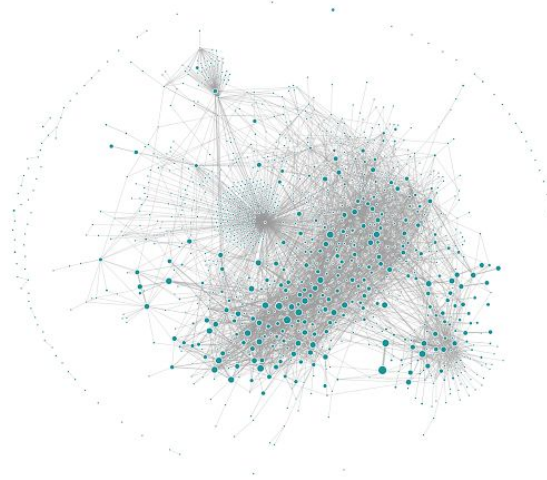
Some Numbers

40+

Reviews of new feature or activity
per week

4000+

Microservices



LINDDUN

LINDDUN

- Most known threat modeling framework
- Some threat domains only applicable in very specific settings (e.g. non-repudiation, linkability)
- Some threats contain very important technical sub-threats that deserve separate categories (e.g. Non-compliance, unawareness)



Linkability



Identifiability



Non-repudiation



Detectability



Disclosure of
information



Unawareness



Non-compliance

Linkability

Be able to link two datasets

LINDDUN Examples:

- Insufficient anonymization
- Profiling
 - Credentials
 - search & session
 - Ip address
 - browsing patterns

Remarks:

- Is this always an undesired property?
Counterexamples:
 - Fraud detection
 - Consent + purpose
 - Transaction data <-> profile
- Linkable to what?
 - Public and future datasets? How do we do the re-identification risk analysis?
- Do we always need anonymity?
 - True anonymity is difficult
 - Alternative: Link on a need to know basis?

Identifiability

Identify a user within a dataset

LINDDUN Examples:

- Insufficient anonymization
 - Quasi identifiers
 - Unique behavior
 - Pseudonyms are re-relinkable
 - credentials

Remarks

- Do we always need anonymity?
- 100% anonymity is not always possible and expensive
- For many cases, identifiability is needed (e.g. KYC, safety, etc.)

Detectability and Non-Repudiation

- User cannot deny being part of a dataset or an action
- User can be detected in a dataset (no access to data itself)

LINDDUN Examples:

- Whistleblower / voting
- Data breach with company email
- Celebrity in a health record
- Address/user already exists
- Person is a user of the service: (adult site, health forum)

Remarks

- Real problem, but applicable in some domains only (health, sexual orientation, race, etc.)
 - E.g. sensitive sub-product
 - Social media site offers dating service

Unawareness

User is not aware of consequences of sharing too much information.

LINDDUN Examples:

- No access to personal data
- Opaque privacy policy (no notice, missing purpose/retention, not informed notice)
- Unfriendly UX
- Default settings not privacy friendly
- Consent
 - Not given
 - Cannot revoke
 - Data not deleted after withdrawal
- Insufficient erasure workflow (scope)
- Insufficient correction workflow

Remarks

- Transparency, control, erasure/correction flows categorized under “Unawareness”
- Erasure/correction flow go beyond unawareness
- User can be aware, but not in control
- Different sub-teams/project deal with these issues, why are they all categorized under “Unawareness” bucket?
- Erasure workflow goes beyond scope and awareness.
- What about other privacy rights (e.g. restriction)?

Non-Compliance

Non-compliant with legislation, regulations and corporate policies or data protection principles

Examples:

- Tampering with the policy data store and consents being effected
- Disproportionate storage/collection
 - not needed, but might be useful
 - collection without purpose
 - too much PII in logs
- Disproportionate processing
 - PII in testing
 - secondary use of access logs,
 - location data for profiling
- Unlawful processing (no legal basis)
- Automated decision making

Remark:

- Many unique challenges are all categorized under Non-compliance
- Typically different teams own these subcategories.
- Misses technical abilities to execute privacy rights, etc.
- Not focused on data lifecycle
- Consent => not always
- Automated decision making => not always

Threat Modeling Based on Data Lifecycle

Collection

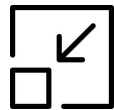
- Insufficient Consent
 - Consent on everything
 - Tampered records
 - No records
 - Consent is not respected (e.g. data not deleted)
 - No refresh
- Inaccurate data imported
- Overcollection
 - Not needed
 - Too granular
 - linkable to internal tables while there is no need
 - Precise information while aggregate is enough
- Data not labeled (cannot be found by internal tools/services)
- Unlawful Processing (collection without purpose or purpose unclear)



AGGREGATION



PSEUDONYMIZATION



SUPPRESSION



PIA



**DATA
TAGGING**



**AUDITABLE
CONSENT**

Storage

- Inappropriate storage
 - Test environment
 - Not secure for sensitive data
- Privacy Rights Technical Capabilities
 - Insufficient scope
 - Insufficient support for deletion, export or restriction
 - Scalability issues
 - Soft deletion capabilities
 - Insufficient anonymization



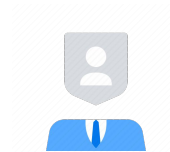
**SECURE
STORAGE**



**SCALABLE PRIVACY
RIGHTS
WORKFLOWS**

Handling

- Secondary use without lawful basis and controls
- Too granular/identifiable (e.g. analytics with identifiable data)
- Insufficient logging
- No correction (data quality)
- Automated decisions
 - Not explainable
 - No human in the loop
 - No correction
 - No legal ground
- Privacy rights
 - Insufficient process
 - Insufficient security protections in data export
 - Export creates risk for other users



PSEUDONYMIZATION



LOGGING



**SCALABLE PRIVACY
RIGHTS
WORKFLOWS**



TRANSPARENCY



**HUMAN
REVIEW**



PIA

Sharing

- Insecure Data Transfer to vendor / 3rd party
 - Insufficient sharing controls
 - Insufficient security or privacy controls at the vendor
 - Insufficient contracts
- Insufficient anonymization
 - Dataset too small
 - Large number of attributes
 - Keys exposed
 - Algorithm can be reversed
 - Quasi identifiers can lead to re-identification
- Data cannot be anonymized, but no controls are in place in 3rd party (TTL, API's for privacy rights propagation, secure storage)



**DATA SHARING
CONTROLS**



ANONYMIZATION



PSEUDONYMIZATION



TIME TO LIVE



PIA



AGREEMENTS



**SECURE
STORAGE**

Deletion (End of Life)

- Inactive users
- Backups restoring deleted data
- Retention policy not implemented in all downstream services, caches, backups, log files, employee devices, snapshots/blobs on cloud
- Too long TTL just in case
- TTL does not map to the retention policy or the retention policy's scope is insufficient
- Soft deletes or insufficient anonymization instead of deletion



**INACTIVE
USER
DELETION**



TIME TO LIVE

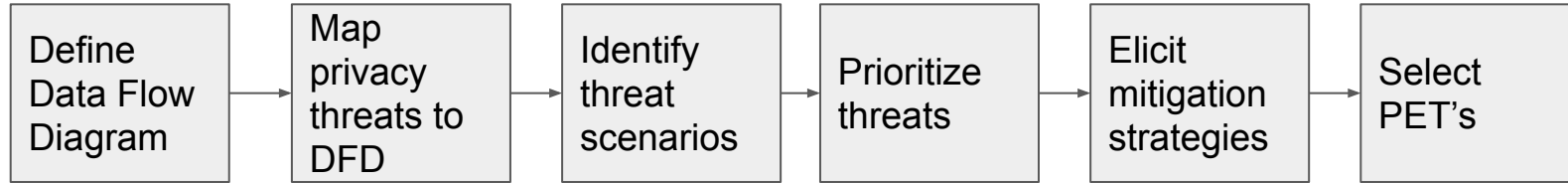


ANONYMIZATION

The Process

1. **Identify the problem**

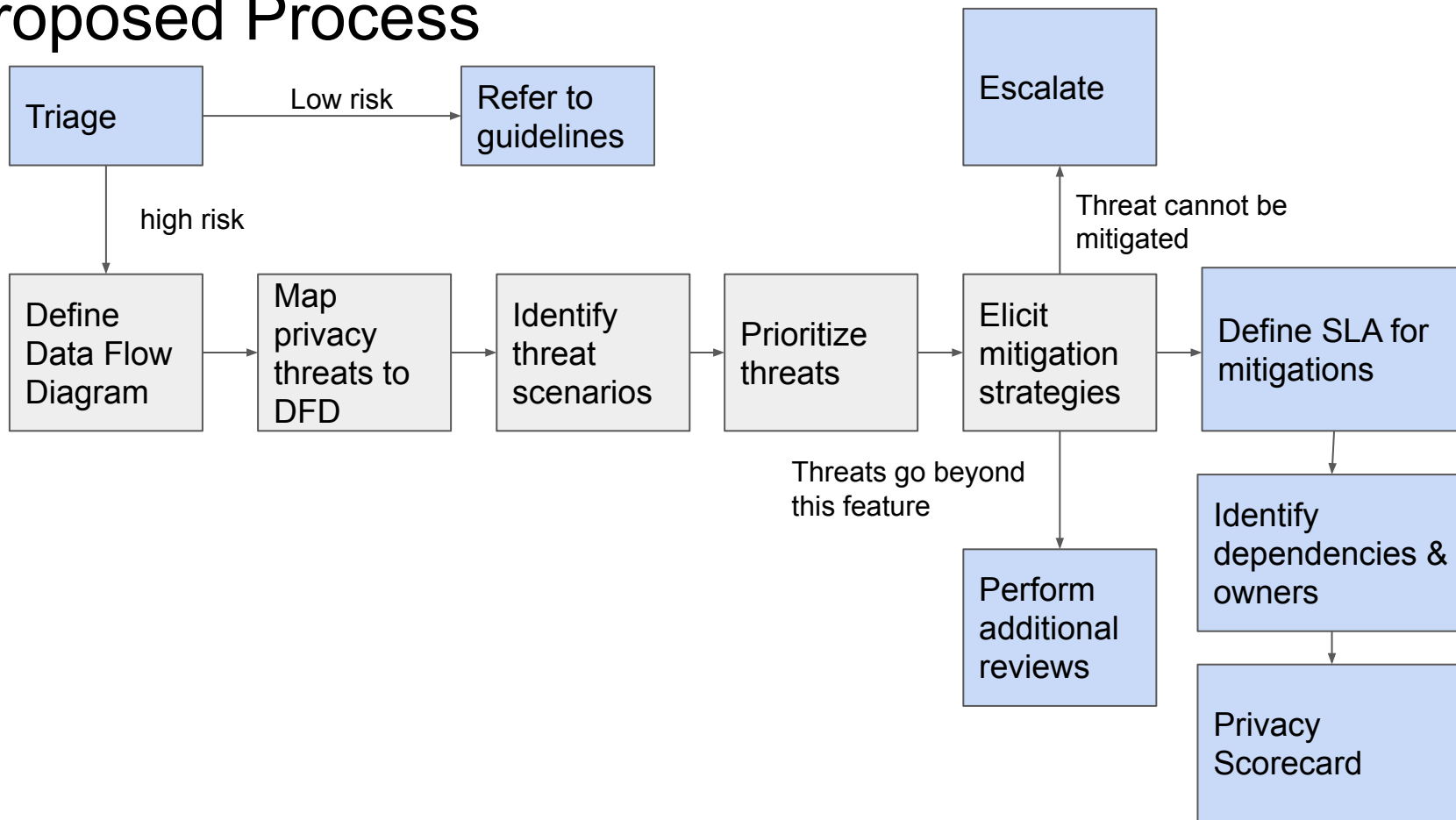
LINDDUN Process



Challenges

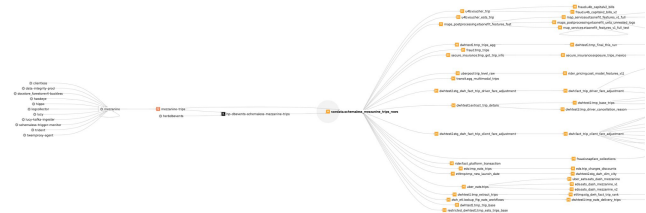
- High number of reviews: cannot follow LINDDUN for all reviews
- Complex data flow diagrams
- The identified threat might go beyond this feature
- Datasets not connected to a previous threat analysis
- Dependencies for mitigations
- No ownership
- What if threat cannot be mitigated?

Proposed Process



Supporting Resources

- Data Lineage



- **Privacy champs**
 - You need experts in specific teams to identify dependencies find optimum controls
- **Privacy Scorecard**
 - You may need to escalate a list of items to org leaders to get buy-in for remediations

Beyond Reviews

- Reviews cannot cover all activities
- Continuous data discovery/tagging is needed
- Future:
 - Connect data classification to CI/CD
 - Privacy policy enforcement engines
 - More review automation
 - See [Privacy is an afterthought in the software lifecycle](#)