

Massachusetts Institute of Technology  
Department of Electrical Engineering and Computer Science

Proposal for Thesis Research in Partial Fulfillment  
of the Requirements for the Degree of  
Doctor of Philosophy

Title: Helping Web Developers Give Users Control Over Their Data

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Date of Submission: February 14, 2023

Expected Date of Completion: May 25, 2024

Laboratory: CSAIL

Brief Statement of the Problem:

Users today have little to no control over the data they give to web applications. They must either avoid using an application, or leave their data susceptible to leaks, e.g., via SQL injections or compromise of other users' accounts. Incentivized by growing public demand and laws such as the GDPR and CCPA [4, 11], developers increasingly need to implement mechanisms to give users control over their data's exposure.

Supervision Agreement:

The program outlined in this proposal is adequate for a PhD thesis. The supplies and facilities required are available, and I am willing to supervise the research and evaluate the thesis report.

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Frans Kaashoek, Charles Piper Professor of EECS  
Malte Schwarzkopf, Professor of Computer Science, Brown University

# Helping Web Developers Give Users Control Over Their Data

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February 14, 2023

## 1 Introduction

The question of who controls personal data, and how it is used, has increasingly surfaced in the web ecosystem. Recent legal developments such as the GDPR and CCPA, as well as growing public demand and news coverage of e.g., data breaches, have increased the need for better user data handling in web applications. This thesis identifies key challenges that web developers face today in implementing better user data controls, and contributes practical systems that can help to give control of user data in web services back to the user. In particular, this thesis introduces a novel system design that allows applications to implement a variety of user data controls while still remaining functional.

## 2 Motivation

Users today have little to no control over the data they give to web applications. They must either avoid using an application, or leave their data susceptible to leaks, e.g., via SQL injections or compromise of other users' accounts. Incentivized by growing public demand and laws such as the GDPR and CCPA [4, 11], developers increasingly need to implement mechanisms to give users control over their data's exposure.

Central to this conversation are two needs: users want to protect their data, and applications require data to be available in order to function. Problems arise when application functionality requires the same data users want to protect: for example, deleting a post may orphan other users' comments on it, crashing the application when it expects comments to have an associated post. Handling this correctly is difficult for developers—naively removing user data can break the application or reduce its functionality.

Removal is also usually permanent, hurting both users and applications: once a user deletes their data, there is no coming back.

Large companies have built systems to help developers get data deletion right [9], but the problem goes beyond data deletion. Users may want to take a break from using an application, but rest easy that their data is protected while they’re inactive; or users may want more fine-grained control—i.e., have their data exist in a state where it is both visible and protected. For example, a user might want to disassociate content with a specific hashtag from a social media account. Because applications today lack support for this, users resort to ad-hoc alternatives like throwaway accounts and “finstas” [22, 31] to post content that is visible but disconnected from the “real” account. This burdens users with managing multiple accounts and requires planning ahead, since moving posts into a throwaway account or reclaiming them is impossible.

These problems call for research into systems that let web application developers provide users with means to manage their data in the gray space where users’ need for data protection and application functionality requirements overlap.

### 3 Background and Related Work

Existing systems for data protection aim to support data deletion, prevent unauthorized data access, or protect against database server compromise. However, none of these systems are explicitly designed to flexibly handle user data (via fine-grained removals or redactions), and to do so without breaking the application. Instead, many of these systems provide orthogonal or partial solutions.

Laws and regulations such as the EU’s General Data Protection Regulation (GDPR) [11], the California Consumer Privacy Act (CCPA) [4], and others [28, 29] give users the right to request deletion of their data from web applications. **Data deletion tools** developed at large organizations, such as DELF at Meta [9], help to correctly delete data in response to such requests. DELF helps developers specify correct deletion policies via annotations on social graph edges and object types, and ensures correct cascading data deletion. However, data deletion systems support only simple deletion, and do not address the entire range of possible user data controls (e.g., temporarily removing old data of inactive users).

**Policy enforcement systems** such as Qapla [18] aim to prevent unauthorized access to data and protect against leakage via compromised, unauthorized accounts or SQL injections. They enforce developer-specified visibility and access control policies via information flow control [8, 12, 14, 26, 32], authorized views [2] or per-user views [17], or blocking or rewriting database queries [18, 21, 33].

**Encrypted storage systems** such as CryptDB [23] and Mylar [24] aim to protect against database server compromise (with some limitations [13]), as well as SQL injection attacks. These systems encrypt data in the database, and ensure that only users with legitimate reasons to view the data (i.e., the owner or an admin) can decrypt the data. Applications handle keys, and send queries either through trusted proxies that decrypt data [23], or move application functionality client-side [24].

Policy-enforcing and encrypted storage systems do not help users redact data, nor maintain application functionality in the face of partially or fully redacted data. Their goal is orthogonal: to protect unauthorized data access via access control mechanisms (encryption or policy checks). These systems also keep data available in the database, thus leaving user data vulnerable to attacks by compromised accounts with authorized access (e.g., an admin).

### 3.1 Other Related Work.

Some systems modify the data layout [27] or use fine-grained information flow tracking [15] to track the ownership and provenance of database rows. This tracks how information propagates and provides information to support wholesale user data deletion. However, these solve orthogonal problems than the one of practical user data controls, and do not support more nuanced redactions such as partial anonymization of shared data.

Sypse [10] pseudonymizes user data and partitions personally-identifying information (PII) from other data. However, Sypse does not securely store (e.g., with encryption) PII, nor modify the actual data stored by the application

Decentralized platforms such as Solid [25], BSTORE [7], Databox [19], and others [1, 5, 6, 16, 20] put data fully and directly under user control, since users store their own data. But this burdens users with maintaining infrastructure, and decentralized platforms lack the capacity for server-side compute and break today’s ad-based business model.

Some platforms can prove that server-side processing respects user-defined data policies via cryptographic means [3] or systems security mechanisms [30]. This may restrict feasible application functionality (e.g., to additively homomorphic functions), or restrict combining data with different policies.

## 4 Approach

We start by building Edna, a library that integrates with web applications and provides abstractions that let developers specify not just wholesale removal of data, but also flexible redaction or decorrelation of data. Edna then changes the database contents in well-defined ways that avoid breaking the application. Developers and users both benefit from Edna: applications can expose and advertise new privacy-protection features and reduce their exposure in the event of a data breach, while users gain more control over their sealed data, including the convenience of returning to the application as if their data had been there all along.

We then propose Hydra, a library that enables web applications to provide their users inbuilt for splintering and merging their web identities within the application. With Hydra, applications can let users decorrelate data to context-specific identities (e.g., for work or for family), easily move their data between identities, spin off new identities when necessary, and merge identities if desired. Import-

tantly, only the user can determine which web application identities are linked to themselves. Hydra explores the result of taking application-supported data decorrelation to the extreme, while preserving application functionality and protecting correlations between data and users. Applications both retain (decorrelated) data for e.g., analytical or advertising purposes, while users gain security and control over what data is linked to which of their web application identities.

Users today give web applications their data but have little control over how these applications store and protect this data. Giving users control is challenging for developers, as application functionality sometimes requires the very same data that users want to protect.

Edna is a library that lets web application developers give users flexible and correct control over their data’s exposure without breaking the application. Edna introduces *sealing*, which removes or redacts some or all of a user’s data, and *revealing*, which restores the sealed data at a user’s request. Sealed data remains on the server, but is encrypted and inaccessible to the web application. Sealing changes the database contents and replaces the data to seal with placeholder values where necessary (e.g., comments require an associated post).

We designed Edna’s seal and reveal abstractions to flexibly meet applications’ diverse needs while still protecting sensitive user data. Edna provides developers with three well-defined primitives for anonymizing data: remove, modify, and decorrelate. Developers compose these to create *seal specifications*, which describe the data to seal and which primitives to apply. When invoked with a seal specification, Edna changes the database contents as specified: “remove” drops rows, “modify” changes the contents of specific cells, and “decorrelate” introduces *pseudoprincipals*, anonymous placeholder users. These pseudoprincipals help maintain referential integrity, but also can act as built-in “throwaway accounts.” Rather than users having to create and maintain throwaways themselves, Edna’s pseudoprincipals enable the user to later reassociate with their throwaway’s data via revealing, or create throwaways to disown posts after-the-fact.

We implemented a prototype of Edna, and evaluated it with three real-world web applications: Lobsters, a discussion forum; HotCRP, a conference review system; and WebSubmit, a homework submission application. Integrating Edna into these applications required minor code changes. For example, supporting three types of sealing in the 160k-LoC Lobsters application required adding 697 LoC. The modified applications retained their expected semantics and functionality. Edna’s sealing and revealing performance depends on the amount of data affected, but they generally complete in seconds and have a small effect on the performance of concurrent operations.

In this thesis, I will discuss Edna’s relationship to prior research, its limitations, and the following contributions:

1. A new paradigm for developers to provide flexible user control over data in web applications, with cryptographic protection and while maintaining application functionality and invariants.
2. Abstractions for sealing and revealing, and a small set of data-anonymizing primitives (remove, modify, decorrelate) that cover a wide range of application needs and compose cleanly.

3. The design and implementation of Edna, our prototype library that implements user data control via sealing and revealing, as well as Ednacrypt, which additionally encrypts unsealed data.
4. Case studies of integrating Edna with three real-world web applications, an evaluation of Edna’s effectiveness, performance, and security, and a comparison to Qapla.

## 5 Hydra

Hydra narrows down on a specific aspect of Edna, namely how users control their identities and links between their identities and data in web applications. Users today will manually implement ad-hoc alternatives like throwaway accounts and “finstas” [22, 31] to post content that is visible but disconnected from the “real” account.

Hydra provides a library that enables web applications to provide their users inbuilt for splintering and merging their web identities within the application. With Hydra, applications can let users decorrelate data to context-specific identities (e.g., for work or for family), easily move their data between identities, spin off new identities when necessary, and merge identities if desired. Importantly, only the user can determine which web application identities are linked to themselves. Hydra explores the result of taking application-supported data decorrelation to the extreme, while preserving application functionality and protecting correlations between data and users. Applications both retain (decorrelated) data for e.g., analytical or advertising purposes, while users gain security and control over what data is linked to which of their web application identities.

## 6 Contributions

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## 8 Timeline

- **Spring 2023:**
  - Focused work on Funhouse to bring it to paper-ready status.
  - Prepare a conference-ready paper and talk on Edna.
  - Complete the RQE using an Edna talk.
  - Complete the thesis proposal (this document).
- **Summer 2023:**
  - Focused work on Funhouse, or potential internship.
  - Potential conference presentation of Edna.
  - Potential workshop presentation of Funhouse HotOS.
- **Fall 2023:**
  - Funhouse conference submission if ready.
  - Prepare job talk materials (Funhouse or Edna).



- TA (OS or systems security)
- **Spring 2024:**
  - Finalize last Edna-related thesis research (Hydra).
  - Finalize Funhouse contributions for thesis, if any.
  - Write and defend thesis.

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