Model-driven Privacy







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GDPR sum of fines and penalties



Model-driven Privacy (ETH Zürich)

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Privacy requirements

Source of requirements:

- Privacy regulations: GDPR, CCPA, DCIA, PIPL
- User preferences and concerns
- Self-imposed organization policies
- Risk-based scenarios and best practices

Common requirements:

- Purpose limitation
- Data subject consent
- Right to rectification, erasure, and restriction
- Data minimization
- Storage limitation

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- Risk-based scenarios and be

Common requirements:

- Purpose limitation
- Data subject consent
- Right to rectification, erasu
- Data minimization
- Storage limitation

Art. 5 GDPR Principles relating to processing of personal data

- . Personal data shall be:
 - (a) processed lawfully, fairly and in a transparent manner in relation to the data subject ('lawfulness, fairness and transparency');
 - (b) collected for specified, explicit and legitimate purposes and not further processed in a manner that is incompatible with those purposes; further processing for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes shall, in accordance with Article 89(1), not be considered to be incompatible with the initial purposes (purpose limitation?);
 - (c) adequate, relevant and limited to what is necessary in relation to the purposes for which they are processed ('data minimisation');

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Personal data shall be collected for specified, explicit and legitimate purposes and not further processed in a manner that is incompatible with those purposes.

('Purpose limitation') — Art. 5 §1 (b)

Processing shall be lawful only if the data subject has given consent to the processing of his or her personal data for one or more specific purposes.

('Data subject consent') — Art. 7 §1

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Current challenges



Specification: Absence of effective languages and tools.

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Current challenges



Specification: Absence of effective languages and tools.



Implementation: Ad hoc, no guarantee of correctness.

Current challenges



Specification: Absence of effective languages and tools.



Implementation: Ad hoc, no guarantee of correctness.



Evolution/Maintenance: error prone and time consuming.

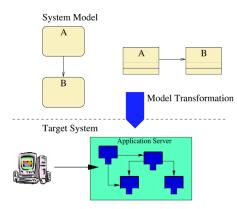
Our solution: Model-driven development



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Model-driven Development

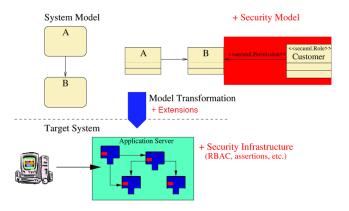


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Model-driven Security

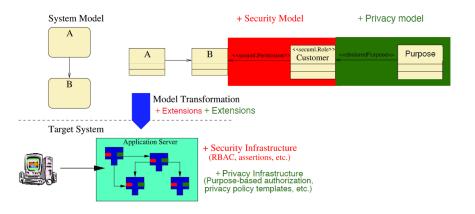
Lodderstedt et al. have specialized a new model-driven development methodology that supports **security**.



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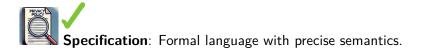
Model-driven Security and Privacy

Our work: purpose limitation and data subject consent requirements



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using Model-driven Privacy



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using Model-driven Privacy



Specification: Formal language with precise semantics.

Code generation: Cross-cutting, correct by design.

using Model-driven Privacy



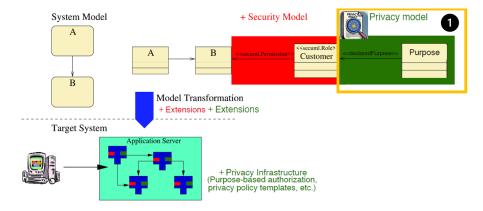
Specification: Formal language with precise semantics.

Code generation: Cross-cutting, correct by design.



Evolution: Change model(s), regenerate code.

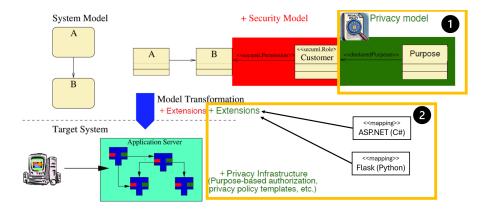
Main contribution



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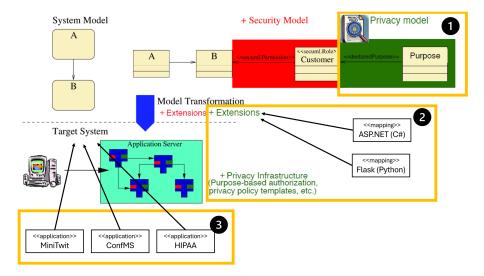
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Main contribution



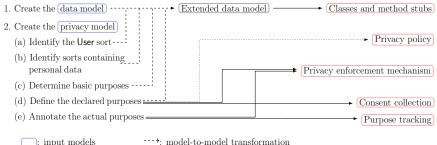
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Main contribution



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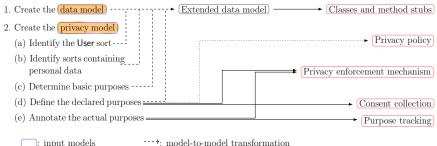
Methodology



- ---->: model-to-model transformation
 - \longrightarrow : model-to-code transformation
- intermediate artifacts : output artifacts

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Methodology



- ---->: model-to-model transformation
- intermediate artifacts \longrightarrow : model-to-code transformation
- : output artifacts

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Conference Management System – Data model

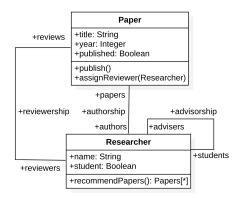


Figure: Data model (UML class diagram)

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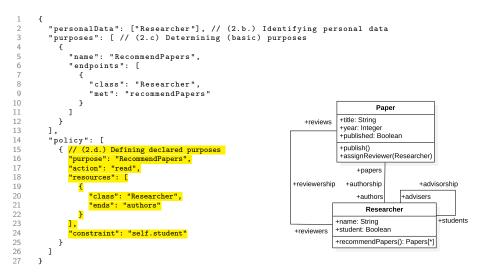
Conference Management System – Privacy model

```
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 2
         "personalData": ["Researcher"], // (2.b.) Identifying personal data
 3
         "purposes": [
 4
            Ł
              "name": "RecommendPapers",
              "endpoints": [
 7
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 8
                   "class": "Researcher".
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                   "met": "recommendPapers"
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                                                                                            Paper
              1
                                                                                   +title: String
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            }
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                                                                                   +vear: Integer
         1.
                                                                                   +published: Boolean
14
         "policy": [
                                                                                   +publish()
                                                                                   +assignReviewer(Researcher)
              "purpose": "RecommendPapers".
              "action": "read",
                                                                                        +papers
18
              "resources": [
                                                                       +reviewership
                                                                                     +authorship
                                                                                                       +advisorship
19
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                   "class": "Researcher",
                                                                                       +authors
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                   "ends": "authors"
                                                                                          Researcher
                 }
                                                                                                             +students
                                                                                  +name: String
23
              1.
                                                                                  +student: Boolean
                                                                        +reviewers
24
              "constraint": "self.student"
25
           }
                                                                                  +recommendPapers(): Papers[*]
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```

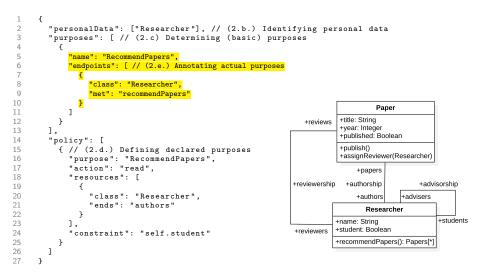
Conference Management System – Privacy model

```
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         "personalData": ["Researcher"], // (2.b.) Identifying personal data
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        "purposes": [ // (2.c) Determining (basic) purposes
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              "name": "RecommendPapers".
              "endpoints": [
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                   "class": "Researcher",
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                   "met": "recommendPapers"
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              1
                                                                                  +title: String
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           }
                                                                         +reviews
                                                                                  +vear: Integer
         1.
                                                                                  +published: Boolean
14
         "policy": [
                                                                                  +publish()
                                                                                  +assignReviewer(Researcher)
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              "purpose": "RecommendPapers".
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              "action": "read",
                                                                                      +papers
              "resources": [
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                                                                      +reviewership
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                   "class": "Researcher",
                                                                                      +authors
                                                                                                 +advisers
                   "ends": "authors"
                                                                                         Researcher
                }
                                                                                 +name: String
                                                                                                           +students
23
              1.
                                                                                 +student: Boolean
                                                                      +reviewers
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              "constraint": "self.student"
25
           }
                                                                                 +recommendPapers(): Papers[*]
26
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```

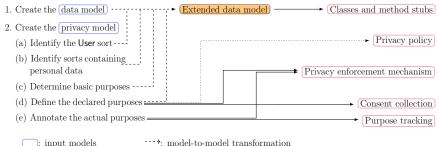
Conference Management System - Privacy model



Conference Management System - Privacy model



Methodology



- ---->: model-to-model transformation
- intermediate artifacts \longrightarrow : model-to-code transformation
- : output artifacts

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Conference Management System – Extended data model

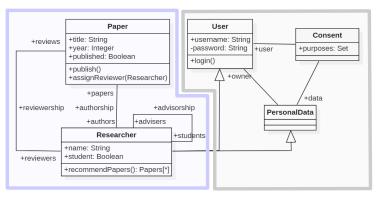
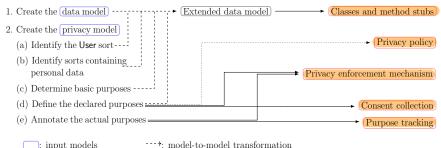


Figure: Data model (extended with privacy classes)

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Methodology



- ---->: model-to-model transformation
- intermediate artifacts \longrightarrow : model-to-code transformation
- : output artifacts

Image: A (1)

Conference Management System – Generated artifacts

• Methods are generated as empty stubs annotated with their purposes.

```
1 @label(['RecommendPapers']) // Actual purpose annotation
2 def recommendPapers():
3 // TOD0: Implement method stub
```

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Conference Management System – Generated artifacts

• Privacy notice is generated automatically.

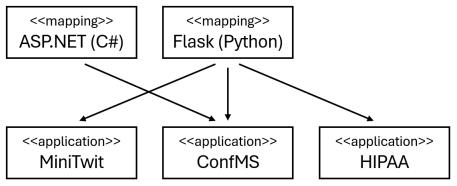
Declared purposes	
Policy	Action
We use fields ['authors', 'name', 'advisers', 'reviews'] of your Researcher personal data for the purpose of AssignReviewer if true	Allow
We use fields ['name'] of your Researcher personal data for the purpose of PublishPaper if true	Revoke
We use fields ['authors', 'name'] of your Researcher personal data for the purpose of RecommendPapers if you are a student	Allow

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Implementation

Model transformations:



Case study applications:

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Evaluation (Selected¹) Research questions

Development effort

How much developer effort is required to use our approach?

Performance overhead

How much runtime overhead does our approach incur?



\bullet Set up: Define models \rightarrow Generate code \rightarrow Implement methods.

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- $\bullet~$ Set up: Define models \rightarrow Generate code \rightarrow Implement methods.
- Define models:
 - 13 LoC (data model)
 - 20 LoC (security + privacy model).



- $\bullet~$ Set up: Define models \rightarrow Generate code \rightarrow Implement methods.
- Define models:
 - 13 LoC (data model)
 - 20 LoC (security + privacy model).
- Generate code:
 - ▶ 1954 LoC (C#)
 - 731 LoC (Python)

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- $\bullet~$ Set up: Define models $\rightarrow~$ Generate code $\rightarrow~$ Implement methods.
- Define models:
 - 13 LoC (data model)
 - 20 LoC (security + privacy model).
- Generate code:
 - ▶ 1954 LoC (C#)
 - 731 LoC (Python)
- Implement methods:
 - ▶ 344 LoC (C#)
 - 142 LoC (Python)

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- Set up: Define models \rightarrow Generate code \rightarrow Implement methods.
- Specification: 33 LoC
- Implementation:
 - ▶ 2298 LoC (C#, 85% generated)
 - 873 LoC (Python, 84% generated)

Developers need to implement only 15-16% of the overall codebase.



• open-source, unsecured application (baseline)

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- open-source, unsecured application (baseline)
 - manually implement privacy checks (secured)

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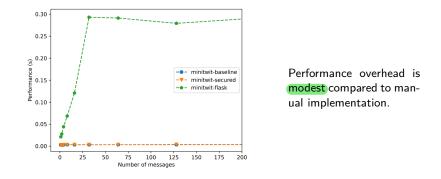


- open-source, unsecured application (baseline)
 - manually implement privacy checks (secured)
 - implement application our approach (flask)

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- open-source, unsecured application (baseline)
 - manually implement privacy checks (secured)
 - implement application our approach (flask)
- execute public_timeline() endpoint (pagination for 30 messages).



Future Work

• extend to other class of privacy requirements.

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Future Work

- extend to other class of privacy requirements.
- proving the correctness of the transformation.

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Future Work

- extend to other class of privacy requirements.
- proving the correctness of the transformation.
- conduct a user (i.e., developer) case study.

Questions?



"Before I write my name on the board, I'll need to know how you're planning to use that data."

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