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```
Je tiens à remercier
I would like to thank. my parents..
J'adresse également toute ma reconnaissance à ....
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# INTRODUCTION

### 1.1 Context and Motivation

Software systems are increasingly growing in complexity, which leads to a substantial burden in terms of maintenance, often resulting in a high cost that may surpass the cost of software development itself [1]. Since Object Management Group (OMG) has introduced Model driven Engineering in 2001 [2], MDE has been prominent in developing and maintaining large-scale and embedded systems while increasing the developers' productivity. By adopting MDE, industry can reduce time (development time and time-tomarket), costs (development, integration, and reconfiguration), and improve sustainability and international competitiveness. In MDE, metamodel is a central artifact for building software languages [3]. It specifies the domain concepts, their properties, and the relationship between them. A metamodel is the cornerstone to generate model instances, constraints, transformations, and code when building the necessary language tooling, e.g. editor, checker, compiler, data access layers, etc. In particular, metamodels are used as inputs for complex code generators that leverage on the abstract concepts defined in metamodels. The generated code API is used for creating, loading and manipulating the model instances, adapters, serialization facilities, and an editor, all from the metamodel elements. This generated code is further enriched by developers to offer additional functionalities and tooling, such as validation, transformation, simulation, or debugging. For instance, UML <sup>1</sup> and BPMN <sup>2</sup> Eclipse implementations rely on the UML and BPMN metamodels to generate their corresponding code API before building around it all their tooling and services in the additional code.

<sup>1.</sup> https://www.eclipse.org/modeling/mdt/downloads/?project=um12

<sup>2.</sup> https://www.eclipse.org/bpmn2-modeler/

# 1.2 Challenges

# C1: Resolve the impact of the metamodel evolution on the code automatically

One of the foremost challenges to deal with in MDE is the impact of the evolution of metamodels on its dependent artifacts. We focus on the impact of metamodels' evolution on the code. Indeed, when a metamodel evolves and the code API is regenerated again, the additional code implemented by developers can be impacted. As a consequence, this additional code must be co-evolved accordingly.

However, manual co-evolution can be tedious, error-prone, and time-consuming. Therefore, experts tried through last decades to find more sophistic solutions to tackle the problem of co-evolution when metamodels evolve. This interest covered almost all the artifacts in MDE ecosystem not only the code, and many solutions were proposed, inter alia, raising the automation degree of the co-evolution. Note that other aspects treated in co-evolution problem like optimization and evolution resilience. The co-evolution challenge has been extensively addressed in *MDE*. In particular, [4]–[9] focused on consistency checking between models and code, but not its co-evolution. Other works [10], [11] proposed to co-evolve the code. However, the former handles only the generated code API, it does not handle additional code and aims to maintain bidirectional traceability between the model and the code API. The latter supports a semi-automatic co-evolution requiring developers' intervention. Moreover, it does not use any validation process to check the correctness of the co-evolution and with no comparison to a baseline. In this thesis, we tackle the challenge of resolving the impact of the metamodel evolution on the code automatically followed by checking the correctness of the co-evolution.

## C2: Behavioral correctness of the metamodel and code co-evolution

In literature, when the problem of metamodel and code co-evolution is addressed, the challenge of checking that the co-evolution impacted or not the behavioral correctness of the code is not handled. In any Model-driven Engineered system, the elements of the metamodel are used in the code. The evolution of the metamodel will be propagated in the code that is co-evolved and its behavior may be altered. Hence, the importance of checking the correctness of the co-evolution. In a larger scope, only few works were dedicated to check the correctness of a code evolution in general. Ge et al. [12] propose to

verify the correctness of refactoring. Out of the scope of testing code evolution, we find the incremental test selection approaches Infinitest<sup>3</sup>, EKSTAZI [13], and Moose [14]. All of Infinitest, EKSTAZI and Moose aim to analyze code changes incrementally to select impacted tests in the evolved version of the code only.

# C3: How to draw benefit from LLMs for the metamodel and code co-evolution

In the MDE ecosystem, we can consider that metamodel and code co-evolution is one of many other MDE tasks like for example Model generation and code generation. Since their appearance, LLMs have been applied in different domains of scientific research, such as Software Engineering and Model-Driven Engineering (MDE), however, to the best of our knowledge, the challenge of exploring LLMs in the task of metamodel and code co-evolution is never addressed. In Software Engineering side, Fu et al. [15] evaluated ChatGPT ability to detect, classify, and repair vulnerable code. Kabir et al. [16] evaluated ChatGPT ability to generate code and to maintain it by improving it based on a new feature description to add in the code. Zhang et al. [17] proposed Codeditor, an LLM based tool for code co-evolution between different programming languages. It learns code evolutions as edit sequences and then uses LLMs for multilingual translation. Moreover, other studies focused on evaluating LLMs in MDE activities. Chen et al. [18] and Camara et al. [19] used Chatgpt to generate models. Chaaben et al. [20] showed how using few-shot learning with GTP3 model can be effective in model completion and in other modeling activities.

## 1.3 Contributions

To tackle these three challenges, we propose three contributions:

→ First, we propose a fully automatic code co-evolution approach due to metamodel evolution based on pattern matching. Our approach handles both atomic and complex changes of the metamodel. This approach is evaluated, on nine Eclipse projects from OCL, Modisco, and Papyrus, based on four actions: 1) Measuring the coevolution correctness using automatically generated unit tests. 2) Verifying the behavioral correctness using unit tests running before and after automatic code

<sup>3.</sup> https://infinitest.github.io/doc/eclipse

- co-evolution. 3) Comparison with the state-of-the art semi-automatic co-evolution approach [11]. 4) Comparison with Quick Fixes popular tool. The prototype implementation of an Eclipse plugin is available online (link). Results show that our approach reached an average of 82% of precision and 81% of recall, varying from 48% to 100% for precision and recall respectively.
- → Second, we propose an approach that assist developers to check the behavioral correctness of the co-evolution. This approach leverages unit tests before and after the co-evolution and gives visual report about passing, failing, and erroneous tests before and after the co-evolution. This visual report allow to have more insights about the co-evolution ans its impact on the code. We then evaluated our approach on 18 Eclipse projects from OCL, Modisco, Papyrus, and EMF using both automatically generated and manually written tests. When we studied the usefulness of our approach quantitatively, we found 88% of reduction in the number of tests and 84% in execution time. The prototype implementation of an Eclipse plugin is available online (link). The other part of the evaluation consisted of an user study experiment to gain evidence on the difficulty of the manual task of tracing impacted tests after metamodel evolution and co-evolution.
- → Third, we investigate the ability of LLMs in giving correct co-evolutions in the context of metamodel and code co-evolution. The prototype of implementation of an Eclipse plugin is available online (link). We evaluated our study approach with Chat-GPT version 3.5 on seven Eclipse projects from OCL and Modisco evolved metamodels. the evaluation included temperature variation, prompt structure variation, and comparison with IDE Quick Fixes as baseline. Results show that ChatGPT can co-evolve correctly 88.7% of the errors, varying from 75% to 100% of correctness rate. When varying the prompts, we observed increased correctness in two variants and decreased correctness in another variant. We also observed that varying the temperature hyperparameter yields better results with lower temperatures. Finally, we found that the generated prompts co-evolutions completely outperform the quick fixes.

## 1.4 Outline of the thesis

This manuscript is organised as follows:

- Chapter 2 provides a short background about our MDE context and main concepts that will be employed throughout the thesis.
- Chapter 3 focuses on a review of relevant studies carried out within Metamodel change detection, co-evolution in MDE ecosystem, API-client evolution, language evolution, and evolution in low-code platforms. This chapter ends with a discussion about limitations and research gap.
- Chapter 4 is devoted to our first contribution about the automatic code co-evolution approach du to metamodel evolution. It presents the algorithm of pattern matching process that selects the appropriate resolution for each error. It presents also its evaluation and results.
- Chapter 5 presents our second contribution about leveraging unit tests to check metamodel and code co-evolution behavioral correctness with its evaluation including the user experience that we conducted and results.
- Chapter 6 details the empirical study that we conducted as last contribution about exploring LLMs in metamodel and code co-evolution context, with its evaluation and results.
- Chapter 7 summarises the contributions of this work and discusses its limitations and potential avenues for future work, thereby concluding this thesis.

# **BACKGROUND**

In this chapter, we introduce the field of Model-Driven engineering. In section ?, we present the activity of metamodeling and the involved artifacts. Section ? discusses the automation task related to the artifacts presented in section ?. We finish this chapter with a presentation of the evolution concept in the context of model driven engineering.

# 2.1 Model-Driven Engineering

To develop a software, a list of specifications is given to the developers, to code the final product. This approach can work in the case of small projects. When the complexity of the software increases, more efficient approaches must be adopted. Model driven engineering has proven its efficiency comparing to other engineering disciplines [21].

Model-Driven Engineering (MDE) is the systematic use of models as primary artifacts during a software engineering process. MDE includes various model-driven approaches to software development, including model-driven architecture, domain-specific modeling and model-integrated computing [22]. The first appearance of MDE like approaches started in the 80's [23]. MDE is still adopted and a lot of work is being done in academia and industry, refs.

The goal of MDE is to improve productivity, quality, and maintainability by leveraging high level abstractions throughout the development process. The metamodeling phase implied the experts of the domain who focus on the major key aspects of the problem rather than being concerned about the underlying programming language and the implementation.

The metamodel represent the main artifact in MDE. There are many definitions of the concept "metamodel" that can be found in literature [24]:

A metamodel describes concepts that can be used for modeling the model (i.e. in the instances of the metamodel).

Metamodels are models that make statements about modeling. More precisely, a metamodel describes the possible structure of models in an abstract way, it defines the constructs of a modeling language and their relationships, as well as constraints and modeling rules, but not the concrete syntax of the language.

A metamodel defines the abstract syntax and the static semantics of a modeling language, Vice versa, each formal language, such as Java or UML, possesses a metamodel.

Seidewitz [25] gives another commonly used definition of *metamodels* in MDE. A metamodel is a specification model for a class of systems under study where each system under study in the class is itself a valid model expressed in a certain modeling language.

## 2.2 Metamodeling

*Metamodeling* is the process of metamodel creation. Metamodeling is done thanks to metamodeling languages (that is in turn described by a meta-metamodel).

Metamodeling must gather the whole knowledge that is required to define, precise, and deal with MDE challenges in its different tasks [26]:

- The construction of metamodel describes the abstract syntax of target (software languages, solution system).
- Model validation: models are validated against the constraints defined in the metamodel.
- Model-to-model transformations: such transformations are defined as mapping rules between two metamodels.
- Code generation: the generation templates refer to the metamodel of the "system".
- Tool integration: based on the metamodel, modeling tools can be adapted to the respective domain.

In the context of Domain-Specific Language, DSMLs can be tailored via metamodeling to precisely match the domain's semantics and syntax. The concrete syntax that is, the concrete form of the textual or graphical constructs with which the modeling is done must represent the metamodel in an unambiguous way. Having graphic elements that linked directly to a familiar domain makes it easier to learn and allows domain experts to contribute, such as system engineers and experienced software architects, ensure that software systems meet user needs [27]. The metamodel is the basis for the automated, tool-supported processing of Metamodeling models. On the other hand, a suitable concrete

syntax is the interface to the modeler and its quality decides what degree of readability the models have **empty citation** 

// Add figure?

Metamodeling languages are classfied into two categories languistic and ontological [28]. Linguistic metamodeling represents way for defining modeling languages and their primitives (e.g., Object, Class, MetaClass) on the layer of a metamodel. Ontological metamodeling aims to represent domain knowledge accurately, it is s concerned with semantics and meaning, ex: OWL **empty citation** Linguistic metamodeling aims to define a language for creating models. it is concerned with syntax and structure. We can use a different classfication by purpose: General Purpose Modeling Languages and Domain-Specific Modeling Languages [29]. General purpose modeling languages as for example: UML and its variants, generic metamodeling frameworks, such as MOF **empty citation** and Ecore **empty citation** As examples of DSLs, we cite sysML and EXPRESS DSL.

In MDE, there are language workbenches that are used for language creation, such as Xtext, MetaEdit+.

Metamodel is the backbone in model driven engineering. In the language modeling ecosystem, other artifacts are created by the mean of the metamodel. By definition, the model is an instance of a metamodel, which mean that the metamodel defines the concepts with which a model can be created. Constraints are written in Object Constraint Language. The created models can be validated through a set of constraints to check the models' correctness. They precise specifications on the model that cannot be expressed by diagrammatic notation. In order to safe effort and avoid errors, models transformation is one of the common automated tasks in Model-driven engineering. Model transformation are expressed in Transformation Languages for example, ATL). A transformation consists of a set of rules that map the source metamodel elements to the metamodel target's elements.

// Add example of Metamodel+ model+constraint+transformation ?

## 2.3 Automation in the MDE ecosystem

Brief description about approaches that allow automated tasks in MDE.

#### Code Generation

One of the most important advantages of MDE, is the automation in many of its activities. The code generation activity is recurrent, and its automation enhances the

productivity and the cost. For example, Eclipse Modeling Framework built-in code generator allows to generated a java API from an Ecore metamodel. The generated code API structure and technical choices are done to fit Java programming language and model driven engineering abstraction standards/principles (ex: each metaclass is used to generate an interface and concrete implementation class that extends the generated interface, pattern observer), to have an efficient as possible. @generated annotation is used to mark generated interfaces, classes, methods, and fields.

In Eclipse Modeling Framework, two model resources (files) are manipulated: the .ecore file that contains xmli serialization of the E core model and the .genmodel for the serialized generator model.

## 2.4 Evolution in the MDE context

During the software development process, software artifacts are meant to be changed, due to many reasons: client requirements and domain specification, software maintenance or bug correction. Like any other software system, modeling languages are the subject of an inevitable evolution, during their process of building, multiple versions are developed, tested, and adapted until a stable version is reached.

Different types of evolution are categorized depending on the impact and purpose of the applied modifications [30], [31]:

- Corrective: aims to correct discovered problems and inconsistencies such as processing failures, performance failures, or implementation failures by applying a set of reactive modifications of a software product.
- Adaptive: in case of changing environment, such as changes in data environment or processing environment, this evolution aims to keep a software product usable.
- Perfective: this evolution aims to improve functionalities, enhance the performance, reliability, or to increase the maintainability of a software.

The term *Evolution* can be refined as the literature presents various related terms like: Maintenance, Refactoring, and **Co-evolution**, which are different types of modifications that could be applied on a software.

//Why we need to perform evolution? Answer to requirment changing, and technological progress: examples?

Evolution: when users and developers get by learning new requirements that lead to adapt the software to new changes **empty citation** 

Maintenance: It is modifying a software product after delivery to correct faults, to improve performance, or to adapt the product to a changing environment **empty citation** 

Refactoring: It is an oriented object term, that means modifications of software to make it easier to understand and to change or to make it less susceptible to errors when future changes are introduced **empty citation** 

co-evolution: It consists of the process of adapting and correcting a set of artifacts  $A_1$ ,  $A_2$ , ... $A_N$  in response to the evolution of an artifact B on which  $A_1$ ,  $A_2$ , ... $A_N$  strongly depend **empty citation** for example the co-evolution of models with the evolving metamodel.

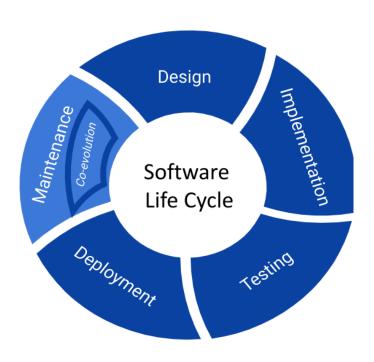


Figure 2.1 – Software Life Cycle

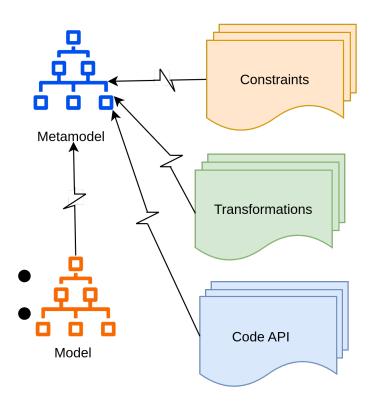


Figure 2.2 – MDE Ecosystem

# STATE OF THE ART

In this chapter, we present an overview of what has been done in the field of code co-evolution in the context of Model-Driven Engineering. We split this overview into? parts. In section?, we present the metamodel change detection approaches. Section? presents the co-evolution of model, transformations, constraints with evolving metamodel. In section?, we discuss code co-evolution and relevant literature about API-client evolution, language evolution, and evolution in low-code platforms. We finish this chapter with a discussion focused on limitations and research gap.

## 3.1 Metamodel change detection

One of the intrinsic properties of software artifacts is its continuous evolution [32]. Like any software artifact, metamodels are meant to evolve to meet the represented domain. In this thesis, our context is triggered by the metamodel evolution, that's why we find essential to understand this evolution in detail. A lot of work has been done on metamodel diffing. Detection approaches can be classified into two main categories; online <sup>1</sup> detection approaches, and offline <sup>2</sup> detection approaches. Thid classification can be refined using some factors: automation degree, types of detected changes, considered issues (overlap, indefinit length, hidden changes, order of changes, and undo operations)[33].

In another hand, many of them classified the detected changes based on their impact on the treated artifact (models, constraint, transformation, and code). Here we put the largest set of changes types, later, we will specify treated types with their possible impact on the code.

Two types of evolution changes are considered when evolving a metamodel: *atomic* and *complex* changes [33], [34]. Atomic changes are additions, removals, and updates of a metamodel element. Complex changes consist of a sequence of atomic changes combined

<sup>1.</sup> Offline approaches perform detection after the metamodel has been evolved.

<sup>2.</sup> Online approaches perform instant detection for each change during the metamodel evolution

together [35], [36]. For example, move property is a complex change where a property is moved from a source class to a target class. This is composed of two atomic changes: delete property and add property [34]. Many approaches in the literature [35], [37]–[42] exist to detect metamodel changes between two versions.

| Type    | Change name          |  |  |
|---------|----------------------|--|--|
|         | Delete class         |  |  |
| Atomic  | Delete property      |  |  |
| changes | Add class            |  |  |
|         | Add property         |  |  |
|         | Rename class         |  |  |
|         | Rename property      |  |  |
|         | Generalize property  |  |  |
|         | Move property        |  |  |
| G 1     | Push property        |  |  |
| Complex | Pull property        |  |  |
| changes | Inline class         |  |  |
|         | Change property type |  |  |

In Model-Dricen Engineering area, metamodel changes can be divided into three categories [43]:

- Non-breaking changes can be resolved automatically.
- Breaking and resolvable changes break the conformance of existing data, although they can be automatically adapted.
- Breaking and unresolvable changes break the conformance of existing data, that cannot be automatically adapted, and require user intervention

In API evolution context, API changes can be classified as Non-breaking API Changes or Breaking API Changes. A breaking change is not backwards compatible. In this case, client code calling the evolved API by a Breaking Change fails to compile or may behave differently at runtime. A non-breaking change is backwards compatible. This kind of changes aims to extend the functionalities or fix errors [44].

# 3.2 Co-evolution of models, constraints, and transformation

In MDE ecosystem, the metamodel is the starting point to have other artifacts that we defined in section? in this section, we will present an overview of the existing work about these artifacts co-evolution. Note that if the solution is applied during the evolution of the metamodel, we call it an online solution, otherwise it is offline. The comparison, advantages, and drawbacks of the presented approaches is out of the scope of this dissertation.

#### 3.2.1 Metamodel and model co-evolution

Due to metamodel evolution, the model becomes "no conform". A set of resolutions are applied to co-evolve the model to gain again its conformity to the metamodel. The co-evolution between metamodel and models can be processed manually but it requires a huge expertise. Most of automatic and semi-automatic Co-evolution approaches use automatic or manual diffing metamodel approaches in their solutions. Model co-evolution approaches that we found can be categorized into five categories [45]. The first category is Resolution Strategy Languages that specifies in a transformation language how to update the model given the list of metamodel changes [46]–[52]. The category Resolution Strategy Generation groups approaches that generate full or partial resolution for each metamodel change [53]–[57].

The third group of "Predefined Resolution Strategies" contains approaches that provide automation, when it is possible, by applying predefined resolution strategies [58]–[66].

Some of these approaches requires the user intervention to make decision on the selected operation to adapt the model. The fourth category of Resolution strategy leaning that adopt machine learning algorithm to select the resolution strategy for metamodel changes. [67].

The fifth and last category is called Constrained Model Search. It groups approaches that do not use the metamodel change, but uses the original model and the new metamodel to apply a constrained-based search of valid model variants [68]–[70]. Other approaches consider the model co-evolution problem as an optimization one that does not need the list of changes of the metamodel [71]–[73].

#### 3.2.2 Metamodel and constraints co-evolution

Another artifact that depends on the metamodel and needs to be adapted to the evolution of its metamodel is Constraints. Constraints co-evolutions that we can find in literature may be online <sup>3</sup> or offline <sup>4</sup>. Every approach has its own co-evolution mechanism that treats specific types of metamodel changes and has its automation degree. Demuth et al. [74] proposed a template-based, hat cannot cover all changes types, of the predefined structure of the updated constraint. Markovich et al. [75] proposed refactoring rules that depends on the impact of UML class diagram evolution on the constraints. Hassam et al. [76] propose METAEVOL, based on a transformation language. Kusel et al [77] propose a solution for the co-evolution of the constrain body and do not include its context that may need co-evolution also. Cabot et al [78] treats OCL constraints co-evolution due to metamodel deletion change. Khelladi et al [79] proposed an approach that record the metamodel atomic and complex changes in a chronological order then apply one or many resolutions to co-evolve the constraints. Batot et al. [80] tackles the constraint coevolution problem as an multi-objective optimization problem and apply heuristic-based recommendation approach that does not require/use a predefined set of transformation rules/resolutions to co-evolve the constraints. Demuth, markovitch, cabot [74], [75], [78] their approaches ar fully automatic while Hassam, kusel and Khelladi, and Batot [76], [77], [79], [80] propose semi-automatic approaches since the user must select from the recommended output constraints.

### 3.2.3 Metamodel and transformations co-evolution

Almost all the existing transformation approaches that we find in literature start by analyzing the impact of the metamodel on the model transformations. Mendez et al. [81], Ruscio et al. [82], Garces et al. [83], Kusel, et al. [84], and khelladi et al. [85] proposed to co-evolve impacted transformations with a set of resolutions. The approach of khelladi et al. [85] covers the largest set of possible resolutions where Ruscio et al. [82], estimate the cost of the co-evolution to decide about the co-evolution, they further explored the variability of the co-evolution due to the possible alternative resolution. Garcia et al. [86] proposed a ATL transformation-based approach which means that their resolutions are ATL transformations. All the approaches propose unique resolution to

<sup>3.</sup> Online approaches perform instant co-evolution for each change during the metamodel evolution

<sup>4.</sup> Offline approaches perform co-evolution after the metamodel has been evolved.

co-evolve each transformation. Ruscio et al. [82] approach allows developers to manually replace or refine a resolution. Khelladi et al. [85] allow to compose existing resolutions into a new one. Kessentini et al. [87] used a different approach that do not use the changes of the metamodel as input and do not process by an impact analysis, but it uses a search-based approach that relied on multi objective heuristic algorithm NSGA-II.

### 3.3 Code co-evolution

We divided the related work to code co-evolution into four (4) main categories: 1) Metamodel and code co-evolution, 2) API and client code co-evolution, 3) Automatic Program repair, and 4) Consistency checking.

#### 3.3.1 Metamodel and code co-evolution

Co-evolution of code is distinguished from the co-evolution of other artifacts by the fact that *one* change in a metamodel element will affect *n* different code elements, in contrast to a *one* to *one* impact relationship between metamodel elements and models, constraints and transformation elements [55], [61], [72], [79], [83]–[85], [87]–[94].

Yu et al. [10] proposed to co-evolve the metamodels and the generated API in both directions. However, they do not co-evolve the code on top of it.Khelladi et al. [11] proposed an approach that propagates metamodel changes in the code as a co-evolution mechanism. However, it is based on static analysis to detect the impacts and not on the actual errors that appear from the compilation of the code after the metamodel evolution. It further applies a semi-automatic co-evolution requiring developers' intervention, and without checking behavioral correctness with tests with no comparison to a baseline.

#### 3.3.2 API and client code co-evolution

Existing approaches for code migration are related to our work. Henkel et al. [95] proposed an approach that captures refactoring actions and replays them on the code to migrate. However, they support only the changes renames, moves, and type changes.

Nguyen et al. [96] also proposed an approach that guides developers in adapting code by learning adaptation patterns from previously migrated code. Similarly, Dagenais et al. [97]–[99] also use a recommendation mechanism of code changes by mining them from previously migrated code. Anderson et al. [100] proposed to migrate drivers in response

to evolutions in Linux internal libraries. It identifies common changes made in a set of files to extract a generic patch that can be reused on other code parts. Gerasimou et al. [101] extract a set of mapping rules and apply code-based transformations to update its clients.

Other migration approaches [102]–[104] rely on pre-collected examples to learn how to evolve the additional client code. Xu et al. [105] instead of learning from code examples, it constructs a database of edits to use during clients' migration.

Zhong et al. [106] proposes "LibCatch", a tool to co-evolve client code to APIs evolution by reducing the compilation errors. They do not consider the API changes to correctly propagate them to the code, which may lead to only eliminating the code errors while they could be incorrect resolutions, as shown in our RQ3. They further do not use any mechanism to check the behavioral correctness of the code co-evolution and with not comparison to a ground-truth.

### 3.3.3 Automatic Program Repair

In addition to migration approaches, extensive state of the art exists on program repair [107]–[110]. However, they do not repair code errors, but rather bugs that are found due to failing tests (e.g., Meng at al. [111], etc.). They could be used as a next step after co-evolution.

//To refresh new references

## 3.3.4 Consistency checking

Furthermore, close to code co-evolution, Riedl et al. [4] proposed an approach to detect inconsistencies between UML models and code. Kanakis et al. [5] showed that inconsistency information of model change and code error can help to resolve them in the code, which is equivalent to our matched pattern usages. Pham et al. [6] proposed an approach to synchronize architectural models and code with bidirectional mappings. Jongeling et al. [7] proposed an early approach for the consistency checking between system models and their implementations by focusing on recovering the traceability links between the models and the code. Jongeling et al. [8] later rely on the recovered traces to perform the consistency checking task. Zaheri et al. [9] also proposed to support the checking of the consistency-breaking updates between models and generated artifacts, including the code. However, [6]–[9] do not focus on co-evolving the code to repair the

inconsistencies with the models.

# TITRE DU PREMIER CHAPITRE

# 4.1 Première section du chapitre

#### 4.1.1 Première sous-section

# 4.2 Approach

This section presents the overall approach of our automated co-evolution of code with evolving metamodels, instantiating on the Ecore technological space. First, we give an overview of the approach and specify the metamodel evolution changes we consider. Then, we present how we retrieve the resulting errors due to metamodel evolution, followed by the regeneration of the code API. After that, we present the pattern matching process, which is an important part of our fully automatic co-evolution approach, before discussing the resolutions of the code errors.

#### 4.2.1 Overview

Figure 4.1 depicts the overall steps for the automatic co-evolution of the metamodel and code, with horizontally separated parts defining chronological order from the top to the bottom. After the generation step (the upper part of Figure 4.1), the evolution of the Ecore metamodel will cause errors in the additional Java code that depends on the API of the newly generated code (the middle part of Figure 4.1). We take as input the evolution changes of the metamodel between the two versions of this metamodel 1. Then, we parse the additional code 2 to retrieve the list of errors. After that, we get to the bottom part of Figure 4.1, both the list of metamodel changes and the list of errors are used as inputs for the pattern matching step 3. It analyzes the structure of the error to match it with its impacting metamodel change and decides which resolution to apply for the error co-evolution 4. The metamodel changes provide the ingredients and necessary

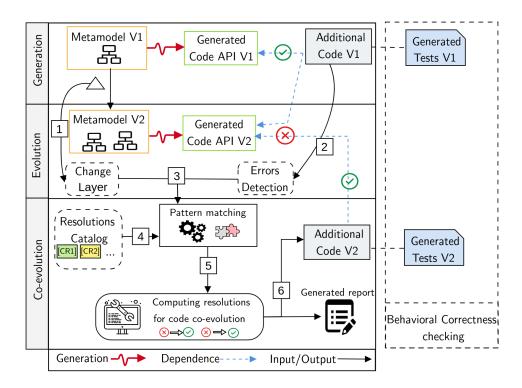


Figure 4.1 – Overall approach for metamodel and code co-evolution

information that are used for the co-evolution. At the end of the automatic co-evolution, we obtain a new co-evolved additional code 5. In addition to the automatic co-evolution, we generate test cases before and after co-evolution to highlight its possible effect. In fact, many research papers rely on the use of tests to check the behavior of the code during its evolution. For example, Godefroid et al. [112] uses tests to find regressions in different versions of REST APIs. In particular, Lamothe et al. [104],test [103] use tests to validate the evolution of the client code after Android API migration. We apply a similar method to check the effect of the co-evolution. [111] Finally, during the co-evolution process, we generate a report linking the applied resolutions for each code error with its impacting metamodel change. If needed, this can help developers in understanding the performed co-evolution, since we fully automate it.

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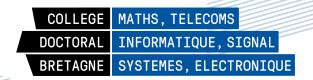
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Titre: titre (en français).....

Mot clés : de 3 à 6 mots clefs

**Résumé**: Eius populus ab incunabulis primis ad usque pueritiae tempus extremum, quod annis circumcluditur fere trecentis, circummurana pertulit bella, deinde aetatem ingressus adultam post multiplices bellorum aerumnas Alpes transcendit et fretum, in iuvenem erectus et virum ex omni plaga quam orbis ambit inmensus, reportavit laureas et triumphos, iamque vergens in senium et nomine solo aliquotiens vincens ad tranquilliora vitae discessit. Hoc inmaturo interitu ipse quoque sui pertaesus excessit e vita aetatis nono anno atque vicensimo cum quadriennio imperasset. natus apud Tuscos in Massa Veternensi, patre Constantio Constantini fratre imperatoris, matreque Galla. Thalassius vero

ea tempestate praefectus praetorio praesens ipse quoque adrogantis ingenii, considerans incitationem eius ad multorum augeri discrimina, non maturitate vel consiliis mitigabat, ut aliquotiens celsae potestates iras principum molliverunt, sed adversando iurgandoque cum parum congrueret, eum ad rabiem potius evibrabat, Augustum actus eius exaggerando creberrime docens, idque, incertum qua mente, ne lateret adfectans, quibus mox Caesar acrius efferatus, velut contumaciae quoddam vexillum altius erigens, sine respectu salutis alienae vel suae ad vertenda opposita instar rapidi fluminis irrevocabili impetu ferebatur. Hae duae provinciae bello quondam piratico catervis mixtae praedonum.

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