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LTL and Past LTL on Finite Traces for Planning and Declarative Process Mining

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Contents

1	Introduction	1
1.1	Context	1
1.2	Problem	1
1.3	Objectives	1
1.4	Results	1
1.5	Structure	1
2	PLTL and LTL_f	3
2.1	Linear Temporal Logic (LTL)	3
2.1.1	Syntax	4
2.1.2	Semantics	4
2.1.3	Complexity	5
2.2	Linear Temporal Logic on Finite Traces (LTL_f)	5
2.2.1	Syntax	5
2.2.2	Semantics	6
2.2.3	Complexity	7
2.3	Past Linear Temporal Logic (PLTL)	7
2.3.1	Syntax	7
2.3.2	Semantics	8
2.3.3	Complexity and Expressiveness	9
2.4	LTL_f and PLTL Translation to Automata	9
2.4.1	∂ function for LTL_f	10
2.4.2	∂ function for PLTL	10
2.5	LTL_f /PLTL to FOL Encoding and MONA	10
2.5.1	LTL_f -to-FOL Encoding	10
2.5.2	PLTL-to-FOL Encoding	12
2.5.3	MONA and FOL-to-MONA Encoding	13
2.6	Summary	16
3	LTL_f2DFA	17
3.1	Introduction	17
3.2	Package Structure	18
3.2.1	Lexer.py	18

3.2.2	Parser.py	20
3.2.3	Translator.py	23
3.2.4	DotHandler.py	31
3.3	Interpreting LTL_f2DFA output	32
3.4	Comparison with FLLOAT	34
3.5	Discussion	35
4	Planning for Extended Temporal Goals	37
4.1	Idea and Motivations	37
4.2	Preliminaries	38
4.2.1	PDDL	38
4.2.2	Fully Observable Non Deterministic Planning	38
4.3	Encoding of Temporal Goals in PDDL	38
4.4	Implementation	38
4.4.1	Package Structure	38
4.4.2	PDDL	38
4.4.3	Automa	38
4.4.4	Main Module	38
4.5	Summary	38
5	Janus	39
5.1	Declarative Process Mining	39
5.2	Janus	42
5.2.1	Algorithm	46
5.3	Implementation	46
5.3.1	Package Structure	47
5.3.2	I/O	47
5.3.3	Automata	49
5.3.4	Formulas	56
5.3.5	Main Module	57
5.3.6	Results	57
5.4	Summary	58
6	Conclusions and Future Work	59
6.1	Overview	59
6.2	Main Contributions	59
6.3	Future Works	59
6.4	Final Remarks	59
	Bibliography	61

Chapter 1

Introduction

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1.1 Context

here the context of the thesis

1.2 Problem

what is the problem solved

1.3 Objectives

what are the objective of the thesis

1.4 Results

what are the results achieved

1.5 Structure

what is the structure of the thesis

Chapter 2

PLTL and LTL_f

This chapter will deal with the theoretical framework on which all topics present in the thesis are based. Initially, we will introduce the widely known Linear-Time Temporal Logic (LTL) and the Past Linear Time Temporal Logic (PLTL), focusing on their syntax and semantic. Secondly, we will talk about the concept of *Finite Trace* in these formal languages and how it changes them. Specifically, we will describe the Linear Time Temporal Logic over Finite Traces (LTL_f). Then, we will illustrate the theory behind the transformation of an LTL_f or PLTL formula to a Deterministic Finite State Automaton (DFA). Finally, we will describe the translation of an LTL_f or PLTL formula to the classic First-Order Logic formalism (FOL) and the translation of a FOL formula into a program that the MONA, a tool that translates formulas into a DFA, can manage. Some examples will be provided, but we will suppose the reader to be confident with classical logic and automata theory.

2.1 Linear Temporal Logic (LTL)

Temporal Logic formalisms are a set of formal languages designed for representing temporal information and reasoning about time within a logical framework (Goranko and Galton, 2015). Indeed, these logics are used when propositions have their truth value dependent on time.

In this scenario, we find the *Linear Temporal Logic* (LTL) which is a a very well known modal temporal logic with modalities referring to time. It was originally proposed in (Pnueli, 1977) as a specification language for concurrent programs. Consequently, LTL has been extensively used in Artificial Intelligence and Computer Science. For instance, it has been employed in planning, reasoning about actions, declarative process mining and verification of software/hardware systems.

2.1.1 Syntax

Given a set of propositional symbols \mathcal{P} , a valid LTL formula φ is defined as follows:

$$\varphi ::= a \mid \neg\varphi \mid \varphi_1 \wedge \varphi_2 \mid \bigcirc\varphi \mid \varphi_1 \mathcal{U} \varphi_2$$

where $a \in \mathcal{P}$. The unary operator \bigcirc (*next-time*) and the binary operator \mathcal{U} (*until*) are temporal operators and we use \top and \perp to denote *true* and *false* respectively. Moreover, all classical logic operators $\vee, \Rightarrow, \Leftrightarrow, \text{true}$ and *false* can be used. Intuitively, $\bigcirc\varphi$ says that φ is true at the *next* instant, $\varphi_1 \mathcal{U} \varphi_2$ says that at some future instant, φ_2 will hold and *until* that point φ_1 holds. We also define common abbreviations for some specific temporal formulas: *eventually* as $\Diamond\varphi \doteq \text{true} \mathcal{U} \varphi$, *always* as $\Box\varphi \doteq \neg\Diamond\neg\varphi$, *weak-next* as $\bullet\varphi \doteq \neg\bigcirc\neg\varphi$ and *release* as $\varphi_1 \mathcal{R} \varphi_2 \doteq \neg(\neg\varphi_1 \mathcal{U} \neg\varphi_2)$.

LTL allows to express a lot of interesting properties defined over time. In the Example 2.1 we show some of them.

Example 2.1. Interesting LTL patterns:

- *Safety*: $\Box\varphi$, which means *it is always true that property in φ will happen* or *φ will hold forever*. For instance, $\Box\neg(\text{reactorTemp} > 1000)$ (the temperature of the reactor must never exceed 1000).
- *Liveness*: $\Diamond\varphi$, which means *sooner or later φ will hold* or *something good will eventually happen*. For instance, $\Diamond\text{rich}$ (eventually I will become rich).
- *Response*: $\Box\Diamond\varphi$ which means *for every point in time, there is a point later where φ holds*.
- *Persistence*: $\Diamond\Box\varphi$, which means *there exists a point in the future such that from then on φ always holds*.
- *Strong fairness*: $\Box\Diamond\varphi_1 \Rightarrow \Box\Diamond\varphi_2$, *if something is attempted/requested infinitely often, then it will be successful/allocated infinitely often*. For instance, $\Box\Diamond\text{ready} \Rightarrow \Box\Diamond\text{run}$ (if a process is in ready state infinitely often, then it will be selected by the scheduler infinitely often).

2.1.2 Semantics

The semantics of the main operators of LTL over *infinite traces* are expressed as an ω -word over the alphabet $2^{\mathcal{P}}$. We give the following definitions:

Definition 2.1. Given an infinite trace π , we inductively define when an LTL formula φ is *true* at an instant i , in symbols $\pi, i \models \varphi$, as follows:

$$\pi, i \models a, \text{ for } a \in \mathcal{P} \text{ iff } a \in \pi(i)$$

$$\pi, i \models \neg\varphi \text{ iff } \pi, i \not\models \varphi$$

$$\pi, i \models \varphi_1 \wedge \varphi_2 \text{ iff } \pi, i \models \varphi_1 \wedge \pi, i \models \varphi_2$$

$$\pi, i \models \bigcirc \varphi \text{ iff } \pi, i+1 \models \varphi$$

$$\pi, i \models \varphi_1 \mathcal{U} \varphi_2 \text{ iff } \exists j. (j \geq i) \wedge \pi, j \models \varphi_2 \wedge \forall k. (i \leq k < j) \Rightarrow \pi, k \models \varphi_1$$

Definition 2.2. An LTL formula φ is *true* in π , in notation $\pi \models \varphi$, if $\pi, 0 \models \varphi$. A formula φ is *satisfiable* if it is true in some π and is *valid* if it is true in every π . A formula φ_1 *logically implies* another formula φ_2 , in symbols $\varphi_1 \models \varphi_2$ iff $\forall \pi, \pi \models \varphi_1 \Rightarrow \pi \models \varphi_2$.

Notice that satisfiability, validity and logical implication are all mutually reducible one to each other.

Example 2.2. Validity and logical implication as satisfiability

- φ is valid iff $\neg \varphi$ is unsatisfiable.
- $\varphi_1 \models \varphi_2$ iff $\varphi_1 \wedge \neg \varphi_2$ is unsatisfiable.

2.1.3 Complexity

About LTL complexity, we can state the following fundamental theorem:

Theorem 2.1. (*Sistla and Clarke, 1985*) *Satisfiability, validity, and logical implication for LTL formulas are PSPACE-complete.*

2.2 Linear Temporal Logic on Finite Traces (LTL_f)

Linear Temporal Logic on Finite Traces (LTL_f) is the variant of LTL described in Section 2.1 interpreted over *finite traces* (De Giacomo and Vardi, 2013). Although it seems a little difference, in some cases, the interpretation of a formula over finite traces completely changes its meaning with respect to the one over infinite traces.

2.2.1 Syntax

The syntax of LTL_f is exactly the same of LTL. Indeed, LTL_f formulas are built from a set \mathcal{P} of propositional symbols and are closed under the boolean connectives, the unary temporal operator \bigcirc (*next-time*) and the binary operator \mathcal{U} (*until*). Formulas can be defined as follows:

$$\varphi ::= a \mid \neg \varphi \mid \varphi_1 \wedge \varphi_2 \mid \bigcirc \varphi \mid \varphi_1 \mathcal{U} \varphi_2$$

where $a \in \mathcal{P}$. All usual logical operators such as $\vee, \Rightarrow, \Leftrightarrow, true$ and *false* are also used. Similarly to LTL, we can define the following common abbreviations for temporal operators:

$$\Diamond \varphi \doteq true \mathcal{U} \varphi \tag{2.1}$$

$$\Box\varphi \doteq \neg\Diamond\neg\varphi \quad (2.2)$$

$$\bullet\varphi \doteq \neg\bigcirc\neg\varphi \quad (2.3)$$

$$\varphi_1 \mathcal{R} \varphi_2 \doteq \neg(\neg\varphi_1 \mathcal{U} \neg\varphi_2) \quad (2.4)$$

$$Last \doteq \bullet false \quad (2.5)$$

$$End \doteq \Box false \quad (2.6)$$

Compared with LTL, in LTL_f there have been defined also 2.5 and 2.6 which denotes the last instance of the trace and that the trace is ended, respectively. As we have seen in Example 2.1 with LTL, now we will see in Example 2.3 how properties expressed in LTL_f have changed their meaning with the interpretation over finite traces.

Example 2.3. Interesting LTL_f patterns:

- *Safety*: $\Box\varphi$, which now means always *till the end of the trace* φ holds.
- *Liveness*: $\Diamond\varphi$, which now means eventually *before the end of the trace* φ holds.
- *Response*: $\Box\Diamond\varphi$, which means for any point in the trace there exist a point later in the trace where φ holds. This property, interpreted over finite traces, can be seen also as $\Diamond(Last \wedge \varphi)$ because $\Box\Diamond\varphi$ implies that the *last point in the trace satisfies* φ .
- *Persistence*: $\Diamond\Box\varphi$ means that there is a point in the trace such that from then on until the end of the trace φ holds. Also here the meaning can be seen as $\Diamond(Last \wedge \varphi)$ since $\Diamond\Box\varphi$ implies that at the last point of the trace $\Box\varphi$, and so φ , holds.

In other words, no direct nesting of *eventually* and *always* connectives is meaningful in LTL_f. However, indirect nesting of *eventually* and *always* connectives can still produce meaningful and interesting properties. One example could be $\Box(\psi \Rightarrow \Diamond\varphi)$, which stands for *always, before the end of the trace, if ψ holds then φ will eventually hold*.

2.2.2 Semantics

The semantics of LTL_f is given as LTL_f-interpretations, namely interpretations over a *finite traces* denoting a finite sequence of consecutive instants of time. Formally, LTL_f-interpretations are expressed as finite words π over the alphabet $2^{\mathcal{P}}$, i.e. as alphabet we have all the possible propositional interpretations of the propositional symbols in \mathcal{P} . We use the following notation. We denote the *length* of a trace π as $length(\pi)$. We denote the *positions*, i.e. instants, on the trace as $\pi(i)$ with $0 \leq i \leq last$ where $last = length(\pi) - 1$ is the last element of the trace. We denote by $\pi(i, j)$, the *segment* (i.e., the subword) of π , the trace $\pi' = \langle \pi(i), \pi(i+1), \dots, \pi(j) \rangle$, with $0 \leq i \leq j \leq last$. We now give the following definitions:

Definition 2.3. Given an LTL_f -interpretation π , we define when an LTL_f formula φ is *true* at position i (for $0 \leq i \leq last$), in symbols $\pi, i \models \varphi$, inductively as follows:

$$\begin{aligned} \pi, i &\models a, \text{ for } a \in \mathcal{P} \text{ iff } a \in \pi(i) \\ \pi, i &\models \neg\varphi \text{ iff } \pi, i \not\models \varphi \\ \pi, i &\models \varphi_1 \wedge \varphi_2 \text{ iff } \pi, i \models \varphi_1 \wedge \pi, i \models \varphi_2 \\ \pi, i &\models \bigcirc\varphi \text{ iff } i < last \wedge \pi, i+1 \models \varphi \end{aligned} \tag{2.7}$$

$$\pi, i \models \varphi_1 \mathcal{U} \varphi_2 \text{ iff } \exists j. (i \leq j \leq last) \wedge \pi, j \models \varphi_2 \wedge \forall k. (i \leq k < j) \Rightarrow \pi, k \models \varphi_1 \tag{2.8}$$

The Definition 2.3 is exactly the same Definition 2.1 seen for LTL except for 2.7 and 2.8 in which the only difference lies on the intervals bounded by the last element of the trace.

Definition 2.4. An LTL_f formula is *true* in π , in notation $\pi \models \varphi$, if $\pi, 0 \models \varphi$. A formula φ is *satisfiable* if it is true in some LTL_f -interpretation, and is *valid* if it is true in every LTL_f -interpretation. A formula φ_1 *logically implies* another formula φ_2 , in symbols $\varphi_1 \models \varphi_2$ iff for every LTL_f -interpretation π we have that $\pi \models \varphi_1$ implies $\pi \models \varphi_2$.

2.2.3 Complexity

About LTL_f complexity, we can state the following theorem:

Theorem 2.2. (*De Giacomo and Vardi, 2013*) *Satisfiability, validity and logical implication for LTL_f formulas are PSPACE-complete.*

About LTL_f expressiveness, we have that:

Theorem 2.3. (*De Giacomo and Vardi, 2013; Gabbay et al., 1997*) *LTL_f has exactly the same expressive power of FOL over finite ordered sequences.*

2.3 Past Linear Temporal Logic (PLTL)

So far we have seen LTL and LTL_f languages, over infinite and finite traces respectively, that look into the future events. On the contrary, now we describe the so called *Past Linear Temporal Logic* (PLTL) which is the counterpart of the LTL and LTL_f because it uses temporal modalities for referring to past events, instead of future ones.

2.3.1 Syntax

The syntax of PLTL is exactly the same of the one seen in Section 2.1.1 for LTL and in Section 2.2.1 for LTL_f except for past temporal operators that are the inverse of the future ones. As stated before, PLTL formulas are built on top from a set \mathcal{P} of propositional

symbols and are closed under the boolean connectives, the unary temporal operator \ominus (*previous-time*) and the binary operator \mathcal{S} (*since*). Formulas can be defined as follows:

$$\varphi ::= a \mid \neg\varphi \mid \varphi_1 \wedge \varphi_2 \mid \ominus\varphi \mid \varphi_1 \mathcal{S} \varphi_2$$

where $a \in \mathcal{P}$. All usual logical operators such as $\vee, \Rightarrow, \Leftrightarrow, \text{true}$ and *false* can be derived. Similarly to LTL and LTL_f, we define the following common abbreviations for temporal operator:

$$\Diamond\varphi \doteq \text{true} \mathcal{S} \varphi \quad (2.9)$$

$$\Box\varphi \doteq \neg\Diamond\neg\varphi \quad (2.10)$$

In particular, $\Diamond\varphi$ in 2.9 is called *once* while $\Box\varphi$ in 2.10 is known as *historically*. Furthermore, both temporal operators *previous-time*, *since* and the two common abbreviations *once*, *historically* just defined above could be seen also as the inverse operators of future operators in LTL/LTL_f:

$$\ominus\varphi \equiv \mathcal{O}^{-1}\varphi$$

$$\varphi_1 \mathcal{S} \varphi_2 \equiv \varphi_1 \mathcal{U}^{-1}\varphi_2$$

$$\Diamond\varphi \equiv \Diamond^{-1}\varphi$$

$$\Box\varphi \equiv \Box^{-1}\varphi$$

2.3.2 Semantics

As we did previously with LTL and then with LTL_f, here we define a semantics to PLTL. The first important thing to notice is that a PLTL formula could be only interpreted over *finite* traces. This is due to the fact that, no matter how long the trace is, there must be a starting point in the past. Formally, a trace π is a word over the alphabet $2^{\mathcal{P}}$ and as alphabet we have all possible propositional interpretations of the propositional symbols in \mathcal{P} . We can now give the following definitions:

Definition 2.5. Given a trace π , we inductively define when a PLTL formula φ is *true* at time i , in symbols $\pi, i \models \varphi$, as follows:

$$\begin{aligned} \pi, i &\models a, \text{ for } a \in \mathcal{P} \text{ iff } a \in \pi(i) \\ \pi, i &\models \neg\varphi \text{ iff } \pi, i \not\models \varphi \\ \pi, i &\models \varphi_1 \wedge \varphi_2 \text{ iff } \pi, i \models \varphi_1 \wedge \pi, i \models \varphi_2 \\ \pi, i &\models \ominus\varphi \text{ iff } i > 0 \wedge \pi, i-1 \models \varphi \\ \pi, i &\models \varphi_1 \mathcal{S} \varphi_2 \text{ iff } \exists j. (j \leq i) \wedge \pi, j \models \varphi_2 \wedge \forall k. (j < k \leq i) \Rightarrow \pi, k \models \varphi_1 \end{aligned}$$

The Definition 2.5 is quite similar to Definitions 2.1 and 2.3. The only difference lies on the position in time of instances, indeed, in this case, we go backward.

2.3.3 Complexity and Expressiveness

About PLTL complexity, we can state the following theorem:

Theorem 2.4. *Satisfiability, validity and logical implication for PLTL formulas are PSPACE-complete.*

About expressiveness of PLTL, we can state the following theorem:

Theorem 2.5. *PLTL has exactly the same expressive power of LTL_f .*

However, it is worth to say that the LTL_f formalism augmented with past temporal operators present in PLTL can be exponentially more succinct than LTL_f (with only future operators) (Markey, 2003). Indeed, having at the same time past and future temporal operators is really useful because, in general, expressions given in natural language use references to events occurred in the past. We give an example in the following.

Example 2.4. Succinctness of LTL_f with Past:

$$\Box(\text{grant} \Rightarrow \Diamond \text{request}) \quad (2.11)$$

$$\neg((\neg \text{request})\mathcal{U}(\text{grant} \wedge \neg \text{request})) \quad (2.12)$$

Both formulas mean *every grant is preceeded by a request*. The former (2.11) is in LTL_f with past modalities whereas the latter (2.12) is pure LTL_f . It is pretty evident that the 2.11 is less intricate than the one in 2.12.

Finally, this property of LTL_f augmented with past temporal operators is interesting, however it is out of the scope of this thesis.

2.4 LTL_f and PLTL Translation to Automata

Given an LTL_f /PLTL formula φ , we can build a deterministic finite state automaton (DFA) (Rabin and Scott, 1959) \mathcal{A}_φ that accepts the same finite traces that makes φ true. To achieve this, we proceed in two steps: first, we translate LTL_f and PLTL formulas into an (NFA) (De Giacomo and Vardi, 2015) following a simple direct algorithm; secondly, the obtained NFA can be converted into a DFA following the standard *determinization* procedure.

Now, we recall definitions of NFA and DFA:

Definition 2.6. An NFA is a tuple $\mathcal{A} = \langle \Sigma, Q, q_0, \delta, F \rangle$, where:

- Σ is the input alphabet;
- Q is the finite set of states;
- $q_0 \in Q$ is the initial state;
- $\delta \subseteq Q \times \Sigma \times Q$ is the transition relation;

- $F \subseteq Q$ is the set of final states;

Definition 2.7. A DFA is a NFA where δ is a function $\delta : Q \times \Sigma \rightarrow Q$

To denote the set of all traces over Σ accepted by \mathcal{A} we will use $\mathcal{L}(\mathcal{A})$ henceforth.

In the next subsections, we will provide some definitions and we will illustrate the algorithm for the translation also giving an example.

2.4.1 ∂ function for LTL_f

2.4.2 ∂ function for PLTL

2.5 LTL_f/PLTL to FOL Encoding and MONA

In this section, we will illustrate how to translate an LTL_f and a PLTL formula into *first-order logic* (FOL) over finite linear ordered sequences¹ (De Giacomo and Vardi, 2013; Zhu et al., 2018). Then, we will present the MONA tool with its syntax and we will explain the translation procedure from a FOL encoding to the MONA encoding.

2.5.1 LTL_f-to-FOL Encoding

In the following we deal with a first-order language augmented with monadic predicates *succ*, *<* and *=* plus two constants *0* and *last*. Afterwards, we focus our attention to *finite linear ordered FOL interpretations* under the form of $\mathcal{I} = (\Delta^I, \cdot^{\mathcal{I}})$, where the domain is $\Delta^I = \{0, \dots, n\}$ with $n \in \mathbb{N}$, and the interpretation function $\cdot^{\mathcal{I}}$ interprets binary predicates and constants as follows:

$$\begin{aligned}
 succ^{\mathcal{I}} &= \{(i, i+1) \mid i \in \{0, \dots, n-1\}\} \\
 <^{\mathcal{I}} &= \{(i, j) \mid i, j \in \{0, \dots, n\} \wedge i < j\} \\
 =^{\mathcal{I}} &= \{(i, i) \mid i \in \{0, \dots, n\}\} \\
 0^{\mathcal{I}} &= 0 \\
 last^{\mathcal{I}} &= n
 \end{aligned} \tag{2.13}$$

Actually, all these operators can be derived from *<* as follows:

$$\begin{aligned}
 succ(x, y) &\doteq x < y \wedge \neg \exists z. x < z < y \\
 x = y &\doteq \forall z. x < z \equiv y < z \\
 0 &\doteq x \mid \neg \exists y. succ(y, x) \\
 last &\doteq x \mid \neg \exists y. succ(x, y)
 \end{aligned}$$

Although there could be possible differences in notation, the relation between LTL_f-interpretations and finite linear ordered FOL interpretations is isomorphic. Indeed, given

¹More precisely *monadic first-order logic on finite linearly ordered domains*, sometimes denoted as FO[<].

an LTL_f-interpretation π we can define the corresponding FOL interpretation $\mathcal{I} = (\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}})$ as follows: $\Delta^{\mathcal{I}} = \{0, \dots, last\}$, with $last = length(\pi) - 1$, with the predefined predicates and constants interpretation and, for each $a \in \mathcal{P}$ its interpretation is $a^{\mathcal{I}} = \{i \mid a \in \pi(i)\}$. On the contrary, given a finite linear ordered FOL interpretation $\mathcal{I} = (\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}})$, with $\Delta^{\mathcal{I}} = \{0, \dots, n\}$, we determine the corresponding LTL_f-interpretation π as follows: $length(\pi) = n + 1$, for each instant $0 \leq i \leq last$ (with $last = n$), we obtain $\pi(i) = \{a \mid i \in a^{\mathcal{I}}\}$.

At this moment, we can define the translation function $fol(\varphi, x)$ in the following way.

Definition 2.8. Given an LTL_f formula φ and a variable x , the translation function $fol(\varphi, x)$, inductively defined on the LTL_f formula's structure, returns the corresponding FOL formula open in x :

$$fol(a, x) = a(x)$$

$$fol(\neg\varphi, x) = \neg fol(\varphi, x)$$

$$fol(\varphi_1 \wedge \varphi_2, x) = fol(\varphi_1, x) \wedge fol(\varphi_2, x)$$

$$fol(\varphi_1 \vee \varphi_2, x) = fol(\varphi_1, x) \vee fol(\varphi_2, x)$$

$$fol(\bigcirc\varphi, x) = \exists y. succ(x, y) \wedge fol(\varphi, y)$$

$$fol(\bullet\varphi, x) = x = last \vee \exists y. succ(x, y) \wedge fol(\varphi, y)$$

$$fol(\varphi_1 \mathcal{U} \varphi_2, x) = \exists y. x \leq y \leq last \wedge fol(\varphi_2, y) \wedge \forall z. x \leq z < y \Rightarrow fol(\varphi_1, z)$$

$$fol(\varphi_1 \mathcal{R} \varphi_2, x) = \exists y. x \leq y \leq last \wedge fol(\varphi_1, y) \wedge \forall z. x \leq z < y \Rightarrow fol(\varphi_2, z) \vee$$

$$\forall z. x \leq z < last \Rightarrow fol(\varphi_2, z)$$

The following Theorem ensures that a finite trace ρ satisfies an LTL_f formula φ iff the corresponding finite linear ordered FOL interpretation \mathcal{I} of ρ models $fol(\varphi, 0)$.

Theorem 2.6. (*De Giacomo and Vardi, 2013*) Given an LTL_f-interpretation π and a corresponding finite linear ordered FOL interpretation \mathcal{I} , we have:

$$\pi, i \models \varphi \text{ iff } \mathcal{I}, [x/i] \models fol(\varphi, x)$$

where $[x/i]$ stands for a variable assignments that assigns the value i to the free variable x of $fol(\varphi, x)$.

In general, recalling the Definition 2.4, a formula φ is true in a trace π ($\pi \models \varphi$) if $\pi, 0 \models \varphi$. Hence, we should evaluate our translation function $fol(\varphi, x)$ in 0 (i.e. computing $fol(\varphi, 0)$). Finally, since also the converse reduction of Theorem 2.6 holds, we can state the following Theorem:

Theorem 2.7. (*Gabbay et al., 1980*) LTL_f has exactly the same expressive power of FOL.

2.5.2 PLTL-to-FOL Encoding

As we have previously seen for LTL_f, in the current section we describe the translation function for a PLTL formula. Here, we also have a first-order language augmented with monadic predicates *prev*, *<* and *=* plus two constants 0 and *last*. Then, we have our *finite linear ordered FOL interpretations* under the form of $\mathcal{I} = (\Delta^I, \cdot^{\mathcal{I}})$, where the domain is $\Delta^I = \{0, \dots, n\}$ with $n \in \mathbb{N}$, and the interpretation function $\cdot^{\mathcal{I}}$ interprets the same binary predicates defined as 2.13 except that here we change *succ* with *prev* defined as follows:

$$\text{prev}^{\mathcal{I}} = \{(i, i-1) \mid i \in \{1, \dots, n\}\} \quad (2.14)$$

We can derive these operators from *<* as well:

$$\begin{aligned} \text{prev}(x, y) &\doteq y < x \wedge \neg \exists z. y < z < x \\ x = y &\doteq \forall z. x < z \equiv y < z \\ 0 &\doteq x \mid \neg \exists y. \text{prev}(x, y) \\ \text{last} &\doteq x \mid \neg \exists y. \text{prev}(y, x) \end{aligned}$$

In the exactly same way done before, we can give the definition of the translation function $\text{fol}_p(\varphi, x)$:

Definition 2.9. Given a PLTL formula φ and a variable x , the translation function $\text{fol}_p(\varphi, x)$, inductively defined on the PLTL formula's structure, returns the corresponding FOL formula open in x :

$$\begin{aligned} \text{fol}_p(a, x) &= a(x) \\ \text{fol}_p(\neg \varphi, x) &= \neg \text{fol}_p(\varphi, x) \\ \text{fol}_p(\varphi_1 \wedge \varphi_2, x) &= \text{fol}_p(\varphi_1, x) \wedge \text{fol}_p(\varphi_2, x) \\ \text{fol}_p(\varphi_1 \vee \varphi_2, x) &= \text{fol}_p(\varphi_1, x) \vee \text{fol}_p(\varphi_2, x) \\ \text{fol}_p(\ominus \varphi, x) &= \exists y. \text{prev}(x, y) \wedge y \geq 0 \wedge \text{fol}_p(\varphi, y) \\ \text{fol}_p(\varphi_1 \mathcal{S} \varphi_2, x) &= \exists y. 0 \leq y \leq x \wedge \text{fol}_p(\varphi_2, y) \wedge \forall z. y < z \leq x \Rightarrow \text{fol}_p(\varphi_1, z) \end{aligned}$$

Consider a finite trace ρ , the corresponding FOL interpretation \mathcal{I} is defined as in Section 2.5.1. The following Theorem ensures that a finite trace ρ satisfies an PLTL formula φ iff the corresponding finite linear ordered FOL interpretation \mathcal{I} of ρ models $\text{fol}_p(\varphi, \text{last})$.

Theorem 2.8. (*Kamp, 1968*) Given a PLTL formula φ , a finite trace ρ , and the corresponding interpretation \mathcal{I} of ρ , we have that

$$\rho \models \varphi \text{ iff } \mathcal{I} \models \text{fol}_p(\varphi, \text{last})$$

where $\text{last} = \text{length}(\rho) - 1$.

2.5.3 MONA and FOL-to-MONA Encoding

In the following, firstly we introduce the MONA tool highlighting its main features, how it works and what is its role in this thesis. Secondly, we concentrate on the MONA syntax and we describe the algorithm to translate a FOL formula into a MONA program.

MONA

MONA (Elgaard et al., 1998) is a sophisticated tool written in C/C++ for the construction of symbolic DFA from logical specifications. This tool has been implemented starting from 1997 from the BRICS (a research center in computer science located at the Aarhus University) with the aim of efficiently implementing decision procedures for the *Weak Second-order Theory of One or Two successors* (ws1s/ws2s). These two theories are also called monadic (from here the name of the tool) second-order logics and are decidable² since allowed second-order variables are interpreted as a finite set of numbers. Moreover, the ws1s theory is a fragment of arithmetic augmented with second-order quantification over finite sets of natural numbers. Indeed, first-order terms represents just natural numbers. Furthermore, ws1s has not the addition operator because that would make the theory undecidable, however there is the unary predicate $+1$ that stands for the successor function. On the other hand, ws2s is a generalization of ws1s to tree structures. Hence, MONA efficiently translates ws1s and ws2s formulas respectively into minimum DFAs and GTAs (Guided Tree Automata (Biehl et al., 1996)), representing them by shared, multi-terminal BDDs (Binary Decision Diagrams (Henriksen et al., 1995)). Having considered the polyedric features of MONA, we will only use the translation to DFAs.

MONA has a lot of possible applications that have been published during the years. Additionally, thanks to its APIs, it could be used both as a standalone tool and as an integrated tool for other programs. Some examples of MONA usage are the following:

- Hardware verification
- Controller systems
- Program and Protocol verification
- Software Engineering

At this point, we can explain how MONA works, at least for the part related to the DFA construction from a FOL formula. However, before doing that, we would like to clarify what the exact role of MONA is within this thesis. As stated before and as we will see in Chapter 3, MONA has been employed as a tool that translates a monadic FOL formula on finite linearly ordered domains, encoded as a M2L-Str³, into a minimum DFA.

Now, we can briefly describe how MONA works.

²A logic is decidable if there exists an algorithm such that for any given formula it determines its truth value.

³M2L-Str is a slight variation of ws1s where formulas are interpreted over *finite string* models, rather than *infinite string* models

FOL-to-MONA Encoding

The MONA syntax is quite similar to the WS1S syntax, but it has its own method to define variables and it has been enhanced with some special details, also known as syntactic sugar, making the overall language more readable and allowing to express things more clearly and more concisely.

MONA is executed on a file, with *.mona* extension, in which we can find some declarations and WS1S/WS2S formulas. We will refer to such file as the *.mona* program, henceforth. After the execution of the tool with a *.mona* program, we get a DFA. Additionally, MONA carries out an analysis of the program by recognizing the set of satisfying interpretations for the program. Let us consider the following example (Klarlund and Møller, 2001):

Example 2.5. A simple.mona program:

```

1  var2 P,Q;
2  P\Q = {0,4} union {1,2};

```

First, we have declared P and Q as second-order variables. After that, we have defined a formula telling that the set difference between P and Q is the union of set $\{0,4\}$ and $\{1,2\}$. Obviously, this formula is not always true, nonetheless there is an interpretation that satisfies it. For instance, the assignments $\{0,1,2,4\}$ to P and $\{5\}$ to Q . This interpretation can also be represented as a bit string for each variable, where positions in the string correspond to natural numbers, 1 means that the number is in the set (remember that a second-order variable is a set) whereas 0 means that is not. In this case, we would have $P \rightarrow 111010$ and $Q \rightarrow 000001$. Thus, it is possible to define a *language* associated to these bit strings and, since it is *regular*, it is also possible to build a DFA. Moreover, MONA assumes that all defined formulas in the program are in conjunct and each statement should be terminated by a semicolon. There are also additional elements consisting the MONA syntax depicted in Figure 2.1. As we can see from that Figure, there are also quantifiers and all usual logical connectives (i.e. those used in FOL). In addition, since we would like to write FOL on *finite linearly ordered domains*, we should enable the M2L-Str mode specifying `m2l-str;` at the beginning of the MONA program. Actually, `m2l-str;` is a shortcut for:

```

1  ws1s;
2  var2 $ where ~ex1 p where true: p notin $ & p+1 in $;
3  allpos $;
4  defaultwhere1(p) = p in $;
5  defaultwhere2(P) = P sub $;

```

At the first line, it is declared the intent to use exclusively WS1S. Then, at line 2, there is the declaration of a second-order variable $\$$ ensuring it to always have the value $\{0, \dots, n-1\}$ for some n . Likewise, it is needed the declaration at line 3 to bound the domain of interest. Lastly, at lines 4 and 5, the program restrict all first- and second-order variables to $\$$.

Numbers (1st order terms)		Formulas (0th order terms)			Formulas (0th order terms)		
0	0	0th order arguments			1st order arguments		
+	+	¬	~		<	<	
-	-	∧	&		>	>	
		∨			≤	<=	
		⇒	=>		≥	>=	
		⇔	<=>		=	=	
		∃	ex0	ex1	ex2	≠	~=
		∀	all0	all1	all2	2nd order arguments	
					⊆	sub	
					=	=	
					≠	~=	
					1st/2nd order arguments		
					∈	in	
					∉	notin	

Figure 2.1. The essential MONA syntax.

At this point, since we have illustrated all the necessary stuff for the translation, we are able to give the FOL-to-MONA encoding with some examples.

To begin with, all usual logic operators can be encoded following the table in Figure 2.1. Secondly, to encode the *succ* and *prev* monadic predicates respectively defined in Equations 2.13 and 2.14 we use the successor and predecessor built-in operators as follows:

$$succ(x, y) \doteq y=x+1$$

$$prev(x, y) \doteq y=x-1$$

Additionally, the two constants 0 and *last* already defined in 2.13 are encoded as 0 and *max(\$)*, respectively. Thirdly, to express existential and universal quantifiers we use the corresponding syntax as follows:

$$\exists p. \doteq \text{ex1 } p:$$

$$\forall p. \doteq \text{all1 } p:$$

Then, we can express first-order predicates symbols with set containment. For instance, if we have $A(x)$, before we must declare it as *var2 A*; and, then, encode it as *x in A*, whereas its negation ($\neg A(x)$) would be *x notin A*. Finally, *true* and *false* remain the same. In the following, we give some examples.

Example 2.6. FOL-to-MONA encoding examples:

- Suppose we have the LTL_f formula $\Diamond G$, its translation to FOL according to Definition 2.8 is:

$$\exists y. 0 \leq y \leq last \wedge G(y) \quad (2.15)$$

(we have not included the last part $\forall z. 0 \leq z < y \Rightarrow true$ since it is trivially *true*). The MONA program corresponding to the formula in 2.15 is the following:

```

1 m2l-str;
2 var2 G;
3 ex1 y: 0<=y & y<=max($) & y in G;
```

- Suppose we have the LTL_f formula $\Box G$, its translation to FOL according to Definition 2.8 is:

$$\neg(\exists y. 0 \leq y \leq last \wedge \neg G(y)) \quad (2.16)$$

The MONA program corresponding to the formula in 2.16 is the following:

```

1 m2l-str;
2 var2 G;
3 ~(ex1 y: 0<=y & y<=max($) & y notin G);
```

- Suppose we have the PLTL formula $A \mathcal{S} B$, its translation to FOL according to Definition 2.9 is:

$$\exists y. 0 \leq y \leq last \wedge B(y) \wedge \forall z. y < z \leq last \Rightarrow A(z) \quad (2.17)$$

The MONA program corresponding to the formula in 2.17 is the following:

```

1 m2l-str;
2 var2 A,B;
3 (ex1 y: 0<=y & y<=max($) & y in B & (all1 z: y<z & z<=max($) => z in A));
```

2.6 Summary

In this chapter, we have illustrated the theoretical framework, consisted of LTL, LTL_f and PLTL formalisms, underlying the thesis. These formal languages have been described focusing the attention on their syntax, semantics and interesting properties. Besides, we have talked about the theory behind the translation procedure of LTL_f and PLTL formulas to DFAs. Finally, we have presented the MONA tool explaining in details the encoding process starting from an LTL_f /PLTL formula to a MONA program passing through a FOL translation.

Chapter 3

LTL_f2DFA

In this chapter we will present [LTL_f2DFA](#), a software package written in Python.

3.1 Introduction

LTL_f2DFA is a Python tool that processes a given LTL_f/PLTL formula and generates the corresponding minimized DFA using MONA ([Elgaard et al., 1998](#)). In addition, it offers the possibility to compute the DFA with or without the DECLARE assumption ([De Giacomo et al., 2014](#)). The main features provided by the library are:

- parsing an LTL_f/PLTL formula;
- translation of an LTL_f/PLTL formula to MONA program;
- conversion of an LTL_f/PLTL formula to DFA automaton.

LTL_f2DFA can be used with Python \geq 3.6 and has the following dependencies:

- [PLY](#), a pure-Python implementation of the popular compiler construction tools [Lex and Yacc](#). It has been employed for parsing the input LTL_f formula;
- [MONA](#), a C++ tool that translates formulas to DFA. It has been used for the generation of the DFA;
- [Dotpy](#), a Python library able to parse and modify `.dot` files. It has been utilized for post-processing the MONA output.

The package is available to download on [PyPI](#) and you can install it by typing in the terminal:

```
pip install ltlf2dfa
```

All the code is available online on [GitHub](#)¹, it is open source and it is released under the [MIT License](#). Moreover, LTL_f2DFA can also be tried online at ltlf2dfa.diag.uniroma1.it.

¹<https://github.com/Francesco17/LTLf2DFA>

3.2 Package Structure

The structure of the LTL_f2DFA package is quite simple. It consists of a main folder called `ltlf2dfa/` which hosts the most important library's modules:

- `Lexer.py`, where the `Lexer` class is defined;
- `Parser.py`, where the `Parser` class is defined;
- `Translator.py`, where the main APIs for the translation are defined;
- `DotHandler.py`, where the MONA output is post-processed.

In the following paragraphs we will explore each module in detail.

3.2.1 `Lexer.py`

In the `Lexer.py` module we can find the declaration of the `MyLexer` class which is in charge of handling the input string and tokenizing it. Indeed, it implements a tokenizer that splits the input string into declared individual tokens. To our extent, we have defined the class as in Listing 3.1

Listing 3.1. `Lexer.py` module

```

1  import ply.lex as lex
2
3  class MyLexer(object):
4
5      reserved = {
6          'true':      'TRUE',
7          'false':     'FALSE',
8          'X':         'NEXT',
9          'W':         'WEAKNEXT',
10         'R':         'RELEASE',
11         'U':         'UNTIL',
12         'F':         'EVENTUALLY',
13         'G':         'GLOBALLY',
14         'Y':         'PASTNEXT', #PREVIOUS
15         'S':         'PASTUNTIL', #SINCE
16         'O':         'PASTEVENTUALLY', #ONCE
17         'H':         'PASTGLOBALLY' #HISTORICALLY
18     }
19     # List of token names. This is always required
20     tokens = (
21         'TERM',
22         'NOT',
23         'AND',

```

```

24         'OR',
25         'IMPLIES',
26         'DIMPLIES',
27         'LPAR',
28         'RPAR'
29     ) + tuple(reserved.values())
30
31     # Regular expression rules for simple tokens
32     t_TRUE = r'true'
33     t_FALSE = r'false'
34     t_AND = r'\&'
35     t_OR = r'\|'
36     t_IMPLIES = r'\->'
37     t_DIMPLIES = r'\<->'
38     t_NOT = r'\~'
39     t_LPAR = r'\('
40     t_RPAR = r'\)'
41     # FUTURE OPERATORS
42     t_NEXT = r'X'
43     t_WEAKNEXT = r'W'
44     t_RELEASE = r'R'
45     t_UNTIL = r'U'
46     t_EVENTUALLY = r'F'
47     t_GLOBALLY = r'G'
48     # PAST OPERATOR
49     t_PASTNEXT = r'Y'
50     t_PASTUNTIL = r'S'
51     t_PASTEVENTUALLY = r'O'
52     t_PASTGLOBALLY = r'H'
53
54     t_ignore = r'\n+'
55
56     def t_TERM(self, t):
57         r'(?![a-z])(?!true|false)[a-z]+'
58         t.type = MyLexer.reserved.get(t.value, 'TERM')
59         return t # Check for reserved words
60
61     def t_error(self, t):
62         print("Illegal character '%s' in the input formula" % t.value[0])
63         t.lexer.skip(1)
64
65     # Build the lexer
66     def build(self, **kwargs):

```

67

```
self.lexer = lex.lex(module=self, **kwargs)
```

Firstly, we have defined the reserved words within a dictionary so to match each reserved word with its identifier. Secondly, we have defined the tokens list with all possible tokens that can be produced by the lexer. This tokens list is always required for the implementation of a lexer. Then, each token has to be specified by writing a regular expression rule. If the token is simple it can be specified using only a string. Otherwise, for non trivial tokens we have to write the regular expression in a class method as for our token `TERM` in line 56. In that case, defining the token rule as a method is also useful when we would like to perform other actions. After that, we have a method to handle unrecognized tokens and, finally, we have written the function that builds the lexer.

3.2.2 Parser.py

In the `Parser.py` module we can find the declaration of `MyParser` class which implements the parsing component of PLY. The `MyParser` class operates after the `Lexer` has split the input string into known tokens. The main feature of the parser is to interpret and build the appropriate data structure for the given input. To this extent, the most important aspect of a parser is the definition of the *syntax*, usually specified in terms of a BNF² grammar, that should be unambiguous. Furthermore, `Yacc`, the parsing component of PLY, implements a parsing technique known as LR-parsing or shift-reduce parsing. In particular, this parsing technique works on a bottom up fashion that tries to recognize the right-hand-side of various grammar rules. Whenever a valid right-hand-side is found in the input, the appropriate action code is triggered and the grammar symbols are replaced by the grammar symbol on the left-hand-side and so on until there is no more rule to apply. The parser implementation is shown in Listing 3.2

Listing 3.2. `Parser.py` module

```
1 import ply.yacc as yacc
2 from ltlf2dfa.Lexer import MyLexer
3
4 class MyParser(object):
5
6     def __init__(self):
7         self.lexer = MyLexer()
8         self.lexer.build()
9         self.tokens = self.lexer.tokens
10        self.parser = yacc.yacc(module=self)
11        self.precedence = (
12
13            ('nonassoc', 'LPAR', 'RPAR'),
14            ('left', 'AND', 'OR', 'IMPLIES', 'DIMPLIES', 'UNTIL', \
15             'RELEASE', 'PASTUNTIL'),
```

²The Backus–Naur form is a notation technique for context-free grammars.


```

16         ('right', 'NEXT', 'WEAKNEXT', 'EVENTUALLY', \
17         'GLOBALLY', 'PASTNEXT', 'PASTEVENTUALLY', 'PASTGLOBALLY'),
18         ('right', 'NOT')
19     )
20
21     def __call__(self, s, **kwargs):
22         return self.parser.parse(s, lexer=self.lexer.lexer)
23
24     def p_formula(self, p):
25         '''
26         formula : formula AND formula
27                 | formula OR formula
28                 | formula IMPLIES formula
29                 | formula DIMPLIES formula
30                 | formula UNTIL formula
31                 | formula RELEASE formula
32                 | formula PASTUNTIL formula
33                 | NEXT formula
34                 | WEAKNEXT formula
35                 | EVENTUALLY formula
36                 | GLOBALLY formula
37                 | PASTNEXT formula
38                 | PASTEVENTUALLY formula
39                 | PASTGLOBALLY formula
40                 | NOT formula
41                 | TRUE
42                 | FALSE
43                 | TERM
44         '''
45
46         if len(p) == 2: p[0] = p[1]
47         elif len(p) == 3:
48             if p[1] == 'F': # F(a) == true UNTIL A
49                 p[0] = ('U', 'true', p[2])
50             elif p[1] == 'G': # G(a) == not(eventually (not A))
51                 p[0] = ('~', ('U', 'true', ('~', p[2])))
52             elif p[1] == 'O': # O(a) = true SINCE A
53                 p[0] = ('S', 'true', p[2])
54             elif p[1] == 'H': # H(a) == not(pasteventually(not A))
55                 p[0] = ('~', ('S', 'true', ('~', p[2])))
56             elif p[1] == 'W':
57                 p[0] = ('~', ('X', ('~', p[2])))
58         else:

```

```

59         p[0] = (p[1], p[2])
60     elif len(p) == 4:
61         if p[2] == '>':
62             p[0] = ('|', ('~', p[1]), p[3])
63         elif p[2] == '<->':
64             p[0] = ('&', ('|', ('~', p[1]), p[3]), ('|', ('~', p[3]), \
65                 p[1]))
66         elif p[2] == 'R':
67             p[0] = ('~', ('U', ('~', p[1]), ('~', p[3])))
68         else:
69             p[0] = (p[2], p[1], p[3])
70     else: raise ValueError
71
72
73     def p_expr_group(self, p):
74         '''
75         formula : LPAR formula RPAR
76         '''
77         p[0] = p[2]
78
79     def p_error(self, p):
80         raise ValueError("Syntax error in input! %s" %str(p))

```

As we can see, as soon as the parser is instantiated it builds the lexer, gets the tokens and defines their precedence if needed. Then, we have defined methods of the `MyParser` class that are in charge of constructing the syntax tree structure from tokens found by the lexer in the input string. In our case, we have chosen to use as data structure a tuple of tuples as it is the one of the simplest data structure in Python. In general, a tuple of tuples represents a tree where each node represents an item present in the formula.

For instance, the LTL_f formula $\varphi = G(a \rightarrow Xb)$ is represented as $(\sim, (U, true, (\sim, (|, (\sim, a), (X, b))))))$ and it corresponds to a tree as the one depicted in Figure 3.1. Finally, as in the `MyLexer` class, we have to handle errors defining a specific method.

LTL_f 2DFA can be used just for the parsing phase of an LTL_f /PLTL formula as shown in Listing 3.3.

Listing 3.3. How to use only the parsing phase of LTL_f 2DFA.

```

1 from ltlf2dfa.Parser import MyParser
2
3 formula = "G(a->Xb)"
4 parser = MyParser()
5 parsed_formula = parser(formula)
6
7 print(parsed_formula) # syntax tree as tuple of tuples

```

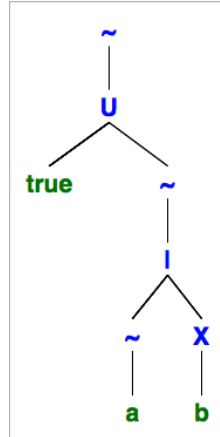


Figure 3.1. The syntax tree generated for the formula " $G(a \sim Xb)$ ". Symbols are in green while operators are in blue.

3.2.3 Translator.py

The `Translator.py` module contains the majority of APIs that the `LTLf2DFA` package exposes. Indeed, this module consists of a `Translator` class which concerns the core feature of the package: the translation of an `LTLf/PLTL` formula into the corresponding minimum DFA. Since the package takes advantage of the MONA tool for the formula conversion, the `Translator` class has to translate first the given formula into the syntax recognized by MONA, then create the input program for MONA and, finally, invoke MONA to get back the resulting DFA in the Graphviz³ format. The main methods of the `Translator` class are:

- `translate()`, which starting from the formula syntax tree generated (Figure 3.1) in the parsing phase translates it into a string using the syntax of MONA;
- `createMonafile(flag)`, which, as the name suggests, creates the program `.mona` that will be given as input to MONA. The flag parameter is going to be `True` or `False` whether we need to compute also DECLARE assumptions or not;
- `invoke_mona()`, which invokes MONA in order to obtain the DFA.

Now we will go into details of the methods stated above showing their implementation.

The translate method

The `translate` method is a crucial step towards reaching a good result and performance. Formally, the translation procedure from an `LTLf/PLTL` formula to the MONA syntax is done passing through FOL as shown in 3.1.

$$\text{LTL}_f/\text{PLTL} \rightarrow \text{FOL} \rightarrow \text{MONA} \quad (3.1)$$

³Graphviz is open source graph visualization software. For further details see [https://www. .org](https://www.graphviz.org)

The former translation from LTL_f/PLTL to FOL is done accordingly to (De Giacomo and Vardi, 2013), while the latter follows from (Klarlund and Møller, 2001). In Listing 3.4 we can see the translation's implementation. Three dots ... represent omitted code.

Listing 3.4. The translate method.

```

1  import ...
2
3  class Translator:
4      ...
5
6      def translate(self):
7          self.translated_formula = translate_bis(self.parsed_formula, \
8              var='v_0')+";\n"
9
10     ...
11
12 def translate_bis(formula_tree, var):
13     if type(formula_tree) == tuple:
14         #enable this print to see the tree pruning
15         # print(self.parsed_formula)
16         # print(var)
17         if formula_tree[0] == '&':
18             # print('computed tree: ' + str(self.parsed_formula))
19             if var == 'v_0':
20                 a = translate_bis(formula_tree[1], '0')
21                 b = translate_bis(formula_tree[2], '0')
22             else:
23                 a = translate_bis(formula_tree[1], var)
24                 b = translate_bis(formula_tree[2], var)
25             if a == 'false' or b == 'false':
26                 return 'false'
27             elif a == 'true':
28                 if b == 'true': return 'true'
29                 else: return b
30             elif b == 'true': return a
31             else: return '('+a+'&' + b+')'
32         elif formula_tree[0] == '|':
33             # print('computed tree: ' + str(self.parsed_formula))
34             if var == 'v_0':
35                 a = translate_bis(formula_tree[1], '0')
36                 b = translate_bis(formula_tree[2], '0')
37             else:
38                 a = translate_bis(formula_tree[1], var)
39                 b = translate_bis(formula_tree[2], var)

```

```

40     if a == 'true' or b == 'true':
41         return 'true'
42     elif a == 'false':
43         if b == 'true': return 'true'
44         elif b == 'false': return 'false'
45         else: return b
46     elif b == 'false': return a
47     else: return '('+a+'|'+b+')'
48 elif formula_tree[0] == '~':
49     # print('computed tree: ' + str(self.parsed_formula))
50     if var == 'v_0': a = translate_bis(formula_tree[1], '0')
51     else: a = translate_bis(formula_tree[1], var)
52     if a == 'true': return 'false'
53     elif a == 'false': return 'true'
54     else: return '~('+ a +')'
55 elif formula_tree[0] == 'X':
56     # print('computed tree: ' + str(self.parsed_formula))
57     new_var = _next(var)
58     a = translate_bis(formula_tree[1],new_var)
59     if var == 'v_0':
60         return '('+ 'ex1'+new_var+':'+ new_var +'_=1'+ '&'+ \
61             a +')'
62     else:
63         return '('+ 'ex1'+new_var+':'+ new_var +'_=' + var + \
64             '+1'+ '&'+ a +')'
65 elif formula_tree[0] == 'U':
66     # print('computed tree: ' + str(self.parsed_formula))
67     new_var = _next(var)
68     new_new_var = _next(new_var)
69     a = translate_bis(formula_tree[2],new_var)
70     b = translate_bis(formula_tree[1],new_new_var)
71
72     if var == 'v_0':
73         if b == 'true': return '('+ 'ex1'+new_var+':0<=' + \
74             new_var+ '&'+ new_var+ '<=max($)&'+ a +')'
75         elif a == 'true': return '('+ 'ex1'+new_var+':0<=' + \
76             new_var+ '&'+ new_var+ '<=max($)&all1'+ \
77             new_new_var+':0<=' + new_new_var+ '&'+ \
78             new_new_var+ '<'+ new_var+ '>'+ b +')'
79         elif a == 'false': return 'false'
80         else: return '('+ 'ex1'+new_var+':0<=' + new_var+ \
81             '&'+ new_var+ '<=max($)&'+ a + '&all1'+ \
82             new_new_var+':0<=' + new_new_var+ '&'+ \

```

```

83     new_new_var+'_<_'+new_var+'_>_'+b+'_')'
84 else:
85     if b == 'true': return '('+_+'ex1_'+new_var+':_'+var+ \
86         '_<=_'+new_var+'_&_'+new_var+'_<=_max($)_&_'+ a +'_)\'
87     elif a == 'true': return '('+_+'ex1_'+new_var+':_'+var+ \
88         '_<=_'+new_var+'_&_'+new_var+'_<=_max($)_&_all1_'+ \
89         new_new_var+':_'+var+'_<=_'+new_new_var+'_&_'+ \
90         new_new_var+'_<_'+new_var+'_>_'+b+'_')'
91     elif a == 'false': return 'false'
92     else: return '('+_+'ex1_'+new_var+':_'+var+'_<=_'+ \
93         new_var+'_&_'+new_var+'_<=_max($)_&_'+ a + \
94         '_&_all1_'+new_new_var+':_'+var+'_<=_'+new_new_var+ \
95         '_&_'+new_new_var+'_<_'+new_var+'_>_'+b+'_')'
96 elif formula_tree[0] == 'Y':
97     # print('computed tree: ' + str(self.parsed_formula))
98     new_var = _next(var)
99     a = translate_bis(formula_tree[1],new_var)
100    if var == 'v_0':
101        return '('+_+'ex1_'+new_var+':_'+ new_var + \
102            '_<=_max($)_-1_'+ '_&_max($)_>0_&_'+ a +')\'
103    else:
104        return '('+_+'ex1_'+new_var+':_'+ new_var + \
105            '_<_'+ var + '_-1_'+ '_&_'+new_var+'_>0_&_'+ a +')\'
106 elif formula_tree[0] == 'S':
107     # print('computed tree: ' + str(self.parsed_formula))
108     new_var = _next(var)
109     new_new_var = _next(new_var)
110     a = translate_bis(formula_tree[2],new_var)
111     b = translate_bis(formula_tree[1],new_new_var)
112
113    if var == 'v_0':
114        if b == 'true': return '('+_+'ex1_'+new_var+':_0_<=_'+ \
115            new_var+'_&_'+new_var+'_<=_max($)_&_'+ a +'_)\'
116        elif a == 'true': return '('+_+'ex1_'+new_var+ \
117            ':_0_<=_'+new_var+'_&_'+new_var+ \
118            '_<=_max($)_&_all1_'+new_new_var+':_'+new_var+'_<_'+ \
119            new_new_var+'_&_'+new_new_var+'_<=_max($)_>_'+b+'_')'
120        elif a == 'false': return 'false'
121        else: return '('+_+'ex1_'+new_var+':_0_<=_'+ \
122            new_var+'_&_'+new_var+'_<=_max($)_&_'+ a + \
123            '_&_all1_'+new_new_var+':_'+new_var+'_<_'+ \
124            new_new_var+'_&_'+new_new_var+'_<=_max($)_>_'+b+'_')'
125    else:

```

```

126         if b == 'true': return '('+ 'ex1'+new_var+ \
127             ':_0_<=_'+new_var+'_&_'+new_var+'_<=_max($)_&_'+ a +'_)\'
128         elif a == 'true': return '('+ 'ex1'+new_var+ \
129             ':_0_<=_'+new_var+'_&_'+new_var+'_<=_'+var+ \
130             '_&_all1'+new_new_var+':_'+new_var+'_<_'+ \
131             new_new_var+'_&_'+new_new_var+'_<=_'+var+'_>_'+b+')\'
132         elif a == 'false': return 'false'
133         else: return '('+ 'ex1'+new_var+':_0_<=_'+ \
134             new_var+'_&_'+new_var+'_<=_'+var+'_&_'+ a +'_&_all1'+ \
135             new_new_var+':_'+new_var+'_<_'+new_new_var+'_&_'+ \
136             new_new_var+'_<=_'+var+'_>_'+b+')\'
137     else:
138         # handling non-tuple cases
139         if formula_tree == 'true': return 'true'
140         elif formula_tree == 'true': return 'false'
141
142         # enable if you want to see recursion
143         # print('computed tree: '+ str(self.parsed_formula))
144
145         # BASE CASE OF RECURSION
146     else:
147         if formula_tree.isalpha():
148             if var == 'v_0':
149                 return '_0_in_'+ formula_tree.upper()
150             else:
151                 return var + '_in_' + formula_tree.upper()
152         else:
153             return var + '_in_' + formula_tree
154
155 def _next(var):
156     if var == '0': return 'v_1'
157     else:
158         s = var.split('_')
159         s[1] = str(int(s[1])+1)
160         return '_'.join(s)

```

As we can see, the `translate` method is actually very simple. In fact, it just calls the `translate_bis` function (line 12) to perform the proper translation. The function works in a recursive fashion taking as input the parsed formula and a variable and outputting a string containing the result. Obviously, when an instance of the `Translator` class is created the input formula is checked to have either only future or past operators. The base case of the recursion handles the translation of symbols as they are the leaves of the syntax tree composed in the parsing phase (Figure 3.1). On the other hand, the recursive step regards the handling of operators (non leaf components of the syntax

tree) which are in our case $\wedge, \vee, \neg, \bigcirc, \mathcal{U}, \ominus, \mathcal{S}$. During the translation, we simplify the resulting formula by avoiding pieces of the expression that are logically **True** or **False**. This simplification has two main advantages. First, it substantially reduces the length of the resulting formula, improving its readability. Second, it increases the computation performances of MONA. Additionally, since the MONA syntax requires the declaration of the free variables, the `translate_bis` function has to compute also the appropriate free variables declaration. In this terms, the translation function uses the `_next` function to compute the next variable each time is needed.

The `createMonafile` method

The `createMonafile` method is employed to write the program `.mona` and save it in the main directory. It takes as input a boolean flag that, as stated before, stands for indicating whether one would like to compute and add the **DECLARE** assumption or not. In particular, in formal logic, as stated in (De Giacomo et al., 2014), the **DECLARE** assumption is expressed as in 3.2.

$$\Box(\bigvee_{a \in \mathcal{P}} a) \wedge \Box(\bigwedge_{a, b \in \mathcal{P}, a \neq b} a \Rightarrow \neg b) \quad (3.2)$$

It consists essentially in two parts joined by the \wedge operator. The former indicates that it is always true that at each point in time only one symbol is *true*, while the latter means that always for each couple of different symbols in the formula if one is *true* the other must be *false*. The practical part can be seen in Listing 3.5.

Listing 3.5. The `createMonafile` method.

```

1  ...
2  def compute_declare_assumption(self):
3      pairs = list(it.combinations(self.alphabet, 2))
4
5      if pairs:
6          first_assumption = "~(ex1_<y:0<=y_&y<=max($)_&_~("
7          for symbol in self.alphabet:
8              if symbol == self.alphabet[-1]: first_assumption += \
9                  'y_in_<'+ symbol +'))'
10             else : first_assumption += 'y_in_<'+ symbol +'_|_|'
11
12         second_assumption = "~(ex1_<y:0<=y_&y<=max($)_&_~("
13         for pair in pairs:
14             if pair == pairs[-1]: second_assumption += '(y_notin_<'+ \
15                 pair[0]+'_|_y_notin_<'+pair[1]+' '))';
16             else: second_assumption += '(y_notin_<'+ pair[0]+' \
17                 '_|_y_notin_<'+pair[1]+' ')&_<'
18
19         return first_assumption +'_&_<'+ second_assumption

```



```

20         else:
21             return None
22
23     def buildMonaProgram(self, flag_for_declare):
24         if not self.alphabet and not self.translated_formula:
25             raise ValueError
26         else:
27             if flag_for_declare:
28                 if self.compute_declare_assumption() is None:
29                     if self.alphabet:
30                         return self.headerMona + \
31                             'var2_' + ",".join(self.alphabet) + ';\n' + \
32                             self.translated_formula
33                     else:
34                         return self.headerMona + self.translated_formula
35             else: return self.headerMona + 'var2_' + \
36                 ",".join(self.alphabet) + ';\n' + \
37                 self.translated_formula + \
38                 self.compute_declare_assumption()
39         else:
40             if self.alphabet:
41                 return self.headerMona + 'var2_' + \
42                     ",".join(self.alphabet) + ';\n' + \
43                     self.translated_formula
44             else:
45                 return self.headerMona + self.translated_formula
46
47     def createMonafile(self, flag):
48         program = self.buildMonaProgram(flag)
49         try:
50             with open('./automa.mona', 'w+') as file:
51                 file.write(program)
52                 file.close()
53         except IOError:
54             print('Problem with the opening of the file!')
55     ...

```

As shown in the code, the `createMonafile` method calls another method, the `buildMonaProgram` (line 23), which literally builds the *.mona* program by joining all pieces that should belong to it. Instead, regarding the `DECLARE` assumption, if needed, it is added to the *.mona* program directly translated through `compute_declare_assumption` method at line 2.

The `invoke_mona` method

Finally, the `invoke_mona` method is the one that executes the MONA compiled executable giving it the `.mona` program. Consequently, the DFA resulting from the computation of MONA will be stored in the main directory. As stated in 3.1, the LTL_f2DFA package requires MONA to be installed. Indeed, without this requirements the `invoke_mona` method will raise an error. The implementation can be seen in Listing 3.6.

Listing 3.6. The `invoke_mona` method.

```

1  ...
2      def invoke_mona(self, path='./inter-automa'):
3          if sys.platform == 'linux':
4              package_dir = os.path.dirname(os.path.abspath(__file__))
5              mona_path = pkg_resources.resource_filename('ltlf2dfa', 'mona')
6              if os.access(mona_path, os.X_OK): #check if mona is executable
7                  try:
8                      subprocess.call(package_dir+'./mona_u-gw' + \
9                                  './automa.mona>' + path + '.dot', shell=True)
10                 except subprocess.CalledProcessError as e:
11                     print(e)
12                     exit()
13                 except OSError as e:
14                     print(e)
15                     exit()
16             else:
17                 print('[ERROR]: MONA tool is not executable...')
18                 exit()
19         else:
20             try:
21                 subprocess.call('mona_u-gw./automa.mona>' + path + \
22                             '.dot', shell=True)
23             except subprocess.CalledProcessError as e:
24                 print(e)
25                 exit()
26             except OSError as e:
27                 print(e)
28                 exit()
29  ...

```

To the execute of the MONA tool we have leveraged the built-in module `subprocess` that enables to spawn new processes, connect to their input/output/error pipes, and obtain their return codes.

Unfortunately, the DFA resulting from MONA needs to be post-processed because of some extra states added for other purposes not relevant for us. This aspect will be better explained in the following subsection 3.2.4.

3.2.4 DotHandler.py

The `DotHandler` class has been created in order to manage separately and better the post-processing of the DFA, in *.dot* format, resulting from the computation of MONA. Indeed, since MONA has been developed for different purposes, its output has an additional initial state and transition that to our intent are completely meaningless.

Additionally, the interaction with the *.dot* format has been implemented thanks to the `dotpy` library (available on GitHub⁴) developed for this specific purpose paying particular attention to performances.

As we can see in the implementation of the `DotHandler` class in Listing 3.7, the main methods are `modify_dot` and `output_dot`.

Listing 3.7. The `DotHandler` class.

```

1 from dotpy.parser.parser import MyParser
2 import os
3
4 class DotHandler:
5
6     def __init__(self, path='./inter-automa.dot'):
7         self.dot_path = path
8         self.new_digraph = None
9
10    def modify_dot(self):
11        if os.path.isfile(self.dot_path):
12            parser = MyParser()
13            with open(self.dot_path, 'r') as f:
14                dot = f.read()
15                f.close()
16
17            graph = parser(dot)
18            if not graph.is_singleton():
19                graph.delete_node('0')
20                graph.delete_edge('init', '0')
21                graph.delete_edge('0', '1')
22                graph.add_edge('init', '1')
23            self.new_digraph = graph
24        else:
25            print('[ERROR] No file DOT exists')
26            exit()
27
28    def delete_intermediate_automaton(self):
29        if os.path.isfile(self.dot_path):
30            os.remove(self.dot_path)

```

⁴<https://github.com/Francesco17/dotpy>

```

31         return True
32     else:
33         return False
34
35     def output_dot(self, result_path='./automa.dot'):
36         try:
37             if self.delete_intermediate_automaton():
38                 with open(result_path, 'w+') as f:
39                     f.write(str(self.new_digraph))
40                     f.close()
41             else:
42                 raise IOError('[ERROR] Something wrong occurred in \
43                     the elimination of intermediate automaton.')
44         except IOError:
45             print('[ERROR] Problem with the opening of the file %s!' \
46                 %result_path)

```

The former method at line 10 takes advantage of the APIs exposed by `dotpy`. Especially, it parses the `.dot` file output of MONA (Figure 3.2a), deletes the starting node 0 and the edge from node 0 to node 1 and, finally, makes node 1 initial. Consequently, the latter method at line 35 manages the output of the final post-processed DFA (Figure 3.2b) and stores it in the main directory. For instance, in Figure 3.2 we can see graphically what is the outcome of the post-processing of the automaton corresponding to the formula $\varphi = \Box(a \Rightarrow Ob)$.

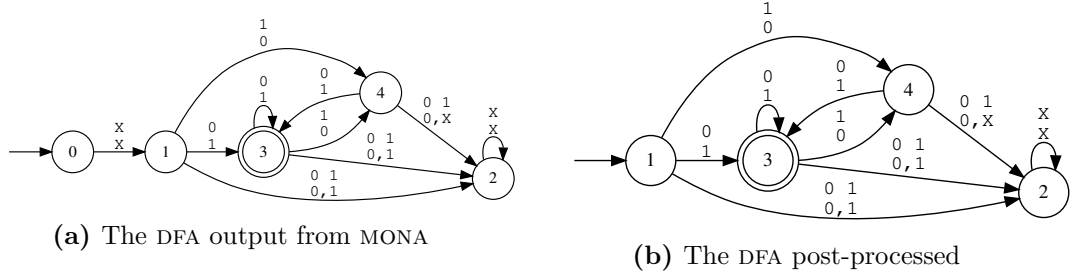


Figure 3.2. Before and after DFA post-processing

3.3 Interpreting LTL_f2DFA output

In this section, we explain through examples how to interpret and read the output DFA resulting from the LTL_f2DFA computation.

To begin with, circle nodes represents automaton states and doubled circle nodes represents those state that are accepting or final for the automaton. Labels on transitions stand for all possible values of formula symbols. A specific formula symbol in a transition must have one of the following values:

- **1**: means that the formula symbol is *true* in that transition;
- **0**: means that the formula symbol is *false* in that transition;
- **X**: means *don't care*, i.e. the formula symbol can be both *true* or *false* in that transition. In other words, it means that the transition can be done no matter is the actual value of the formula symbol.

Finally, when a formula has multiple symbols, the value of each symbol has to be read vertically in order of symbols declaration in the formula. In the following, we will give some examples.

Example 3.1. Let us consider the formula $\varphi = \Diamond g$ and its corresponding automaton depicted in Figure 3.3. The first transition without label indicates the initial state.

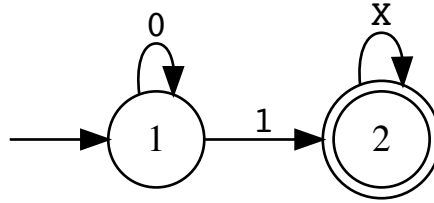


Figure 3.3. Minimum DFA for the formula $\varphi = \Diamond g$.

Then, the first loop on state 1 is done when g is *false*. Afterwards, the transition from state 1 to state 2 can be done only if g is *true*. Finally, the loop on state 2 has the label "X" meaning that once the automaton has arrived on state 2, whatever action it does (also g and $\neg g$) it remains on state 2, which is, by the way, final for the automaton.

Example 3.2. Let us consider the formula $\varphi = \Box(a \Rightarrow \Diamond b)$ and its corresponding automaton depicted in Figure 3.4. As usual, state 1 is the starting state. However, this

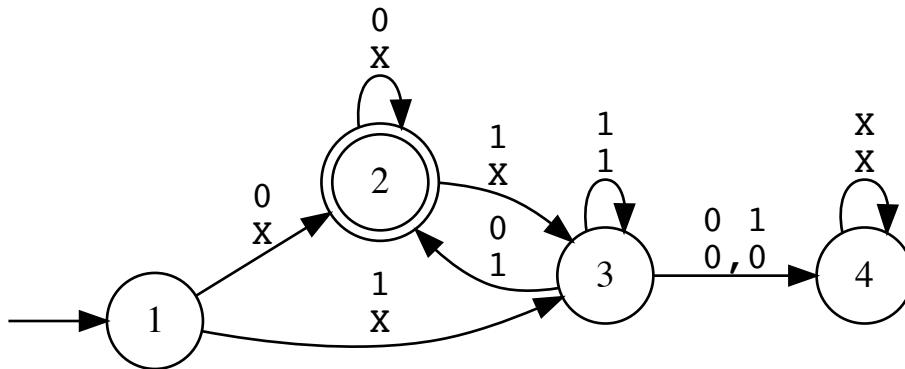


Figure 3.4. Minimum DFA for the formula $\varphi = \Diamond g$.

case is a little bit different from the previous one. Indeed, now the formula has two

symbols, namely a and b . Since the order of declaration is a, b , labels on transition has to be read vertically following this order. For instance, the label on transition from state 1 to state 2 reports $\frac{0}{x}$ meaning that the automaton can walk this transition only if a is *false* (in this case, b is *don't care*, i.e. it can assume whatever value). Additionally, another interesting transition to comment is the one that goes from state 3 to state 4. Its label reports $\frac{0,1}{0,0}$ meaning that the automaton will do that transition only if either a and b are *false* or a is *true* and b is *false*.

3.4 Comparison with FLLOAT

In this section, we will see how LTL_f2DFA performs compared to FLLOAT⁵, which is another Python package having the conversion of an LTL_f formula to a DFA as one of its features. In particular, FLLOAT handles LTL_f and LDL_f (*Linear Dynamic Logic on Finite Traces*) formulas, but not PLTL ones, but it provides support for syntax, semantics and parsing of PL (*Propositional Logic*), LTL_f and LDL_f formal languages. Additionally, its conversion is based on a different theoretical result with respect to LTL_f2DFA. Nevertheless, we can compare them on the generation of a DFA from an LTL_f formula.

The time execution benchmarks between these two packages was done over a set of 13 different interesting LTL_f formulas of different length. The comparison consisted of executing each package over the same set of formulas n number of times and, then, repeating the multiple execution m number of times. Thus, for each formula to be converted we obtained $n \times m$ results and, finally, we kept the minimum one (i.e. the best time execution result). After gathering the results, we can show them on a histogram where on the x -axis there are the LTL_f formulas and on the y -axis there is the minimum time (in seconds) needed for the package to convert it into a DFA (Figure 3.5). In the histogram, FLLOAT results are coloured in red, while LTL_f2DFA ones are depicted in blue. As we can see from the bar chart, in both packages the time needed to convert the formula increases as the length of the formula grows. However, it is notable that LTL_f2DFA is overall twice as fast as FLLOAT. This behaviour is due to the fact that these two packages operates in a different way. Indeed, while FLLOAT is a pure Python package, LTL_f2DFA uses, for the heavy task of the generation of the automaton, MONA that is written in C++. Hence, the real difference relies on the performance differences between C++ and Python programs. As a final remark, although LTL_f2DFA is much faster than FLLOAT, its time execution depends on the I/O system performance which can drastically reduce it. Thus, LTL_f2DFA results may arise depending on various factors such as disk speed, caching and filesystem.

⁵<https://github.com/MarcoFavorito/flloat>

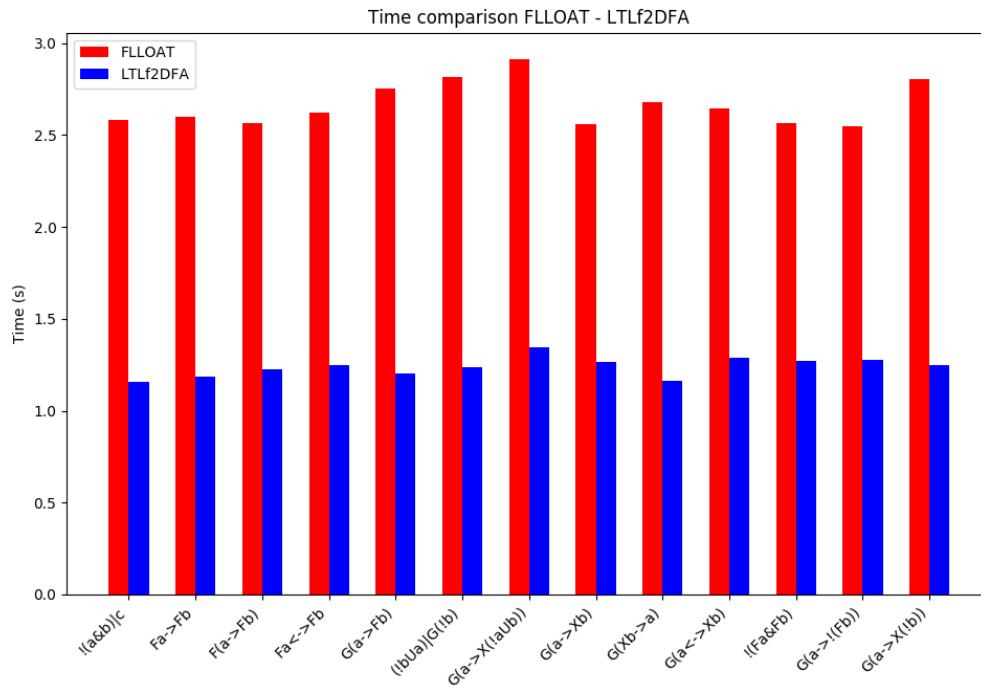


Figure 3.5. Time benchmarking of LTL_f2DFA wrt FLLOAT.

3.5 Discussion

In this chapter, we have presented the LTL_f2DFA Python package. We have also described the structure of the package, discussed in detail its implementation highlighting all the main features and, finally, seen how it performs in time relatively to the FLLOAT Python package.

Chapter 4

Planning for Extended Temporal Goals

In this chapter, we will define a new approach to the problem of non-deterministic planning for extended temporal goals. In particular, we will give a solution to this problem reducing it to a fully observable non-deterministic (FOND) problem and taking advantage of our tool LTL_f2DFA , presented in Chapter 3. First of all, we will introduce the main idea and motivations supporting our approach. Then, we will give some preliminaries explaining the Planning Domain Definition Language (PDDL) language and the FOND planning problem formally. After that, we will illustrate our solution with the encoding of temporal goals into a PDDL domain and problem. Finally, we will present our practical implementation of the proposed solution.

4.1 Idea and Motivations

Planning for temporally extended goals with *deterministic* actions has been well studied during the years starting from (Bacchus and Kabanza, 1998) and (Doherty and Kvarnstram, 2001). Two main reasons why temporally extended goals have been considered over the classical goals, viewed as a desirable set of final states to be reached, are because they are not limited in what they can specify and they allows us to restrict the manner used by the plan to reach the goals. Indeed, temporal extended goals are fundamental for the specification of a collection of real-world planning problems. Yet, many of these real-world planning problems have a *non-deterministic* behavior owing to unpredictable environmental conditions. However, planning for temporally extended goals with *non-deterministic* actions is a more challenging problem and has been of increasingly interest only in recent years with (Camacho et al., 2017).

In this scenario, we have devised a solution to this problem that exploits the translation of a temporal formula to a DFA, using LTL_f2DFA . In particular, our idea is the following: given a non-deterministic planning problem and a temporal formula, we first obtain the corresponding DFA of the temporal formula through LTL_f2DFA , then, we encode such a DFA into the non-deterministic planning domain. As a result, we have

reduced the original problem to a classic FOND planning problem. In other words, we compile extended temporal goals together with the original planning domain, specified in (PDDL), which is suitable for input to standard (FOND) planners.

4.2 Preliminaries

4.2.1 PDDL

4.2.2 Fully Observable Non Deterministic Planning

4.3 Encoding of Temporal Goals in PDDL

4.4 Implementation

4.4.1 Package Structure

4.4.2 PDDL

4.4.3 Automa

4.4.4 Main Module

4.5 Summary

Chapter 5

Janus

In this chapter, we will illustrate how our tool LTL_f2DFA presented in Chapter 3 can be efficiently employed in the field of Business Process Management, with particular attention to Process Mining. First of all, we will formally describe the theoretical framework of declarative process mining, introducing a new theorem that generalizes the concept of separated formulas only for DECLARE constraints. Then, in this context, we will thoroughly describe the implementation of the Janus algorithm (Cecconi et al., 2018), employing our tool LTL_f2DFA , for computing the interestingness degree of traces in real event logs. Finally, we will provide such a computation for a real log as an example.

5.1 Declarative Process Mining

In this section, we will present the theoretical framework of Business Process Management focusing our attention to declarative process mining. We will extend what described in Chapter 2 providing all additional concepts, definitions and theorems necessary to clearly understand the context.

Business Process Management (BPM) deals with discovering, modeling, analyzing and managing business processes in order to measure their productivity and to improve their performance. These tasks are carried out thanks to logging facilities that, nowadays, all BPM systems have. The extraction and the validation of temporal constraints from event logs (i.e. multi-sets of finite traces) are techniques consisting declarative process mining (Montali, 2010). Temporal constraints are expressed using LTL_f and/or PLTL and refers to activities present in traces. In the following, we will formally introduce what event logs and DECLARE (Pesic, 2008) are. Another important aspect to notice is that these constraints are meant to be checked upon the activation satisfying specific conditions. For these reasons, they are referred as *reactive constraints*.

Event Logs The event log is a collection of meaningful data that is the entry point for the consequent process mining. Formally, we consider this meaningful data expressed as a multiple traces containing a sequence of events belonging to the alphabet of symbols Σ . A single trace can be represented as $t = \langle e_1, e_2, \dots, e_n \rangle$ where e_i is the event occurring

at instant i and $n \in \mathbb{N}$ is the length of the trace t . Now, we can give the following definition:

Definition 5.1. An event log \mathcal{L} is defined as $\mathcal{L} = \{t_1, \dots, t_m\} \in \mathbb{M}(\Sigma^*)$ is a multi-set of traces t_j with $1 \leq j \leq m$, where $m \in \mathbb{N}$.

To better indicate the *multiplicity* of traces in \mathcal{L} , we can denote it as a superscript compacting the notation. For example, t_2^{10} stands for trace t_2 occurs 10 times in \mathcal{L} .

Example 5.1. $\mathcal{L} = \{t_1^{25}, t_2^{10}, t_3^{15}, t_4^{20}, t_5^5, t_6^{10}\}$ is an event log of 85 traces, defined over the alphabet $\Sigma = \{a, b, c, \dots, i\}$. In \mathcal{L} we have the following traces:

$$\begin{aligned} t_1 &= \langle d, f, a, f, c, a, f, b, a, f \rangle \\ t_2 &= \langle f, e, d, c, b, a, g, h, i \rangle \\ t_3 &= \langle a, d, a, a, a, a, a, a, a, a, a, a, a, a, a, a, a, a, a, a, c \rangle \\ t_4 &= \langle d, b, a, b \rangle \\ t_5 &= \langle a, d, a, c, a \rangle \\ t_6 &= \langle b, c, d, e \rangle \end{aligned}$$

Furthermore, the event e_i occurring at instant i is denoted by $t(i)$, whereas the segment of t (i.e. the sub-trace) ranging from instant i to instant j , where $1 \leq i \leq j \leq n$ is denoted by $t_{[i:j]}$.

Apart from the formal model of event logs, we have real-world event logs that are logs with real data coming from different kind of data sources (e.g. databases, transaction logs, audit log, etc.). All available tools are evaluated against real-world logs. In practice, as we will see in the Section 5.3, the main way of representing real logs is the eXtensible Event Stream (XES) Standard¹, which is based on the well known XML.

DECLARE DECLARE is a language concerning declarative process modeling (Pesic, 2008) and consisting of standard templates based on (Dwyer et al., 1999) that was introduced to simplify the complexity of constraints semantics. Indeed, DECLARE constraints are expressed in LTL_f , but we will extend LTL_f with Past temporal operators ($LTLp_f$) for capturing also past modalities. In Table 5.1, we can see what are the corresponding LTL_f or $LTLp_f$ formulas for the most important DECLARE constraints.

Parameters in a template define tasks and they occurs as events in traces. In Example 5.2 we provide a glimpse of DECLARE patterns.

Example 5.2. Interesting DECLARE templates (Maggi et al., 2013)

- PRECEDENCE(a,b) means *if b occurs then a occurs before b*.
- RESPONSE(a,b) means *if a occurs then eventually b occurs after a*.
- CHAINPRECEDENCE(a,b) means *the occurrence of b imposes a to occur immediately before*.

¹<http://www.xes-standard.org>

Table 5.1. The most important DECLARE constraints expressed as LTL_{p_f} formulas and *reactive constraints*.

DECLARE constraint	LTL _{p_f} expression	RCon
PARTICIPATION(a)	$\Diamond a$	$t_{start} \mapsto \Diamond a$
INIT(a)	a	$t_{start} \mapsto a$
END(a)	$\Box \Diamond a$	$t_{end} \mapsto a$
RESPONDEDEXISTENCE(a,b)	$\Diamond a \Rightarrow \Diamond b$	$a \mapsto (\Diamond b \vee \Diamond b)$
RESPONSE(a,b)	$\Box(a \Rightarrow \Diamond b)$	$a \mapsto \Diamond b$
ALTERNATERESPONSE(a,b)	$\Box(a \Rightarrow \Diamond b) \wedge \Box(a \Rightarrow \bigcirc(\neg a \bullet b))$	$a \mapsto \bigcirc(\neg a \mathcal{U} b)$
CHAINRESPONSE(a,b)	$\Box(a \Rightarrow \Diamond b) \wedge \Box(a \Rightarrow \bigcirc b)$	$a \mapsto \bigcirc b$
PRECEDENCE(a,b)	$\neg b \bullet a$	$b \mapsto \Diamond a$
ALTERNATEPRECEDENCE(a,b)	$(\neg b \bullet a) \wedge \Box(a \Rightarrow \bigcirc(\neg b \bullet a))$	$b \mapsto \ominus(\neg b \mathcal{S} a)$
CHAINPRECEDENCE(a,b)	$(\neg b \bullet a) \wedge \Box(\bigcirc b \Rightarrow a)$	$b \mapsto \ominus a$

- ALTERNATERESPONCE(a,b) means if a occurs then eventually b occurs after a without other occurrences of a in between.

In addition, one can create his own DECLARE patterns tailored for his purposes. In this way, the DECLARE standard template can be customized.

A given DECLARE constraint is verified over traces and those traces *satisfy* it if they do not *violate* it. Here, it is important to notice that these constraints are prone to the principle of *ex falso quod libet*, namely they can be satisfied even without being activated. This represents a big issue for process mining because mining techniques might misunderstand the actual behavior of a process. The solution to this problem is to compute whether a constraint is satisfied or not only upon activation. However, we will see later how to overcome this problem in the Section 5.2.

Now, we give some definitions:

Definition 5.2. (Gabbay, 1989) Given an LTL_{p_f} formula φ , we call it *pure past* formula ($\varphi^{\blacktriangleleft}$) if it consists of only past operators; *pure present* formula ($\varphi^{\blacktriangledown}$) if it has not any temporal operators; *pure future* formula ($\varphi^{\blacktriangleright}$) if it consists of only future operators.

Example 5.3. Pure formulas:

- $\Box(a \Rightarrow \Diamond b)$ is a **pure past** formula;
- $a \Rightarrow (b \wedge c)$ is a **pure present** formula
- $\Box(a \Rightarrow \bigcirc b)$ is a **pure future** formula

The separation of an LTL_{p_f} formula to pure past/present/future formulas allows to conduct the analysis on sub-traces (i.e. one referring to the past and the other referring to the future) upon the activation. This is also known as bi-directional on-line analysis. To this extent, we rely on the Separation Theorem stated as follows:

Theorem 5.1. (*Gabbay, 1989*) Any propositional temporal formula φ can be rewritten as a boolean combination of pure temporal formulas.

Therefore, following Theorem 5.1, we can give the Definition of *separated formula* as follows:

Definition 5.3. (*Cecconi et al., 2018*) Let φ an LTLp_f formula over Σ . A temporal separation is a function $\mathcal{S} : \text{LTLp}_f \rightarrow 2^{\text{LTLp}_f \times \text{LTLp}_f \times \text{LTLp}_f}$ such that: $\mathcal{S}(\varphi) = \{(\varphi^\blacktriangleleft, \varphi^\blacktriangledown, \varphi^\blacktriangleright)_1, \dots, (\varphi^\blacktriangleleft, \varphi^\blacktriangledown, \varphi^\blacktriangleright)_m\}$ such that:

$$\varphi \equiv \bigvee_{j=1}^m (\varphi^\blacktriangleleft \wedge \varphi^\blacktriangledown \wedge \varphi^\blacktriangleright)_j \quad (5.1)$$

where $\varphi^\blacktriangleleft$, $\varphi^\blacktriangledown$ and $\varphi^\blacktriangleright$ are pure formulas over Σ as in Definition 5.2.

Notice that Equation 5.1 is a disjunction of conjunction. Moreover, each triple consisting the image function of $\mathcal{S}(\varphi)$ is generally called *separated formula*. In the following, we give an example of separated formula.

Example 5.4. The separated formulas for $(\ominus a \vee \Diamond b)$:

$$(\ominus a \wedge \text{True} \wedge \text{True}) \bigvee (\text{True} \wedge \text{True} \wedge \Diamond b)$$

PUT HERE THE NEW GENERALIZATION OF THE THEOREM

Since the Janus algorithm relies on the construction of the automata for separated LTLp_f formulas, we will refer to notions explained previously in Section 2.4. The crucial point is that given a separated LTLp_f formula φ we can build a minimum DFA that *accepts* all and only the traces satisfying formula φ .

In the following sections, we will describe in details the Janus approach giving fundamentals definitions and theorems. Then, we will illustrate the algorithm and its practical implementation.

5.2 Janus

Declarative process modeling defines a list of DECLARE constraints to be satisfied during the execution of the process model. These constraints are of a reactive nature in the sense that the occurrence of some task bounds the occurrence of other activities. As anticipated in the previous Section, this kind of behavior might lead to the principle of *ex falso quod libet*, namely a constraint can be satisfied even though it is never activated. Here, the Janus approach (*Cecconi et al., 2018*) solves this problem allowing the user to indicate the activation condition for the constraint directly in the constraint formula. In this way, constraints are activated only if the activation condition holds. Therefore, we can refer to these constraints as *reactive constraints* (RCon).

Definition 5.4. (*Cecconi et al., 2018*) Given an alphabet Σ , let $\alpha \in \Sigma$ be an *activation* and φ be an LTLp_f formula over Σ . A Reactive Constraint (RCon) Ψ is a pair (α, φ) , denoted as $\Psi \doteq \alpha \mapsto \varphi$. We represent all the set of RCons over Σ as \mathcal{R} .

Hereafter, we will assume traces, automata, LTL_f formulas and RCons to be defined over the same alphabet Σ . In addition, in Table 5.1, we can see that DECLARE constraints can be converted in RCons. In Definition 5.4, we have seen that α in an RCon is called the *activation*. Indeed, it actually *activates* the corresponding constraint. As in (Cecconi et al., 2018), we give the following definitions that are the core concepts upon which the Janus algorithm is built.

Definition 5.5. (Cecconi et al., 2018) Given a finite trace $t \in \Sigma$ of length n , and an instant i , with $1 \leq i \leq n$, an RCon $\Psi \doteq \alpha \mapsto \varphi$ is activated at i if $t, i \models \alpha$. Thus, the event $t(i)$ is called the *activator* of Ψ . A trace in which at least an activator of Ψ exists, is *triggering* for Ψ .

Definition 5.6. (Cecconi et al., 2018) Given a finite trace $t \in \Sigma$ of length n , an instant i , with $1 \leq i \leq n$, an RCon $\Psi \doteq \alpha \mapsto \varphi$, Ψ is *interesting fulfilled* at i if $t, i \models \alpha$ and $t, i \models \varphi$. The RCon is *violated* at instant i if $t, i \models \alpha$ and $t, i \not\models \varphi$. Otherwise, the RCon is unaffected.

Definition 5.6 is called *interesting fulfilment*, since it formally solves the problem of constraint satisfaction without activation by identifying only those events where the activation condition holds and the RCon is fulfilled. Therefore, every time an event is the activator of an RCon, the RCon is checked for fulfilment. After these two definitions we have to define also an empirical method to compute the *interesting fulfilment* of an RCon for an event log.

Definition 5.7. (Cecconi et al., 2018) Given a finite trace $t \in \Sigma$ of length n and an RCon $\Psi \doteq \alpha \mapsto \varphi$, we define the *interestingness degree* function $\zeta : \mathcal{R} \times \Sigma^* \rightarrow [0, 1] \subseteq \mathbb{R}$ as follows:

$$\zeta(\Psi, t) = \begin{cases} \frac{|\{i : t, i \models \alpha \text{ and } t, i \models \varphi\}|}{|\{i : t, i \models \alpha\}|}, & \text{if } |\{i : t, i \models \alpha\}| \neq 0; \\ 0, & \text{otherwise} \end{cases}$$

Intuitively, the $\zeta(\Psi, t)$ function measures how many times the RCon Ψ is interesting fulfilled with respect to the total number of activations within the trace t . In Section 5.3, we will see the implementation of the Janus algorithm for computing the *interestingness degree* of traces in real-world event logs. Now, we give an example to better capture the concepts just defined.

Example 5.5. Let us consider the RCon $\Psi = b \mapsto \Diamond a$ and traces in the Example 5.1, we have the following:

- Ψ is activated in trace t_1 by $t_1(8)$, in t_2 by $t_2(5)$, in t_4 by $t_4(2)$ and $t_4(4)$ and in t_6 by $t_6(1)$. Hence, t_1 , t_2 , t_4 and t_6 are *triggering* for Ψ , while Ψ is not activated in t_3 and t_5 .
- Ψ is *interestingly fulfilled* by $t_1(8)$ in t_1 , by only $t_4(4)$ in t_4 . Moreover, Ψ is *violated* by $t_2(5)$ in t_2 , by $t_4(2)$ in t_4 and by $t_6(1)$ in t_6 . Finally, it is *unaffected* both in t_3 and t_5 .

- The *interestingness degree* of Ψ in t_1 is $\zeta(\Psi, t_1) = 1$, since it is activated and fulfilled only once. Then, the *interestingness degree* of Ψ in t_4 is $\zeta(\Psi, t_4) = 0.5$ because it is activated twice, but fulfilled only once. Finally, in all the other traces t_2, t_3, t_5 and t_6 is $\zeta(\Psi, t) = 0$.

As we have just seen, the fulfilment of an RCon, in a trace, relies on the verification of the corresponding LTLp_f formula over such a trace at the instant of activation. This process of verification of a formula φ on a trace can be achieved by constructing the related DFA \mathcal{A}_φ and checking whether such trace is accepted by \mathcal{A}_φ or not. To this extent, in the following, we have to give some other definitions and theorems.

First of all, since an LTLp_f formula could have both past and future temporal operators, in order to build its corresponding DFA we exploit the Theorem 5.1 by first splitting the LTLp_f formula into its separated formulas and, then, constructing the corresponding DFAs of that separated formulas. However, we need to know how to evaluate the separated formulas over a trace. We can now give the following Lemma and Theorem:

Lemma 5.2. (*Cecconi et al., 2018*) *Given a pure past formula $\varphi^\blacktriangleleft$, a pure present formula $\varphi^\blacktriangledown$, a pure future formula $\varphi^\blacktriangleright$, a finite trace $t \in \Sigma^*$ of length n and an instant i , with $1 \leq i \leq n$, the following holds true:*

- $t, i \models \varphi^\blacktriangleleft \equiv t_{[1,i]}, i \models \varphi^\blacktriangleleft$
- $t, i \models \varphi^\blacktriangledown \equiv t_{[i,i]}, i \models \varphi^\blacktriangledown$
- $t, i \models \varphi^\blacktriangleright \equiv t_{[i,n]}, i \models \varphi^\blacktriangleright$

The Lemma follows from the definition of the LTLp_f semantics. It is trivial to see that having, at instant i , a pure past formula, its semantics only cares about events preceding i , whereas a pure future formula cares only about events following the instant i .

Theorem 5.3. (*Cecconi et al., 2018*) *Given an LTLp_f formula φ , a finite trace $t \in \Sigma^*$ of length n and an instant i , with $1 \leq i \leq n$, we have that $t, i \models \varphi$ iff $t_{[1,i]}, i \models \varphi^\blacktriangleleft, t_{[i,i]}, i \models \varphi^\blacktriangledown$ and $t_{[i,n]}, i \models \varphi^\blacktriangleright$ for at least a $(\varphi^\blacktriangleleft, \varphi^\blacktriangledown, \varphi^\blacktriangleright) \in \mathcal{S}(\varphi)$.*

The proof follows from Theorem 5.1 and Lemma 5.2.

Example 5.6. Let us consider the RCon $\Psi = a \mapsto (\ominus b \vee \Diamond c)$ with $\varphi = (\ominus b \vee \Diamond c)$, its separated formulas $\mathcal{S}(\varphi) = \{(\ominus b, \text{True}, \text{True}), (\text{True}, \text{True}, \Diamond c)\}$ and trace $t_1 = \langle d, f, a, f, c, a, f, b, a, f \rangle$ taken from Example 5.1.

- $t_1, 3 \models \varphi$ if, apart from the *True* formulas that are satisfied, one of the following holds *true*:

1. $\langle d, f, a \rangle, 3 \models \ominus b$
2. $\langle a, f, c, a, f, b, a, f \rangle, 3 \models \Diamond c$

since the latter holds *true*, φ is satisfied by $t_1(3)$.

- $t_1, 6 \models \varphi$ if, apart from the *True* formulas that are satisfied, one of the following holds *true*:

1. $\langle d, f, a, f, c, a \rangle, 6 \models \ominus b$
2. $\langle a, f, b, a, f \rangle, 6 \models \Diamond c$

since both are not satisfied, we can conclude that φ is not satisfied by $t_1(6)$.

- $t_1, 9 \models \varphi$ if, apart from the *True* formulas that are satisfied, one of the following holds *true*:

1. $\langle d, f, a, f, c, a, f, b, a \rangle, 9 \models \ominus b$
2. $\langle a, f \rangle, 9 \models \Diamond c$

since the former holds *true*, φ is satisfied by $t_1(9)$.

At this point, we can start talking about separated formulas verification on a trace using their corresponding DFAs.

Definition 5.8. (Cecconi et al., 2018) Given a $LTLp_f$ formula φ , we define as *separated automata set* (sep.aut.set) $\mathcal{A}^{\blacktriangleleft\blacktriangledown\blacktriangleright} \in 2^{\mathcal{A} \times \mathcal{A} \times \mathcal{A}}$ the set of triples $\mathcal{A}^{\blacktriangleleft\blacktriangledown\blacktriangleright} = (\mathcal{A}^{\blacktriangleleft}, \mathcal{A}^{\blacktriangledown}, \mathcal{A}^{\blacktriangleright}) \in \mathcal{A} \times \mathcal{A} \times \mathcal{A}$ such that $\mathcal{A}^{\blacktriangleleft} \doteq \mathcal{A}_{\varphi^{\blacktriangleleft}}$, $\mathcal{A}^{\blacktriangledown} \doteq \mathcal{A}_{\varphi^{\blacktriangledown}}$ and $\mathcal{A}^{\blacktriangleright} \doteq \mathcal{A}_{\varphi^{\blacktriangleright}}$ for every $(\varphi^{\blacktriangleleft}, \varphi^{\blacktriangledown}, \varphi^{\blacktriangleright}) \in \mathcal{S}(\varphi)$.

As in Example 5.4, here we give its automata version.

Example 5.7. The sep.aut.set for $(\ominus a \vee \Diamond b)$ is:

$$\mathcal{A}^{\blacktriangleleft\blacktriangledown\blacktriangleright} = \{(\mathcal{A}_{\ominus a}, \mathcal{A}_{True}, \mathcal{A}_{True}), (\mathcal{A}_{True}, \mathcal{A}_{True}, \mathcal{A}_{\Diamond b})\}$$

Similarly to what we have seen before with Theorem 5.4, we can state the following:

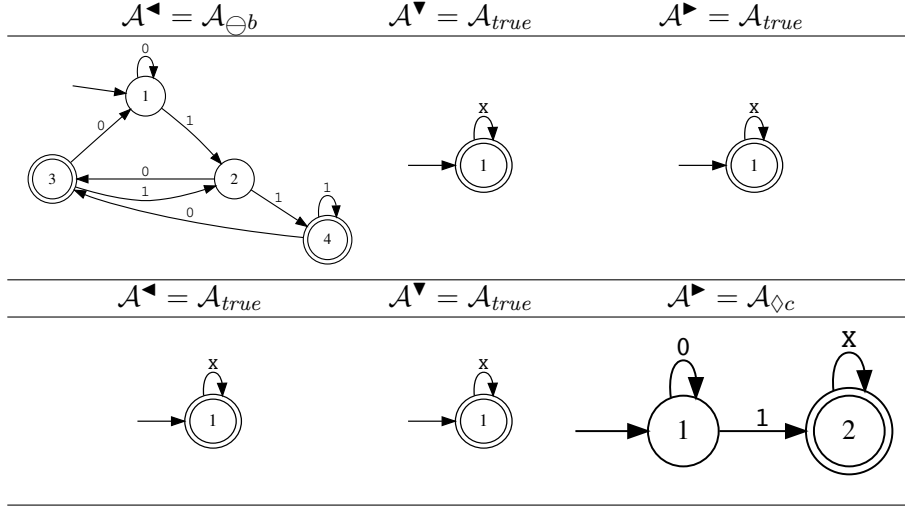
Theorem 5.4. (Cecconi et al., 2018) Given an $LTLp_f$ formula φ , its sep.aut.set $\mathcal{A}^{\blacktriangleleft\blacktriangledown\blacktriangleright}$, a finite trace $t \in \Sigma^*$ of length n and an instant i , with $1 \leq i \leq n$, we have that $t, i \models \varphi$ iff $t_{[1,i]}, i \in \mathcal{L}(\mathcal{A}^{\blacktriangleleft})$, $t_{[i,i]}, i \in \mathcal{L}(\mathcal{A}^{\blacktriangledown})$ and $t_{[i,n]}, i \in \mathcal{L}(\mathcal{A}^{\blacktriangleright})$ for at least a $(\mathcal{A}^{\blacktriangleleft}, \mathcal{A}^{\blacktriangledown}, \mathcal{A}^{\blacktriangleright}) \in \mathcal{A}^{\blacktriangleleft\blacktriangledown\blacktriangleright}$.

So far, we have described all theoretical results necessary for introducing and understanding how the Janus algorithm works. Now, we talk about automata generation given a pure past, pure present and a pure future formula possible thanks to our developed tool LTL_f2DFA .

Differently from what has been done in (Cecconi et al., 2018) for the automata construction, in this thesis we propose a version of the Janus algorithm that works with LTL_f2DFA . Indeed, as already seen in Chapter 3, LTL_f2DFA is able to directly generate the minimum DFA for a pure past formula (PLTL) without passing through its pure future (LTL_f) reversed formula. In particular, LTL_f2DFA has been employed in the Janus algorithm for the generation of the automaton corresponding to each formula in the triple $(\varphi^{\blacktriangleleft}, \varphi^{\blacktriangledown}, \varphi^{\blacktriangleright})$, for every triple $(\varphi^{\blacktriangleleft}, \varphi^{\blacktriangledown}, \varphi^{\blacktriangleright}) \in \mathcal{S}(\varphi)$. In Example 5.8, there are the DFAs output from LTL_f2DFA .

Example 5.8. Let us consider the RCon $\Psi = a \mapsto (\ominus b \vee \Diamond c)$ and its separated formula $\mathcal{S}(\varphi) = \{(\ominus b, \text{True}, \text{True}), (\text{True}, \text{True}, \Diamond c)\}$. The corresponding sep.aut.set $\mathcal{A}^{\blacktriangleleft\blacktriangleright}$ for each $(\varphi^{\blacktriangleleft}, \varphi^{\blacktriangledown}, \varphi^{\blacktriangleright}) \in \mathcal{S}(\varphi)$ is depicted in Table 5.2:

Table 5.2. Representation of the separated automata set for $\Psi = a \mapsto (\ominus b \vee \Diamond c)$



5.2.1 Algorithm

5.3 Implementation

In this section, we fully describe the practical implementation of the Janus algorithm given in Section 5.2.1. In particular, we give some general information about its features, dependencies and usage. Then, we focus on the package explaining how is structured and commenting highlights on the code. The implementation on this thesis is called JANUS, is written in Python and is a porting of the [Janus](#) proof-of-concept software project written in Java.

To begin with, the main goal of JANUS, as stated at the beginning, is to compute the *interestingness degree* of traces on event log. As a consequence, it also provides I/O facilities for three different event log formats, namely simple *.txt* files, *.csv* files and *.xes* files for real-world event logs. Furthermore, the formula φ in the RCon to be satisfied by traces is manually separated following Definition 5.3.

JANUS requires Python ≥ 3.6 and has the following dependencies:

- [LTL_f2DFA](#), presented in Chapter 3. As stated before, it has been used for the generation of DFAs;
- [OpyenXES](#), an open-source complete Python library for the XES Standard published in (Valdivieso et al., 2018). It has been used for dealing with XES parsing and management.

The JANUS software is an open-source project and available to download on GitHub².

5.3.1 Package Structure

The structure of the JANUS package is relatively simple. It consists of the following:

- `janus.py`: it is the main module of the package. It contains the actual implementation of the Janus algorithm.
- `janus/`: it is the directory containing all the necessary code to correctly implement the algorithm. It has three subfolders:
 - `io/`: it contains the `InputHandler.py` which is in charge of handling the event log given as input.
 - `automata/`: it consists of the `automa.py` file, the `parserAutoma.py` file and the `sepautset.py` file. In this folder, we find all the code for dealing with automata.
 - `formulas/`: it comprises the `formula.py` file and the `separatedFormula.py`. These files defines the logic for LTL_f formulas and RCons.
- `files/`: this folder is the place where there are event logs. From this folder, a specific event log is parsed.

5.3.2 I/O

The `InputHandler.py` file, included in the `io/` folder, has been developed separately from the main module since we wanted to use our algorithm regardless of the input file format. In particular, thanks to the relative `InputHandler` class (Listing 5.1), the tool can import a log from a simple text file, from a csv and, finally, from a XES file. Hence, the JANUS tool can be used not only with the XES format, but also with other more manageable file formats.

Listing 5.1. The `InputHandler.py` module

```

1 import csv
2 from opyenxes.data_in.XUniversalParser import XUniversalParser
3 from opyenxes.classification.XEventAttributeClassifier import \
4 XEventAttributeClassifier
5
6 class InputHandler:
7
8     def __init__(self, input_path):
9         self.input_path = input_path
10        self._event_log = None
11        self.load()

```

²<https://github.com/Francesco17/janus>

```

12
13 @property
14 def event_log(self):
15     return self._event_log
16
17 def load_txt(self):
18     try:
19         with open(self.input_path, 'r') as f:
20             self._event_log = set(tuple(i) for i in \
21                 [f.read().splitlines()])
22             f.close()
23     except:
24         raise IOError('[ERROR]: Unable to import text file')
25
26 def load_csv(self):
27     self._event_log = []
28     try:
29         with open(self.input_path, newline='', encoding='utf-8-sig') \
30             as f:
31             reader = csv.reader(f)
32             for row in reader:
33                 self._event_log.append(row[0])
34     except:
35         raise IOError('[ERROR]: Unable to import csv file')
36
37 def load_xes(self):
38     try:
39         with open(self.input_path) as log_file:
40             log = XUniversalParser().parse(log_file)[0]
41
42             # get classifiers
43             classifiers = []
44             for cl in log.get_classifiers():
45                 classifiers.append(str(cl))
46
47             classifier = XEventAttributeClassifier("activity", \
48                 [classifiers[0]])
49             log_list = list(map(lambda trace: \
50                 (map(classifier.get_class_identity, trace)), log))
51
52             self._event_log = set(tuple(trace) for trace in log_list)
53
54     except:

```

```

55         raise IOError('[ERROR]: Unable to import xes file')
56
57     def load(self):
58         if self.input_path.endswith('.txt'):
59             self.load_txt()
60         elif self.input_path.endswith('.csv'):
61             self.load_csv()
62         elif self.input_path.endswith('.xes'):
63             self.load_xes()
64         else:
65             raise ValueError('[ERROR]: File extension not recognized')

```

From Listing 5.1, we can see that the `InputHandler` class has a main method called `load` that depending on the format of the file given as input calls the corresponding method specific for that format. If the format is not among `.txt`, `.csv` and `.xes`, it raises an error. Consequently, every specific method parses the event log. In particular, at line 37, the `load_xes` method takes advantage of the OpyenXES library APIs using its parser and classifier. In Section 5.3.5, we will look at how an `InputHandler` object can be instantiated.

5.3.3 Automata

In the `automata/` folder there are files devoted to handle and manage automata. Firstly, the `parserAutoma.py` module is a collection of functions used for parsing the `.dot` file and instantiating the data structure representing the automaton. In Listing 5.2 is shown that collection of functions.

Listing 5.2. The `parserAutoma.py` module

```

1  import pydot
2  from janus.automata.automa import Automa
3
4  def get_file(path):
5      try:
6          with open(path, 'r') as file:
7              lines = file.readlines()
8              file.close()
9              return lines
10     except IOError:
11         print('[ERROR]: Not able to open the file from {}'.format(path))
12
13 def get_graph_from_dot(path):
14     try:
15         dot_graph = pydot.graph_from_dot_file(path)
16         return dot_graph[0]

```

```
17     except IOError:
18         print('[ERROR]:_Not_able_to_import_the_dot_file')
19
20 def get_final_label(label):
21
22     s1 = label.replace("_", "")
23     s2 = s1.replace("'", '')
24
25     if s2 == '':
26         return ['X']
27     elif len(s2) < 2:
28         return [s2]
29     else:
30         s3 = s2.replace(",", "")
31         s4 = s3.split('\\n')
32
33         leng_elem = len(s4[0])
34         temp = ''
35         inter_label = []
36         for i in range(leng_elem):
37             for elem in s4:
38                 temp += elem[i]
39             inter_label.append(temp)
40             temp = ''
41
42         return inter_label
43
44 def parse_dot(path, symbols):
45
46     graph = get_graph_from_dot(path)
47
48     nodes = []
49     for node in graph.get_nodes():
50         if node.get_name().isdigit():
51             nodes.append(node.get_name())
52         else: continue
53
54     states = set(nodes)
55     initial_state = sorted(nodes, key=int)[0]
56
57     lines = get_file(path)
58     accepting_states = set() # all accepting states of the automaton
59     for line in lines[7:]:
```

```

60     if line.strip() != 'node_␣[shape=circle];':
61         temp = line.replace(";\n", "")
62         accepting_states.add(temp.strip())
63     else:
64         break
65
66     sources = []
67     for elem in graph.get_edges():
68         if elem.get_source().isdigit():
69             sources.append(elem.get_source())
70         else: continue
71
72     i = 0
73     transitions = dict()
74     for source in sources:
75         label = graph.get_edges()[i].get_label()
76         final_label = get_final_label(label)
77         destination = graph.get_edges()[i].get_destination()
78         i += 1
79         for lab in final_label:
80             if source in transitions:
81                 transitions[source][lab] = destination
82             else:
83                 transitions[source] = dict({lab: destination})
84
85     #instantiation of automaton
86     automaton = Automa(
87         symbols=symbols,
88         alphabet={'0', '1', 'X'},
89         states=states,
90         initial_state=initial_state,
91         accepting_states=accepting_states,
92         transitions=transitions
93     )
94     return automaton

```

The most important function is called `parse_dot` (at line 44). It works as follows: given the path of a `.dot` file (the output of `LTLf2DFA`) and symbols used in the formula, it returns an instantiation of the `Automa` class retrieving all information about the DFA, namely all its states, the initial state, accepting states and, finally, its transitions.

Afterwards, there is the `automa.py` in which the `Automa` class is implemented. This class is the data structure representing the DFA that is output from our tool `LTLf2DFA`. It follows that in the `Automa` class there are methods able to perform transitions over the DFA, to tell whether if the automaton is in an accepting state or not and to tell

whether an input symbols can be read by the automaton or not. In addition, when an object is instantiated, it is checked to be a valid DFA. In Listing 5.3 the `Automa` class implementation is shown.

Listing 5.3. The `automa.py` module

```

1 import re
2
3 class Automa:
4     """
5     DFA Automa:
6     - symbols      => list() ;
7     - alphabet     => set() ;
8     - states       => set() ;
9     - initial_state => str() ;
10    - accepting_states => set() ;
11    - transitions   => dict(), where
12    **key**: *source* in states
13    **value**: {*action*: *destination*}
14    """
15
16    def __init__(self, symbols, alphabet, states, initial_state, \
17    accepting_states, transitions):
18        self.symbols = symbols
19        self.alphabet = alphabet
20        self.states = states
21        self._initial_state = initial_state
22        self.accepting_states = accepting_states
23        self.transitions = transitions
24        self._current_state = self._initial_state
25        self.validate()
26
27    def valide_transition_start_states(self):
28        for state in self.states:
29            if state not in self.transitions:
30                raise ValueError(
31                    'transition_start_state_{0} is missing'.format(
32                        state))
33
34    def validate_initial_state(self):
35        if self._initial_state not in self.states:
36            raise ValueError('initial_state is not defined as state')
37
38    def validate_accepting_states(self):
39        if any(not s in self.states for s in self.accepting_states):

```



```

40         raise ValueError('accepting_states_not_defined_as_state')
41
42     def validate_input_symbols(self):
43         alphabet_pattern = self.get_alphabet_pattern()
44         for state in self.states:
45             for action in self.transitions[state]:
46                 if not re.match(alphabet_pattern, action):
47                     raise ValueError('invalid_transition_found')
48
49     def get_alphabet_pattern(self):
50         return re.compile("(^[\"'+'.join(self.alphabet)+\"]+$)")
51
52     def validate(self):
53         self.validate_initial_state()
54         self.validate_accepting_states()
55         self.validate_transition_start_states()
56         self.validate_input_symbols()
57         return True
58
59     ...
60
61     @property
62     def current_state(self):
63         return self._current_state
64
65     @property
66     def initial_state(self):
67         return self._initial_state
68
69     def make_transition(self, action):
70         if action in self.symbols:
71             for act in self.transitions[self._current_state].keys():
72                 temp = dict(zip(self.symbols, [value for value in act]))
73                 additional = temp.copy()
74                 del additional[action]
75                 if (temp[action] == '1' or temp[action] == 'X') and \
76                     all(value in {'0', 'X'} for value in additional.values()):
77                     self._current_state = \
78                         self.transitions[self._current_state][act]
79                 else:
80                     continue
81         else:
82             number_of_symbols = len(self.symbols)

```

```

83         if number_of_symbols == 0: # true when there is True automa
84             self._current_state = \
85                 self.transitions[self._current_state]['X']
86         else:
87             if 'X'*number_of_symbols in \
88                 self.transitions[self._current_state]:
89                 self._current_state = \
90                     self.transitions[self._current_state]\
91                     ['X'*number_of_symbols]
92             elif '0'*number_of_symbols in \
93                 self.transitions[self._current_state]:
94                 self._current_state = \
95                     self.transitions[self._current_state]\
96                     ['0'*number_of_symbols]
97             else:
98                 raise ValueError(' [ERROR]: could not make transition')
99
100     def is_accepting(self):
101         if self._current_state in self.accepting_states:
102             return True
103         else:
104             return False
105
106     def accepts(self, input_symbol):
107         _current_state = self._current_state
108         self._current_state = self._initial_state
109         self.make_transition(input_symbol)
110         if self.is_accepting():
111             self._current_state = _current_state
112             return True
113         else:
114             self._current_state = _current_state
115             return False

```

Once an Automata object is instantiated, the method `validate` (line 52) checks whether the object is a valid DFA or not. In particular, it checks if the initial state and final states are actually states and it verifies that transitions are not made by invalid symbols. Then, the `make_transition` method at line 69 takes as input an action and make this action on the automaton, therefore modifying its current state. After that, the `is_accepting` method (line 100) simply tells whether the current state is accepting for the automaton itself or not. Finally, there is the `accepts` method at line 106, which given an input symbol returns *true* if it is accepted by the DFA.

As last module about automata, we illustrate the `sepautset.py`. It is the direct implementation of the `sep.aut.set` defined in 5.8. Indeed, this module contains the defi-

inition of the `SeparatedAutomataSet` class, namely the data structure that allow us to generate the corresponding *sep.aut.set*. Hence, it takes care of generating the set of separated automata starting from a list of separated formulas. We can see its implementation in Listing 5.4.

Listing 5.4. The `sepautset.py` module

```

1 from ltlf2dfa.Translator import Translator
2 from ltlf2dfa.DotHandler import DotHandler
3 from janus.automata.parserAutoma import parse_dot
4 import os, re
5
6 class SeparatedAutomataSet:
7
8     def __init__(self, separated_formulas_set):
9         self.separated_formulas_set = separated_formulas_set
10        self._automa_set = self.compute_automa()
11
12    @property
13    def automa_set(self):
14        return self._automa_set
15
16    def build_automaton(self, triple):
17        automata_list = []
18        for formula in triple:
19            symbols = re.findall('[a-z]+', str(formula))
20            trans = Translator(formula)
21            trans.formula_parser()
22            trans.translate()
23            trans.createMonafile(True) # true for DECLARE assumptions
24            trans.invoke_mona("automa.mona") # returns inter-automa.dot
25            dot = DotHandler("inter-automa.dot")
26            dot.modify_dot()
27            dot.output_dot() # returns automa.dot
28            automata_list.append(parse_dot("automa.dot", symbols))
29            os.remove("automa.mona")
30            os.remove("automa.dot")
31            symbols = []
32        return automata_list
33
34    def compute_automa(self):
35        result = set()
36        for triple in self.separated_formulas_set:
37            past, present, future = self.build_automaton(triple)
38            result.add( (past, present, future) )

```

```
39         return result
```

In this module, it has been employed the LTL_f2DFA tool. In fact, a `SeparatedAutomataSet` object receives a given set of separated formulas as input and it uses LTL_f2DFA to generate the DFA corresponding to each formula. Specifically, for each separated formula, i.e. a triple, (line 36) we compute the equivalent DFA on-line (line 16). This specific aspect represents a novelty with respect to what has been done in the original Java version of JANUS. So, unlike our JANUS version, the original one does not compute DFAs at execution time, but they are predefined (it only supports the most important DECLARE constraints) and given before the actual execution. Thus, this is a big step towards a complete generalization of the Janus algorithm implementation.

5.3.4 Formulas

Strictly connected to what we have just talked about in the previous section, in the `formulas/` folder there are modules in which we have defined the logic for managing and representing separated formulas and the formula constraint. In particular, we have the `separatedFormula.py` which comprises the `SeparatedFormula` class. Such class has the task of representing each triple resulting from the temporal separation (Definition 5.3). We show its implementation in Listing 5.5

Listing 5.5. The `separatedFormula.py` module

```
1 class SeparatedFormula:
2
3     def __init__(self, triple):
4         self.triple = triple
5         self.validate()
6
7     def validate(self):
8         if len(self.triple) == 3:
9             return True
10        else:
11            raise ValueError('[ERROR]: input is not a triple')
12
13    def __str__(self):
14        return str(self.triple)
15
16    def __iter__(self):
17        for elem in self.triple:
18            yield elem
```

When instantiating a `SeparatedFormula` object, this is validated checking whether the given triple is valid.

After that, the other module contained in the `formulas/` folder is the `Formula.py` in which it is defined the `Formula` class. This class represents the formula of the RCon to

be satisfied by traces. Actually, since the JANUS package works with already separated formulas, the `Formula` class gets a list of separated formulas, namely a list of triples. The implementation (Listing 5.6) of this class is quite similar to the `SeparatedFormula` class seen before.

Listing 5.6. The `Formula.py` module

```

1 from janus.formulas.separatedFormula import SeparatedFormula
2
3 class Formula:
4
5     def __init__(self, separatedFormulas):
6         self.separatedFormulas = separatedFormulas
7         self.validate()
8
9     def validate(self):
10        if all(isinstance(x, SeparatedFormula) for x in \
11            self.separatedFormulas) and self.separatedFormulas:
12            return True
13        else:
14            raise ValueError('[ERROR]: Different types for conjuncts')
15
16    def __str__(self):
17        return ', '.join(map(str, self.separatedFormulas))
18
19    def __iter__(self):
20        for triple in self.separatedFormulas:
21            yield triple

```

5.3.5 Main Module

Here we describe the main module of the JANUS package. It is called `janus.py` and it contains the principal logic covering the Janus pseudocode anticipated in Section 5.2.1. We recall that in this version of JANUS we can specify any type of $LTLp_f$ formula as long as it is already separated following Definition 5.3.

5.3.6 Results

After having illustrated the whole implementation of JANUS, we are ready to present results of its execution where we have evaluated our tool against a real-world event log. Hence, we have analyzed the real-world event log called *Sepsis*³, which reports the trajectories of patients showing symptoms of sepsis in a Dutch hospital.

³<https://doi.org/10.4121/uuid:915d2bfb-7e84-49ad-a286-dc35f063a460>

5.4 Summary

Chapter 6

Conclusions and Future Work

Continue the introduction and possible future work

6.1 Overview

6.2 Main Contributions

6.3 Future Works

6.4 Final Remarks

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