

# Model checking and formally verified software for temporal quantitative regulations

Joost J. Joosten

Universitat de Barcelona

Universiteit van Groningen  
Groningen, May 18



# The business model of our research lab



UNIVERSITAT DE  
BARCELONA

Business focussed: from concrete to abstract

# Nice to have or need to have?



infracción imputada y sancionada en cuanto que no se han incumplido los tiempos de descanso semanales.

En segundo lugar considera que los hechos denunciados no están suficientemente probados a efectos de poderlos considerar constitutivos de la infracción sancionada. En este apartado señala que el tacógrafo del que se han obtenido datos tiene una programación o configuración de fábrica que adolece de errores y que hace que sus resultados no sean fiables ni ciertos. No se trata de una avería o de un mal funcionamiento sino de errores de fabricación, configuración y/o programación llamando la atención sobre la falta de homologación del tacógrafo y, especialmente, del software utilizado dentro del mismo. A lo anterior añade que no consta, y por lo tanto falta, la homologación del software utilizado por las autoridades para obtener y procesar los datos registrados en el tacógrafo.

Se acepta lo alegado por la parte demandante en lo que se refiere a la ausencia de prueba de cargo suficiente respecto al software utilizado por la autoridad correspondiente para obtener los datos registrados en el tacógrafo por lo que, sin necesidad de analizar el resto de la fundamentación inicitia

Sentence Number: 30/2019, CONTENCIOSO/ADMTVO court N. 4 of Valladolid

# Law and Code



- Law essentially discretionary powers when applied



# Law and Code



- Law essentially discretionary powers when applied
- Hence, ambiguity is needed

# Law and Code



- Law essentially discretionary powers when applied
- Hence, ambiguity is needed
- Any automated process and in particular, any automated process in the legal sector need unambiguity

# Law and Code



- Law essentially discretionary powers when applied
- Hence, ambiguity is needed
- Any automated process and in particular, any automated process in the legal sector need unambiguity
- The programmer needs to disambiguate?

# Law and Code



- Law essentially discretionary powers when applied
- Hence, ambiguity is needed
- Any automated process and in particular, any automated process in the legal sector need unambiguity
- The programmer needs to disambiguate?
- Can code be law?

# Law and Code



- Law essentially discretionary powers when applied
- Hence, ambiguity is needed
- Any automated process and in particular, any automated process in the legal sector need unambiguity
- The programmer needs to disambiguate?
- Can code be law?
- And, what if there's an error in the code?

# Doubtful results

## III - Les formules de calculs DE L'APL ET DES AL

### Secteur locatif ordinaire

Depuis la réforme intervenue le 1<sup>er</sup> janvier 2001, le montant de l'aide est obtenu par application de la même formule en AL et en APL (cf. article D. 832-16 du CCH).

$$\text{APL ou AL} = L + C - Pp$$

### Logements-foyers

- Le montant de l'APL foyer est obtenu par application de la formule (cf. article D. 832-24 du CCH):

$$\text{APL} = K [E - E0]$$

Avec application de deux barèmes, APL 1 foyer et APL 2 foyer (cf. articles D. 832-25 et D. 832-26 du CCH)

- Le montant de l'AL est obtenu selon la formule (cf. article D. 842-15 du CCH):

$$\text{AL} = K [L + C - L0]$$

### Accession

Le montant de l'APL et de l'AL est obtenu par application de la même formule (cf. articles D. 832-10 et D. 842-6) du CCH:

$$\text{APL ou AL} = K [L + C - L0]$$

- Bonus payment system of the French Army:  
Louvois/SourceSolde

# Doubtful results

## III - Les formules de calculs DE L'APL ET DES AL

### Secteur locatif ordinaire

Depuis la réforme intervenue le 1<sup>er</sup> janvier 2001, le montant de l'aide est obtenu par application de la même formule en AL et en APL (cf. article D. 832-16 du CCH).

$$\text{APL ou AL} = L + C - Pp$$

### Logements-foyers

- Le montant de l'APL foyer est obtenu par application de la formule (cf. article D. 832-24 du CCH):

$$\text{APL} = K [E - E0]$$

Avec application de deux barèmes, APL 1 foyer et APL 2 foyer (cf. articles D. 832-25 et D. 832-26 du CCH)

- Le montant de l'AL est obtenu selon la formule (cf. article D. 842-15 du CCH):

$$\text{AL} = K [L + C - L0]$$

### Accession

Le montant de l'APL et de l'AL est obtenu par application de la même formule (cf. articles D. 832-10 et D. 842-6) du CCH:

$$\text{APL ou AL} = K [L + C - L0]$$

- Bonus payment system of the French Army:  
Louvois/SourceSolde
- In 2012: 465 M € incorrect payments

# Doubtful results

## III - Les formules de calculs DE L'APL ET DES AL

### Secteur locatif ordinaire

Depuis la réforme intervenue le 1<sup>er</sup> janvier 2001, le montant de l'aide est obtenu par application de la même formule en AL et en APL (cf. article D. 823-16 du CCH).

$$\text{APL ou AL} = L + C - Pp$$

### Logements-foyers

Le montant de l'APL foyer est obtenu par application de la formule (cf. article D. 832-24 du CCH):

$$\text{APL} = K [E - E0]$$

Avec application de deux barèmes, APL 1 foyer et APL 2 foyer (cf. articles D. 832-25 et D. 832-26 du CCH)

Le montant de l'AL est obtenu selon la formule (cf. article D. 842-15 du CCH):

$$\text{AL} = K [L + C - L0]$$

### Accession

Le montant de l'APL et de l'AL est obtenu par application de la même formule (cf. articles D. 832-10 et D. 842-6) du CCH:

$$\text{APL ou AL} = K [L + C - L0]$$

- Bonus payment system of the French Army:  
Louvois/SourceSolde
- In 2012: 465 M € incorrect payments
- It left some soldiers and their families without any income at all for months!



# Closer to (my) house: Civio vs Bosco

This article belongs to the debate » [The Rule of Law versus the Rule of the Algorithm](#)

02 April 2022

## The Paradox of Efficiency: Frictions Between Law and Algorithms

On the 13th of January 2022, a Spanish Administrative court ruled in favour of algorithmic opacity. Fundación Civio, an independent foundation that monitors and accounts public authorities, [reported](#) that an algorithm used by the government was committing errors.<sup>1)</sup> BOSCO, the name of the application which contained the algorithm, was implemented by the Spanish public administration to more efficiently identify citizens eligible for grants to pay electricity bills. Meanwhile, [Civio designed a web app](#) to inform citizens whether they would be entitled for this grant.<sup>2)</sup> Thousands of citizens used this application and some of them reported that, while Civio's web app suggested



### Ana Valdivia

Dr Ana Valdivia is a Postdoctoral Researcher at King's College London (ERC Security Flows). She examines how algorithms impact on people's life from a technical, political, and legal perspective.



### Javier de la Cueva

Javier de la Cueva is a lawyer, lecturer and researcher in topics related to open knowledge, ethics and the digital world.

Explore posts related to this:

[Algorithmic Efficiency](#), [Algorithmic Justice](#), [Rule of Law](#), [Rule of the Algorithm](#)

The Bosco computer program : errors in the computation of the social welfare bonuses

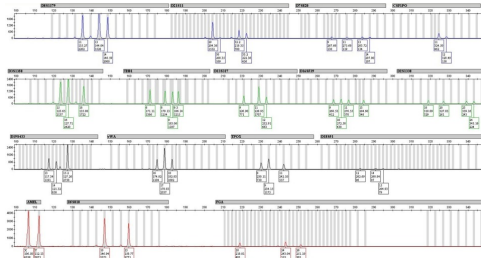
Least requirement: access to source code

In France it is mandatory to publish source code of software that is used in public administration.

However, access to source code will not resolve all problems

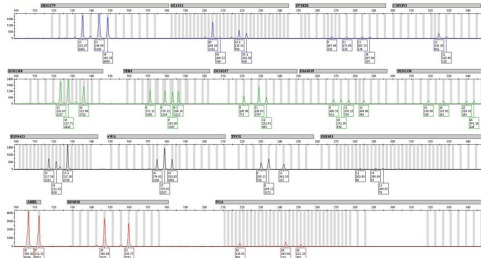
# Evidencias dudosas

- In three law-suits in the USA, the defence requested to **open the proprietary source code to the jury** of DNA sequencing software since there were some doubts.
  - STRmix



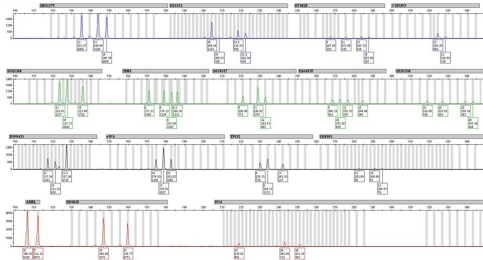
# Evidencias dudosas

- In three law-suits in the USA, the defence requested to **open the proprietary source code to the jury** of DNA sequencing software since there were some doubts.
  - STRmix
  - FST



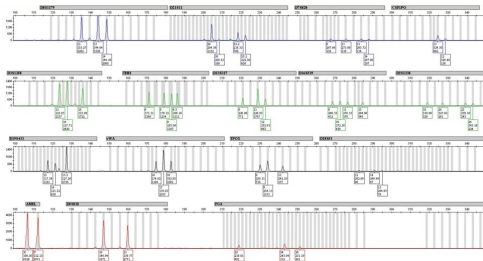
# Evidencias dudosas

- In three law-suits in the USA, the defence requested to **open the proprietary source code to the jury** of DNA sequencing software since there were some doubts.
  - STRmix
  - FST
  - TrueAllele (not granted)



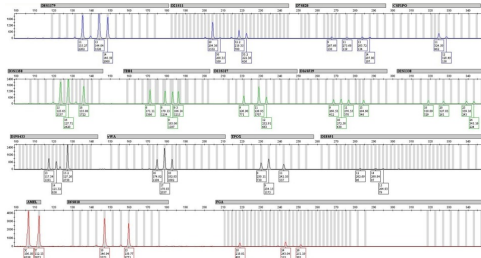
# Evidencias dudosas

- In three law-suits in the USA, the defence requested to **open the proprietary source code to the jury** of DNA sequencing software since there were some doubts.
  - STRmix
  - FST
  - TrueAllele (not granted)
- In two cases the request was granted



# Evidencias dudosas

- In three law-suits in the USA, the defence requested to **open the proprietary source code to the jury** of DNA sequencing software since there were some doubts.
  - STRmix
  - FST
  - TrueAllele (not granted)
- In two cases the request was granted
- Again, access to the source code will not solve all problems!



# What is certification?



- Is it just a matter of trust?  
(combined with some sanity checks and experience)

# What is certification?



- Is it just a matter of trust?  
(combined with some sanity checks and experience)
- Certificate  $\implies$  something is certain



# What is certification?



- Is it just a matter of trust?  
(combined with some sanity checks and experience)
- Certificate  $\implies$  something is certain
- Verify  $\implies$  something is veridical

# The impossibility of unrestricted certification



Alan Turing

- A mathematical theorem:

# The impossibility of unrestricted certification



Alan Turing

- A mathematical theorem:
- Unrestricted certification is impossible.

# Restricted certification is possible

We call a program  $P$  a *universal certifier* (wrt its language) when  $P$  takes two inputs

- ① another program  $Q$  in a language compatible with  $P$  and,
- ② a specification  $S$  in a language compatible with  $P$  that describes the behaviour of the program  $Q$ ;

and, given two inputs  $Q$  and  $S$ , the program  $P$  outputs:

- **“YES”** if the program  $Q$  does what is said by  $S$  and, it will output
- **“NO”** if the program  $Q$  does something different as that what is claimed by  $S$ .

## Theorem

*There does not exist a universal certifier.*

*This holds for any reasonable class of languages.*

# Formally verified software

## Components of formally verified/certified software

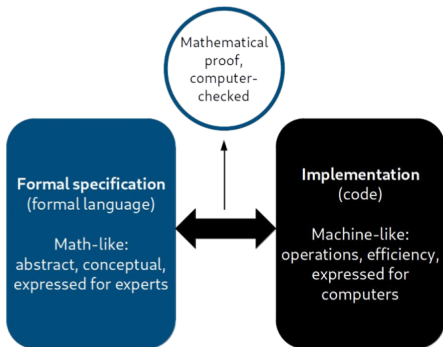
- $\Sigma$  A Specification: a non-ambiguous mathematical description of the input-output behaviour of the software
- $\Pi$  Implementation: the code, the software, implementing the algorithm that does the work.
- $\Delta$  Proof: a mathematical proof that the program  $\Pi$  functions as claimed by  $\Sigma$

The specification  $\Sigma$  is written in a formal language (in our case, the language of dependent types of the Coq proof assistant).

This begs the question: **How to make the specification more accessible to the general/judicial public?**

# What is verification?

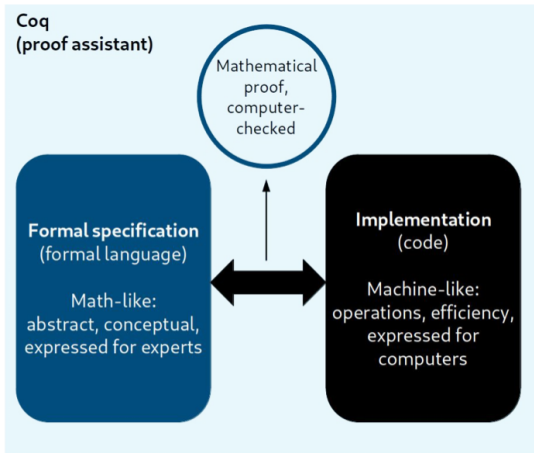
## Formal verification



Slides FV: González Bedmar

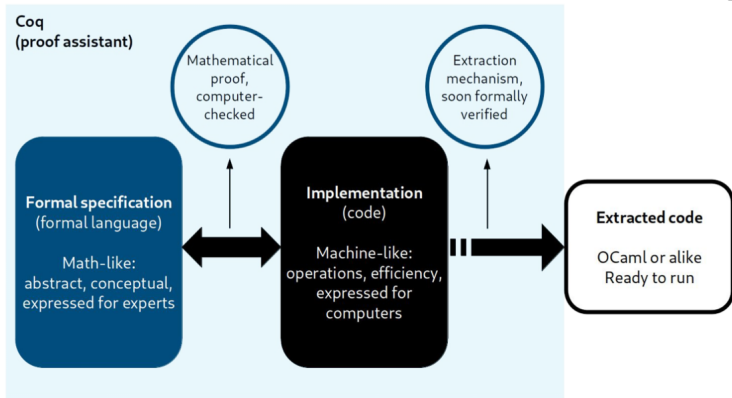
# What is verification?

## Formal verification



# What is verification?

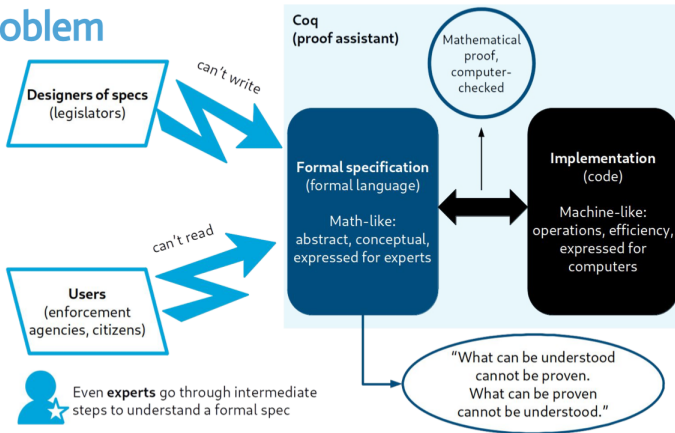
## Formal verification



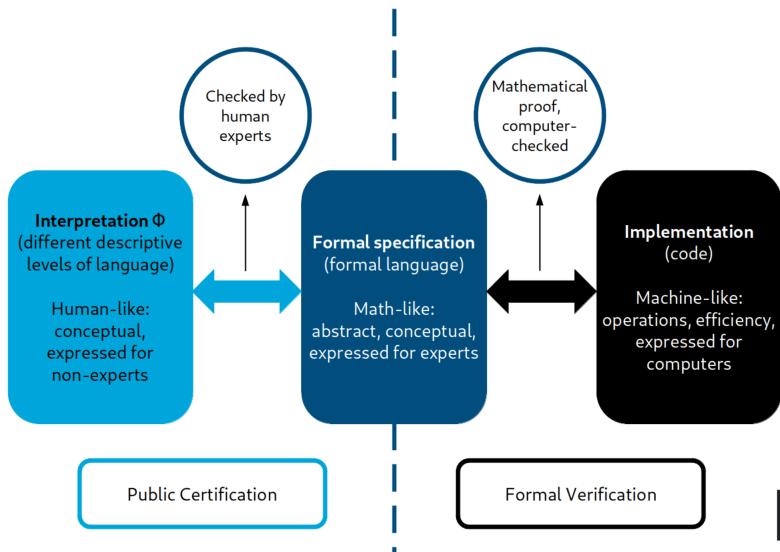


# What is verification?

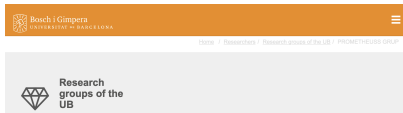
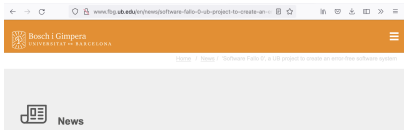
## Problem



# What is verification?



# Seven years of research in Barcelona



## 'Software Fallo 0', a UB project to create an error-free software system

12-02-2019

All software contains bugs; even the software that controls the aeronautical or military industry has bugs in its final version. This situation is particularly troubling because of the increasing dependence on software of key processes such as computer voting mechanisms, medical technologies, and applications that decide whether or not a person complies with the law. A team from the University of Barcelona participates in a four-year project that promotes a new paradigm for the software industry: the development,

[www.fbg.ub.edu/](http://www.fbg.ub.edu/)



## PROMETHEUSS GRUP

### Software unreliability and the legal system

Software malfunction can appear in one or several layers of the software development cycle, including: natural language specifications, technical specifications, formal specifications, coding, compilation, installation, and execution. The consequences of software malfunction in legal and administrative settings arguably imply the violation of legal principles, loss of valuable resources, attacks on civil rights (such as well-documented cases of automated racial discrimination), and degradation of legal systems. Also, in the future as well as in the present, it may aggravate the societal loss of confidence in technology and in government alike. Legally binding decisions taken based on data produced by software, or even decisions which are automated outright, very rarely acknowledge the existence of several crucial potential problems inherent to the nature

### WHO WE ARE

#### Members

- Dr. Joost J. Joosten (mathematical logic, team leader)
- Ana Borges (mathematical logic)
- Joaquim Casals Buffardi (computer science)
- Mireia González Bedmar

# Covenant between the University of Barcelona (FBG), Formal Vindications S.L. & Guretruck S.L.

# Three weeks ago in Barcelona

## Conference on Algorithmic Law Design and Implementation

APRIL 28-29, 2022  
UNIVERSITAT DE BARCELONA

SCHEDULE, REGISTRATION and + INFO  
<https://www.ub.edu/prooftheory/evant/lawdesign/>

### KEYNOTE SPEAKERS

**Formal Verification and Governance of Financial Algorithms with Inandra**  
**Grant Olney Passmore**  
Inandra, USA

**Hybrid intelligence for algorithmic law design**  
**Bart Verheij**  
Bernoulli Institute of Mathematics, Computer Science and Artificial Intelligence - University of Groningen

### INVITED SPEAKERS

**Opening talk: Algorithmic Law Design and Implementation. From Greve to Creadie**  
**Joost J. Joosten**  
Universitat de Barcelona, Spain

**Legal Methods for Algorithmic Law**  
**David Fernández-Duque**  
Ghent University, Belgium

**Public Certification of Software and its necessity in Computable Laws. PV Time as the first application**  
**Mirna González Bedmar**  
Formal Verification SL, Spain

**Is coding the law legal? A French and European approach**  
**Liane Hutterer**  
Université Paris 1 Panthéon-Sorbonne, France

**Verifying well-behaved execution of legislative programs with the Catalan domain-specific language**  
**Denis Merigoux**  
Inria, Project Team Prosecco, France

**Drafting EU Legislation in the Era of AI and Digitisation**  
**Fernando Nubia Durango, Willy von Puymbroech**  
LEOS Project, European Commission

**Monica Palmirani**  
Università di Bologna, Italy

**Auditing IT-systems used for automated individual decision-making in public sector; experiment in The Netherlands**  
**Marlies van Ech**  
Hooghiemstra & Partners and Radboud University, The Netherlands

**Verified extraction to OCaml from Coq, in Coq**  
**Yarnick Forster**  
Inria, Project Team Gallinette, France

**Crafting a legislation ready for digital public administration**  
**Julius Lyh-jensen, Christine Holmgreen Mølling & Mette Eigaard Rasmussen**  
Agency for Digitalisation, Ministry of Finance, Denmark

**Model-Checking as an approach to algorithmic law and the case of Regulation 561**  
**Moritz Müller**  
Universitat de Barcelona, Spain

**Imagine lawyers are not your enemies: Legal challenges and digital rights**  
**Susana de la Sierra**  
Universidad de Castilla-La Mancha, Spain

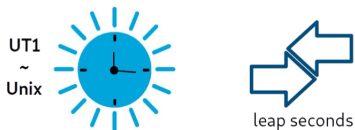
**PROGRAM COMMITTEE**  
Joost J. Joosten, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France

**ORGANIZING COMMITTEE**  
Joost J. Joosten, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France  
Miguel Ángel Vazquez, Inria, France

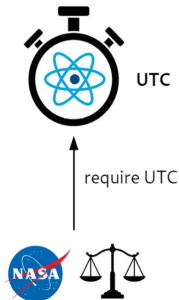
**SECRETARIATS**  
Bosch i Gimpera  
UNIVERSITAT DE BARCELONA

# Time library

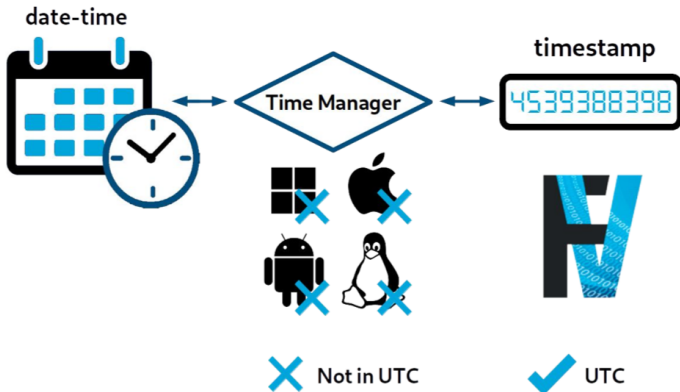
## Time measurement



2016-12-31 23:59:60 UTC exists  
27 leap seconds added since 1972

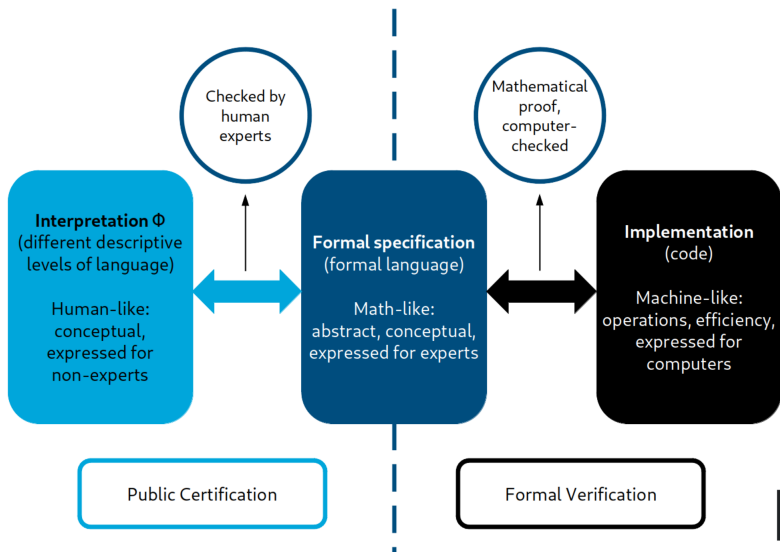


# Time formats and managers



Most important feature: formally verified!

# What is certification?



# Example in FV Time



**Formal specification (in Coq):** `utc_timestamp_plain`  
`#|[pred t' | (epoch <= t' < t)%O|]`



**Implementation**  
(code)



**Formal specification in a descriptive level of language**  
  
Given a time  $t$ , returns the cardinality of the set of times that are equal or after the Unix epoch (1970-1-1 00:00:00) and before  $t$ .



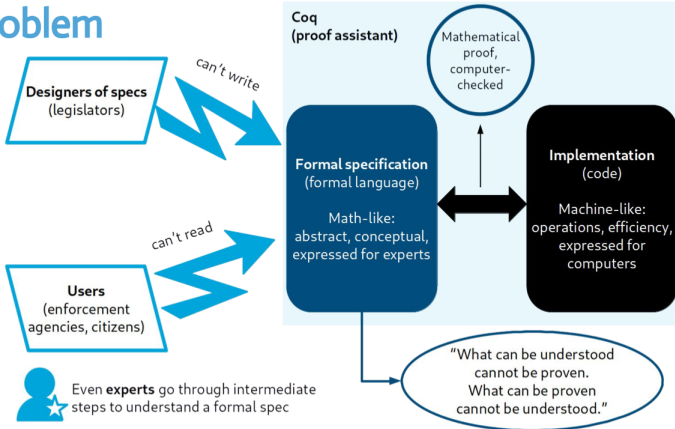
**Intuitive specification**  
  
Given a time  $t$ , returns the number of seconds elapsed since the Unix epoch (1970-1-1 00:00:00).

Around one-thousand times more expensive!

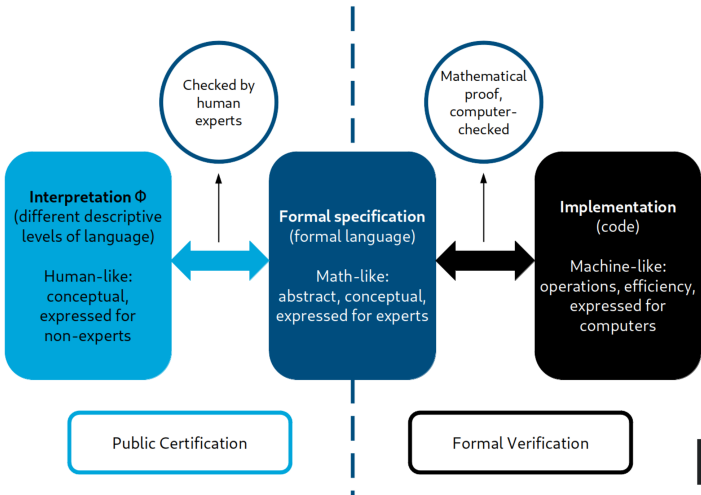


# A central problem

## Problem



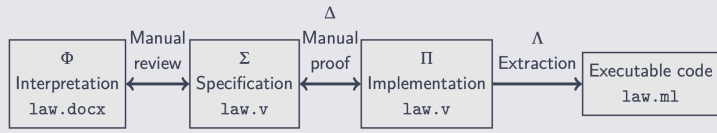
# Public certification versus formal verification



# Catala: A Shortcut For Legal Expert System Certification

## The Usual Way to Produce Verified Software

Using Mireia González Bedmar's conceptual framework from yesterday's presentation:



Catala's approach:



## ① Catala: A Language Reviewable by lawyers

### US Tax Code, Section 132, (c)(1) Qualified employee discount

The term “qualified employee discount” means any employee discount with respect to qualified property or services to the extent such discount does not exceed—

(A) in the case of property, the gross profit percentage of the price at which the property is being offered by the employer to customers

```
scope QualifiedEmployeeDiscount :
  definition qualified_employee_discount
    under condition is_property consequence equals
      if employee_discount >$ customer_price *$ gross_profit_percentage then
        customer_price *$ gross_profit_percentage
      else employee_discount
```

# Can code be the law?

TENSION TABLE:

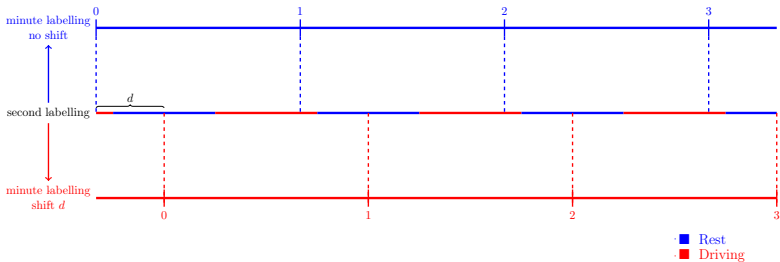
## Computable laws:

### Language, software paradigm and legal principles

Specification Language	Programming paradigm	Legal Principles		
		Legal Certainty	Accountability	Contestability
Natural Language	Not Formally Verified	Decisions will probably not be consistent with the established legal framework. The text will be accessible and comprehensible to the public and authorities.	Automated decision won't be reliable and explainability will be difficult: the software is not comprehensible to the public, challenging the principle of transparency.	Right to contest turns almost impossible since authorities can't explain software decisions, which will be unreliable.
Technical Language	Not Formally Verified	Decisions will likely not be consistent with the established legal framework. The text will be less comprehensible to public and authorities.	Automated decision will be barely reliable and explainability will be difficult: the software is not comprehensible to the public, challenging the principle of transparency.	Right to contest turns almost impossible since authorities can't explain software decisions, which will be mostly unreliable.
Formal Language	Not Formally Verified	Decisions will probably be consistent with the established legal framework. The text will only be accessible to experts.	Automated decision will be quite reliable and explainability will be difficult: the software is not comprehensible to the public, challenging the principle of transparency.	Right to contest turns almost impossible since authorities can't explain software decisions, yet they will probably be working according to the law
Formal Language	Formally Verified	Decisions will be consistent with established legal framework. The text will only be accessible to experts	Automated decision will be reliable and explainability will be difficult, but it will be guaranteed that the software is the exact reproduction of its specification	Right to contest will be difficult since authorities can't explain software decisions, yet those are working according to the law

More accurate and exact but less understandable for the general public

# Further benefits of formalisation



We proved that the labelling is not *shift-invariant*!

# Some regulations regarding weekly rest periods

## Regulation (EC) No 561/2006

§8.6. In any two consecutive weeks, a driver shall take at least:

- two regular weekly rest periods [of at least 45 hours], or
- one regular weekly rest period and one reduced weekly rest period of at least 24 hours. However, the reduction shall be compensated by an equivalent period of rest taken en bloc before the end of the third week following the week in question.

A weekly rest period shall start no later than at the end of six 24-hour periods from the end of the previous weekly rest period.

§8.9. A weekly rest period that falls in two weeks may be counted in either week, but not in both.

# Let's break it down...

- Regular weekly rest:  $\geq 45$  hours



# Let's break it down...

- Regular weekly rest:  $\geq 45$  hours
- Reduced weekly rest:  $\geq 24$  hours

# Let's break it down...

- Regular weekly rest:  $\geq 45$  hours
- Reduced weekly rest:  $\geq 24$  hours
- Each rest period is assigned to only one week it intersects

## Let's break it down...

- Regular weekly rest:  $\geq 45$  hours
- Reduced weekly rest:  $\geq 24$  hours
- Each rest period is assigned to only one week it intersects
- Every week must have a regular or reduced weekly rest

## Let's break it down...

- Regular weekly rest:  $\geq 45$  hours
- Reduced weekly rest:  $\geq 24$  hours
- Each rest period is assigned to only one week it intersects
- Every week must have a regular or reduced weekly rest
- Every other week must have a full weekly rest

# Let's break it down...

- Regular weekly rest:  $\geq 45$  hours
- Reduced weekly rest:  $\geq 24$  hours
- Each rest period is assigned to only one week it intersects
- Every week must have a regular or reduced weekly rest
- Every other week must have a full weekly rest
- Any reduced rest must be compensated by a continuous block in the following three weeks

# Combinatorics of rest assignments

Can we assign a week to each rest period so that each week is assigned to at least one rest period?



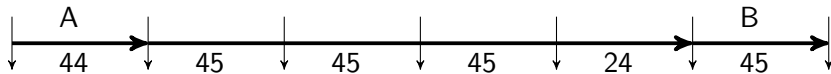
# Combinatorics of rest assignments

Can we assign a week to each rest period so that each week is assigned to at least one rest period?



In principle this is an **NP** problem (assign 0 or 1 to each rest period according to whether it should belong to the earlier week or the later week).

# Non-locality of compensations



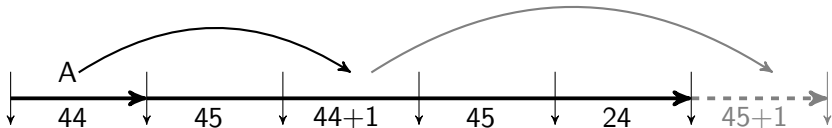
Illegal



# Non-locality of compensations



Illegal

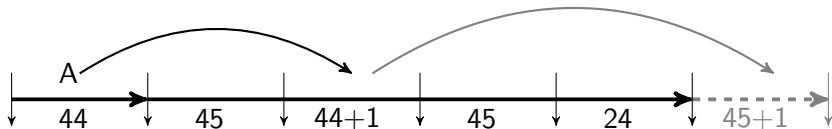


Legal

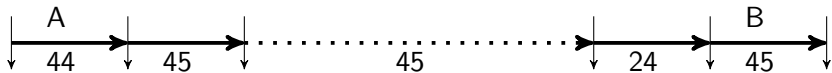
# Non-locality of compensations



Illegal



Legal



This can be iterated indefinitely: non-locality

# Lab activities

- Regulation analysis via logical/mathematical analysis

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.
    - But also: if  $x$  and  $y$  are similar data containers (e.g., formal repr. of persons) with the only difference that  $x$  has one passport and  $y$  has two passports, will the program behave the same for  $x$  and  $y$ ?

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.
    - But also: if  $x$  and  $y$  are similar data containers (e.g., formal repr. of persons) with the only difference that  $x$  has one passport and  $y$  has two passports, will the program behave the same for  $x$  and  $y$ ?
  - Are the algorithms implied computationally feasible?



# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.
    - But also: if  $x$  and  $y$  are similar data containers (e.g., formal repr. of persons) with the only difference that  $x$  has one passport and  $y$  has two passports, will the program behave the same for  $x$  and  $y$ ?
  - Are the algorithms implied computationally feasible?
- Implement software in a ZERO-ERROR fashion using proof assistants.

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.
    - But also: if  $x$  and  $y$  are similar data containers (e.g., formal repr. of persons) with the only difference that  $x$  has one passport and  $y$  has two passports, will the program behave the same for  $x$  and  $y$ ?
  - Are the algorithms implied computationally feasible?
- Implement software in a ZERO-ERROR fashion using proof assistants.
- Develop general purpose models with the above considerations taken into account so that zero-error software scales.

# Lab activities

- Regulation analysis via logical/mathematical analysis
  - Is the regulation consistent?
  - Is the implied behaviour of the regulation desirable?
    - Shift-invariance of labelling, locality of legality checks, etc.
    - But also: if  $x$  and  $y$  are similar data containers (e.g., formal repr. of persons) with the only difference that  $x$  has one passport and  $y$  has two passports, will the program behave the same for  $x$  and  $y$ ?
  - Are the algorithms implied computationally feasible?
- Implement software in a ZERO-ERROR fashion using proof assistants.
- Develop general purpose models with the above considerations taken into account so that zero-error software scales.
- Provide verified software with a dialogue fragment that enables a possible rudimentary dialogue between the user and the software about the software's behaviour

# Lab activities

- Develop explanatory certificates by

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.



# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.
- A formal subset of natural language (domain specific) to bridge the gap between formal specifications and technical specifications (public certification)

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.
- A formal subset of natural language (domain specific) to bridge the gap between formal specifications and technical specifications (public certification)
- Teaching courses on formal verification/certification techniques (and consulting)

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.
- A formal subset of natural language (domain specific) to bridge the gap between formal specifications and technical specifications (public certification)
- Teaching courses on formal verification/certification techniques (and consulting)
- Adding to Coq development and libraries

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.
- A formal subset of natural language (domain specific) to bridge the gap between formal specifications and technical specifications (public certification)
- Teaching courses on formal verification/certification techniques (and consulting)
- Adding to Coq development and libraries
- Study impact of techniques on society and ethical/legal principles, e.g., Accessibility, Accountability, Transparency, Equality, Contestability, etc

# Lab activities

- Develop explanatory certificates by
  - choosing ontologies of the right granularity to define semi-formal language
  - conversion of lambda-terms to ones using in these ontologies/constructors
- Zero-knowledge certificates for proprietary software!
- Standards and good practices for public certification.
- A formal subset of natural language (domain specific) to bridge the gap between formal specifications and technical specifications (public certification)
- Teaching courses on formal verification/certification techniques (and consulting)
- Adding to Coq development and libraries
- Study impact of techniques on society and ethical/legal principles, e.g., Accessibility, Accountability, Transparency, Equality, Contestability, etc

# The central computational problem of algorithmic law

(Work and slides with Moritz Müller)

**Need** to formalize activity sequences and laws

- formalize activity sequences are words  $w \in \Sigma^*$  over a finite alphabet  $\Sigma$   
*e.g. dddrrw formalizes 6 minutes of activities in  $\Sigma = \{d, r, w\}$ .*
- formalize a law by a sentence in a suitable logic  $L$ .

**Need** algorithm that decides the computational problem

$MC(\Sigma^*, L)$

*Input: a word  $w \in \Sigma^*$  and a sentence  $\varphi \in L$*

*Problem: is  $w$  legal according to  $\varphi$ , i.e.  $w \models \varphi$  ?*

$MC(\Sigma^*, L)$  is a formal model for algorithmic law (on activity sequences).

**Question** For which  $L$  is it **good**?

# Candidate: monadic second order logic MSO

## Starting point

Borges, Conejero, Fernández-Duque, González, Joosten.

*To drive or not to drive: A logical and computational analysis of European transport regulations.* Information and Computation 280, 2021.

- naturally formalizes Regulation 561.
- model-checking in time  $f(|\varphi|) \cdot |w|$ , **Parameterized Complexity**  
where  $f : \mathbb{N} \rightarrow \mathbb{N}$  is some computable function.
- **but**  $f$  grows very fast:

Theorem (Frick, Grohe 04)

Assume  $P \neq NP$ . Then  $MC(\Sigma^*, MSO)$  is **not** decidable in time

$$f(|\varphi|) \cdot |w|^{O(1)}$$

for elementary  $f : \mathbb{N} \rightarrow \mathbb{N}$ .

**Hence** MSO is not sufficiently tractable.

Candidate: linear time temporal logic [LTL](#)

Model-checking in time  $O(|\varphi| \cdot |w|)$ , **but** not sufficiently expressive **and** not sufficiently succinct (BRFB21)

**Example** Article 6.2: The weekly driving time shall not exceed 56 hours

Straightforwardly formalized over words of length  $1w$ : disjunction of

$$\bigwedge_{d \leq D} \left( \bigwedge_{r_d \leq i < \ell_{d+1}} \bigcirc^i \neg d \wedge \bigwedge_{\ell_d \leq i < r_d} \bigcirc^i d \right)$$

for all  $D \leq 1w$  and

all  $r_0 := 0 \leq \ell_1 < r_1 < \dots < \ell_D < r_D < \ell_{D+1} := 1w$  with

$$\sum_{1 \leq j \leq D} (r_j - \ell_j) \leq 56h$$

This has  $> \binom{7 \cdot 24 \cdot 60}{56 \cdot 60} > 10^{2784}$  many disjuncts.

### Warning

Algorithmic laws could use large constants for time constraints.

Model-checking complexity should scale well with them.



# Which $MC(\Sigma^*, L)$ are good models for algorithmic law?

## Tractability

*sufficiently fast model-checkers*

*fine-grained complexity analysis: parameterized complexity theory*

*important parameter: large time constants in law*

## Expressivity

*test case: formalize Regulation 561*

## Naturality

*readable sentences*

*sufficiently succinct*

# Stopwatch automata **SWA**: syntax

## Stopwatch automaton $\mathbb{A}$

$Q$  finite set of *states* including start, accept

$X$  finite set of *stopwatches*

$\lambda$  maps  $q \in Q$  to  $\lambda(q) \in \Sigma$

$\beta$  maps  $x \in X$  to *bound*  $\beta(x) \in \mathbb{N}$

$\zeta$  is the set of  $(x, q) \in X \times Q$  such that  $x$  is *active in*  $q$

$\Delta$  is the set of *transitions*  $(q, g, \alpha, q')$

where  $q, q' \in Q$ ,  $g$  is a guard,  $\alpha$  is an action.

**Assignment**  $\xi$  maps  $x \in X$  to  $\xi(x) \leq \beta(x)$

**Guard**  $g$  is a set of assignments

**Action**  $\alpha$  maps assignments to assignments

# Stopwatch automata **SWA**: semantics

Transition system of  $\mathbb{A}$

*configurations*  $(q, \xi)$

*switch edges*  $(q, \xi) \xrightarrow{0} (q', \xi')$

whenever  $(q, g, \alpha, q') \in \Delta$ ,  $\xi \in g$ ,  $\xi' = \alpha(\xi)$

*stay edges*  $(q, \xi) \xrightarrow{t} (q, \xi')$

where  $\xi'$  increases  $\xi(x)$  for  $x$  active in  $q$  to  $\min\{\xi(x) + t, \beta(x)\}$

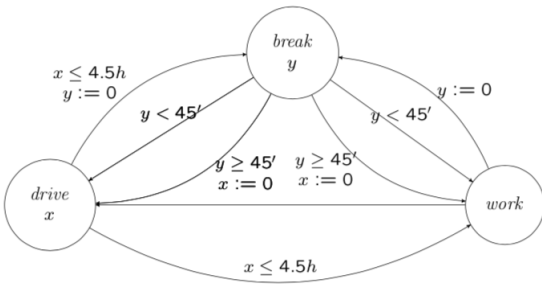
**Computation**  $(q_0, \xi_0) \xrightarrow{t_0} (q_1, \xi_1) \xrightarrow{t_1} (q_2, \xi_2) \xrightarrow{t_2} \dots \xrightarrow{t_{\ell-1}} (q_\ell, \xi_\ell)$

**reads**  $w := \lambda(q_0)^{t_0} \lambda(q_1)^{t_1} \dots \lambda(q_{\ell-1})^{t_{\ell-1}}$

**accepts** if  $q_0 = \text{start}$ ,  $\xi_0 \equiv 0$ ,  $q_\ell = \text{accept}$ ,  $q_i \neq \text{accept}$  for  $i < \ell$ .

# Example: continuous driving

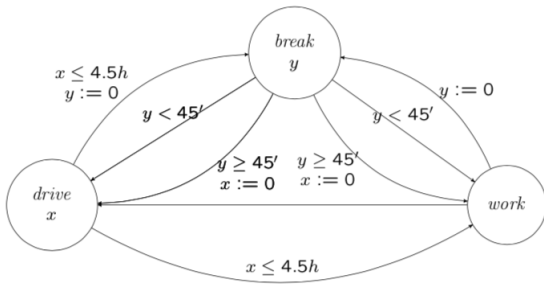
Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *ddrr*

# Example: continuous driving

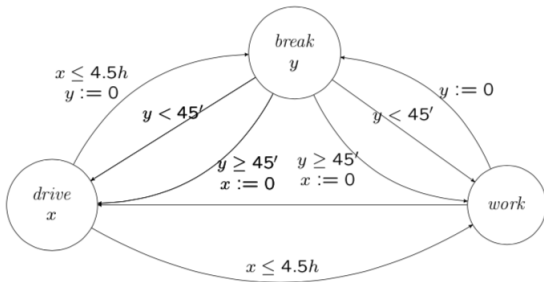
Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *ddrr*

# Example: continuous driving

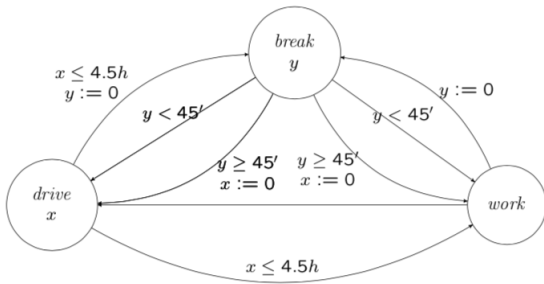
Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *ddrr*

# Example: continuous driving

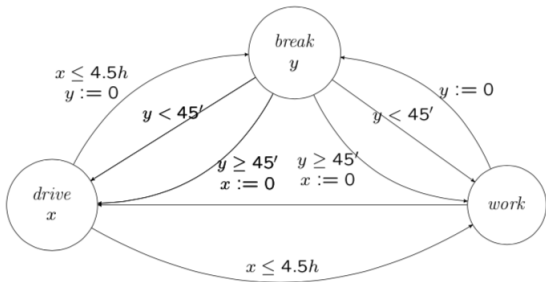
Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *ddrr*

# Example: continuous driving

Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...

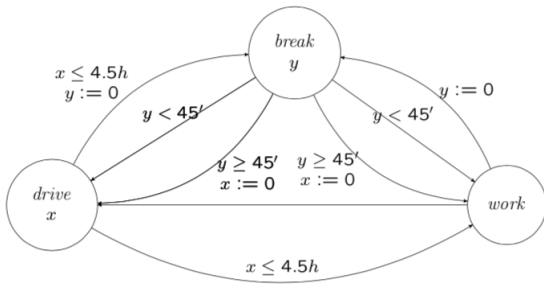


$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0}$   
 $(break, 30)$   
 reads *ddrr*



# Example: continuous driving

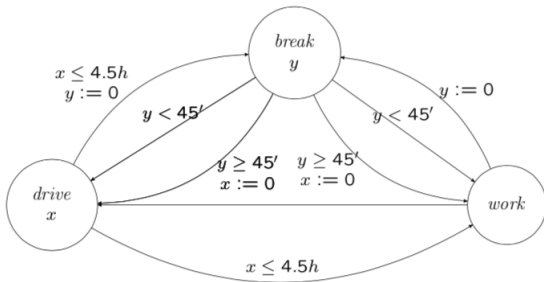
Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *ddrr*

# Example: continuous driving

Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



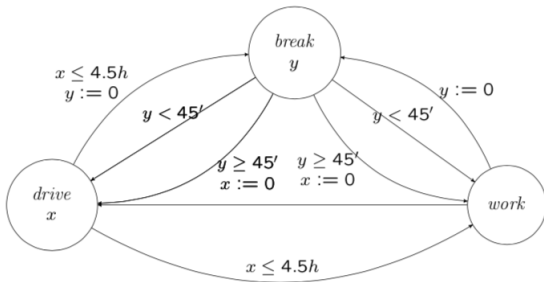
$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0}$

$(break, 30)$

reads *ddrr*

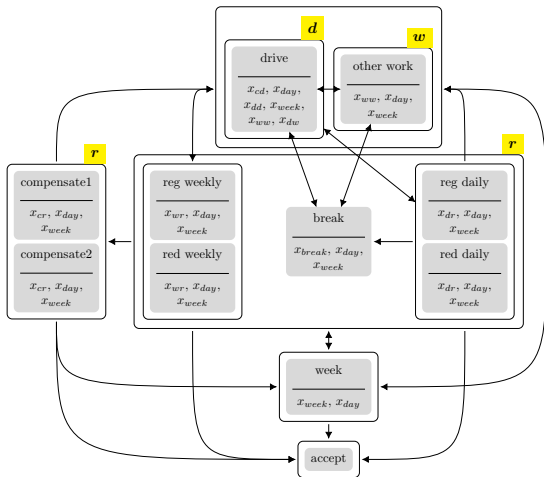
# Example: continuous driving

Article 7 (1st part): After a driving period of four and a half hours a driver shall take an uninterrupted break of not less than 45 minutes,...



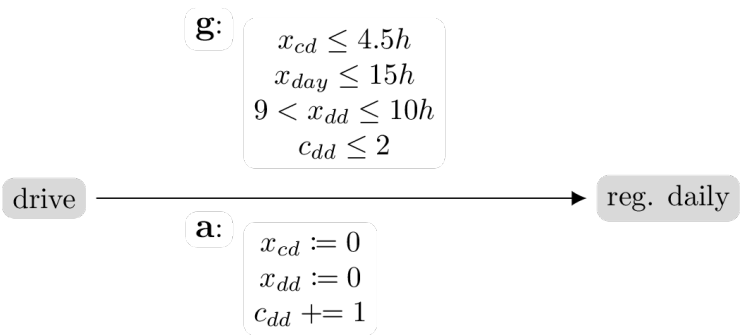
$(drive, 00) \xrightarrow{3} (drive, 30) \xrightarrow{0} (break, 30) \xrightarrow{2} (break, 32) \xrightarrow{0} (work, 32) \xrightarrow{0} (break, 30)$   
 reads *dddrr*

# Automaton that accepts exactly the legal words according to Reg. 561



12 states  
 > 100 transitions  
 34 stopwatches  
 23 are nowhere active:  
*bits*  
*counters*  
*registers*

# > 100 transitions



# Expressivity and model-checking

## Theorem

A set of words is accepted by an SWA iff it is definable in MSO.

## Theorem

There is an algorithm that decides

*Input: stopwatch automaton  $\mathbb{A}$  and a word  $w$  over  $\Sigma$*

*Problem: does  $\mathbb{A}$  accepts  $w$  ?*

in time

$$O(|\mathbb{A}|^2 \cdot t^x \cdot |w|)$$

where

$t :=$  largest stopwatch bound of  $\mathbb{A}$

$x :=$  number of stopwatches of  $\mathbb{A}$

# Consistency-checking

## Theorem

There is an algorithm that decides

*Input:* SWAs  $\mathbb{A}, \mathbb{B}$

*Problem:* is there a word accepted by both  $\mathbb{A}$  and  $\mathbb{B}$  ?

in time

$$O(|\mathbb{A}|^3 \cdot |\mathbb{B}|^3 \cdot t^x \cdot s^y)$$

where

$t :=$  largest stopwatch bound of  $\mathbb{A}$

$x :=$  number of stopwatches of  $\mathbb{A}$

$s :=$  largest stopwatch bound of  $\mathbb{B}$

$y :=$  number of stopwatches of  $\mathbb{B}$

# Scheduling

## Theorem

There is an algorithm that decides

*Input: SWA  $\mathbb{A}$ , letter  $a \in \Sigma$ , word  $w$  over  $\Sigma$ ,  $n \in \mathbb{N}$*

*Problem: compute length  $n$  word  $v$  over  $\Sigma$  such that*

*$\mathbb{A}$  accepts  $wv$*

*$v$  maximizes  $\#_a(v)$*

in time

$$O(|\mathbb{A}|^2 \cdot t^x \cdot (|w| + n))$$

where

*$t :=$  largest stopwatch bound of  $\mathbb{A}$*

*$x :=$  number of stopwatches of  $\mathbb{A}$*



# Lower bound

**Know:**  $\text{MC}(\Sigma^*, \text{SWA})$  decidable in time  $O(|\mathbb{A}|^2 \cdot t^x \cdot |w|)$

**Doubt:** Is  $t^x$  tolerable? Can it be improved?

Interesting instances have **large**  $t$  and **small**  $x$ .

**Question:** replace  $t^x$  by  $100^{100 \cdot x} \cdot t^{100}$  ?

## Theorem

Assume  $\text{FPT} \neq \text{W}[1]$ . Let  $f : \mathbb{N} \rightarrow \mathbb{N}$  be a computable function.

Then  $\text{MC}(\Sigma^*, \text{SWA})$  **cannot** be decided in time

$$(|\mathbb{A}| \cdot f(x) \cdot t \cdot |w|)^{O(1)}.$$

**Question:** Can we hardwire large constants in the data structure using Hybrid Modal Logic?

## Some further development

- Study if data-representation can improve complexity of model checking;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;
- Write a formally verified implementation of the model checker;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;
- Write a formally verified implementation of the model checker;
- Provide a front-end interface to build your law yourself;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;
- Write a formally verified implementation of the model checker;
- Provide a front-end interface to build your law yourself;
- Translate automata to semi-natural language description of the regulation;

## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;
- Write a formally verified implementation of the model checker;
- Provide a front-end interface to build your law yourself;
- Translate automata to semi-natural language description of the regulation;
- etc.



## Some further development

- Study if data-representation can improve complexity of model checking;
- Define/carve out a language that corresponds naturally to bounded stopwatch automata;
- Formally verify the meta-theorems of model checking;
- Write a formally verified implementation of the model checker;
- Provide a front-end interface to build your law yourself;
- Translate automata to semi-natural language description of the regulation;
- etc.
- etc.

# Thanks

