

# A Formal Study of the French Tax Code's Implementation

Denis Merigoux

Prosecco, Inria

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# Law and algorithms

## Code Général des Impôts, Article 197, I, 3, b, 3°

Le taux de la réduction prévue au premier alinéa du présent b est de 20 %. Toutefois, pour [...], le taux de la réduction d'impôt est égal à 20 % multiplié par le rapport entre :

- au numérateur, la différence entre 20 500 €, pour [...], ou 41 000 €, pour [...], et le montant des revenus mentionnés au troisième alinéa du présent b, et ;
- au dénominateur, 2 000 €, pour [...], ou 4 000 €, pour [...].

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## When does the law specify an algorithm?

- Decision without human intervention
- No ambiguity
- Quantitative data (income, number of children, etc.)

## An example of algorithmic translation

```
RATE = if (not [...1...]) then  
    20 %
```

“Le taux de la réduction prévue au premier alinéa du présent b est de 20 %. Toutefois, pour [...]”

## An example of algorithmic translation

```
RATE = if (not [...1...]) then  
    20 %  
else  
    20 % * (  
        (  
            )  
        /  
        (  
            )  
    )
```

“ il est égal à 20 % multiplié par le rapport entre :  
— au numérateur, ...;  
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## An example of algorithmic translation

```
RATE = if (not [...1...]) then  
    20 %  
else  
    20 % * (  
        (  
            if [...2,3...] then 20 500 € else 41000 €)  
            - INCOME  
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        (  
    )  
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```

“au numérateur, la différence entre 20 500 €, pour [...] (2)...], ou 41 000 €, pour [...] (3)...], et le montant des revenus mentionnés au troisième alinéa du présent b”

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    20 %  
else  
    20 % * (  
        (  
            (if [...2,3...] then 20 500 € else 41000 €)  
            - INCOME  
        )  
        /  
        (if [...4,5...] then 2000 € else 4000 €)  
    )
```

“au dénominateur, 2 000 €, pour [...(4)...], ou 4 000 €, pour [...(5)...].”

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$f$ 's properties:

- Is  $f$  *increasing* with income?
- Is  $f$  *decreasing* with the number of children?
- What is  $f$ 's *derivative*?  $\Rightarrow$  marginal tax rate

## Case study: marginal tax rate

### Model

Characteristic	Household before	Household after
Yearly income	$R_0$	$R_0 + \Delta_R$

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### Effective withholding marginal rate

$$R_{\text{eff}} = \frac{\Delta_T + \Delta_B}{\Delta_R}$$

Is there a household such that  $R_{\text{eff}} \geq 70\%$ ?

# Our hammer : SMT solving

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## Satisfiability modulo theories

SMT solver able to solve complex numerical constraints problems.

⇒ Implemented in a prototype considering a simplified household model

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Cohabiting couple with two high-schoolers (15 and 17-years-old), depending on second parent (jobless). Zone II monthly rent €897,75. Monthly raise of €250/€2 760,76.

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Characteristic	Value before	Value after	Variation
Yearly income $R$	€33 129,12	€36 129,12	+ €3 000,00
IR	€3 147,00	€3 957,00	+ €810,00
PA	€1 320,00	€0,00	- €1 320,00
AF	€1 584,00	€1 584,00	€0,00
ARS	€806,00	€0,00	- €806,00
BC	€0,00	€0,00	€0,00
BL	€0,00	€0,00	€0,00
APL	€0,00	€0,00	€0,00
Take-home income $N$	€33 692,12	€33 756,12	+ €64,00
Marginal rate			97,9 %

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## Avantages

- Systematic analysis
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## Scalability challenge

- Complexity  $\Rightarrow$  resources and compute time
- SMT queries need optimizing
- Going beyond prototyping

## From prototype to production

The DGFIP (French IRS) released a part of its tax computation system in 2016:

- <https://framagit.org/dgfip/ir-calcul>
- Written in M, custom language
- Computes income taxes for private individuals
- 2017 version: 48 files, 92,000 lines of code

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## Leveraging public code

- M language formalized [2]
- Pending on missing information from DGFiP

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Currently, no organization can claim a correct-by-construction law implementation:

- Government-issued simulators (social benefits)
- DGFiP (income tax)
- Private companies: PayFit, ADP (payroll taxes)

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The tax reduction is equal to 20% of the income...

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/* tax.redution := income * 20 / 100 */
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... except when the income is below €20 000, where it is 30%.

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/* tax.redution when income < 20000 := income * 30 / 100 */
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The programming language should follow the structure of the law!

# A default logic-based DSL

## Default logic

Proposed by Reiter in 1980 [3]. Basic idea is to give a precedence order on logic predicates.

default case < exceptions

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The law specification DSL should use default logic [1]. DSL programs:

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The law specification DSL should use default logic [1]. DSL programs:

- validated by law professionals
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⇒ Topic of a Master internship at Prosecco in Spring 2020.

# Conclusion

## Current work and beyond:

- SMT-based tax impact study
- Formalization of the official income tax computation codebase
- Tooling for correct-by-construction law implementations

Open-source code: <https://gitlab.inria.fr/verifisc>

Thanks to DGFiP and in particular Christophe Gaie and his team for collaborating!

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