

# Research Introduction

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PLIS Group, Roskilde University

# CLIP Lab @ IMDEA Software Institute, Madrid



## IMDEA Software Institute

Madrid Institute for Advanced Studies

Focus: *Safe, Reliable and Efficient* Software

Program Analysis and Verification,  
Cryptography and Cybersecurity,  
Languages and Compilers, ...

## CLIP Lab

The **C**omputational logic, **L**anguages,  
**I**mplementation, and **P**arallelism **L**aboratory



Manuel  
Hermenegildo



Pedro  
Lopez-Garcia



Jose F.  
Morales



Manuel  
Carro



Daniel  
Jurjo



Daniela  
Ferreiro



Louis  
Rustenholz



Marco  
Ciccale



Paula  
Corral



Kirelys  
Lugo

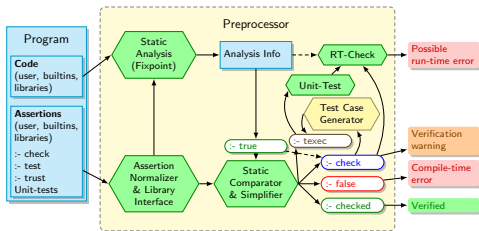


An Extensible Logic Programming Language,  
designed to make full use of advanced  
**Analysis, Verification and Optimisation**

# CLIP Lab @ IMDEA Software Institute, Madrid

```

1 :- module(., [nrev/2], [assertions,fsyntax,nativeprops]).
2
3 :- entry nrev/2 : {list, ground} * var.
4
5 :- pred nrev(A,B) : list(A) ==> list(B).
6   + ( not_fails, is_det, steps_o( length(A) ) ).
7
8 nrev( [] ) := [].
9 nrev( [_|_], _ ) := ~conc( ~nrev(L), [_] ).
10
11
12 :- pred conc(A,B,C) + ( terminates, is_det, steps_o( length(A) ) ).
13
14 conc( [], L ) := L.
15 conc( [_|_], K ) := [ H | ~conc(L,K) ].
    
```



## Preprocessor Option Browser



Use Saved Menu Configuration (menu_last_config)	:	none	▼
Menu Level (menu_level)	:	naive	▼
Action (inter_all)	:	check_assertions	▼
Analysis Domain (assert_ctcheck)	:	manual	▼
Modules to Check (ct_modular)	:	curr_mod	▼
Customize Analysis Flags (check_config_ana)	:	on	▼
Analyze Non-Failure (ana_nf)	:	nf	▼
Analyze Numeric (ana_num)	:	none	▼
Analyze Cost (ana_cost)	:	none	▼
Analyze Determinism (ana_det)	:	det	▼
Analysis entry (entry_point)	:	entry	▼
Incremental (incremental)	:	off	▼
Intermodular (intermod)	:	off	▼
Report Non-Verified Assrts (ass_not_stat_eval)	:	warning	▼
Generate Certificate (gen_certificate)	:	off	▼
Generate CT Checking Intervals (ctchecks_intervals)	:	on	▼
Generate Output (menu_output)	:	on	▼
Output Language (output_lang)	:	source	▼
Include Program Point (pp_info)	:	off	▼
Multi-variant Analysis Results (vers)	:	off	▼
Collapse Versions (collapse_ai_vers)	:	on	▼

```

#pragma check fir(xn, coeffs, state, ELEMENTS) :
  ( 1 <= ELEMENTS && energy <= 416.0 )
#pragma true fir(xn, coeffs, state, ELEMENTS) :
  ( energy >= 3.35*ELEMENTS + 13.96 &&
    energy <= 3.35*ELEMENTS + 14.4 )
#pragma checked fir(xn, coeffs, state, ELEMENTS) :
  ( 1 <= ELEMENTS && ELEMENTS <= 120 && energy <= 416.1 )
#pragma false fir(xn, coeffs, state, ELEMENTS) :
  ( 121 <= ELEMENTS && energy <= 416.1 )
    
```

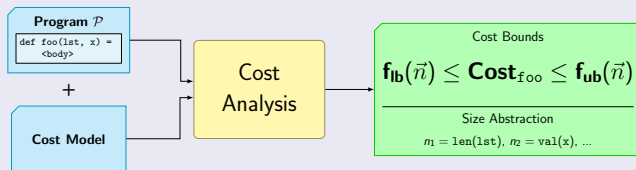
```

int fir(int xn, int coeffs[], int state[], int ELEMENTS)
{ unsigned int ynl; int ynh;
  ynl = (1<<23); ynh = 0;
  for(int j=ELEMENTS-1; j!=0; j--) {
    state[j] = state[j-1];
    { ynh, ynl} = macs(coeffs[j], state[j], ynh, ynl); }
  state[0] = xn;
  { ynh, ynl} = macs(coeffs[0], xn, ynh, ynl);
  if (s sext(ynh,24) == ynh) {
    ynh = (ynh << 8) | (((unsigned) ynl) >> 24);
  } else if (ynh < 0) { ynh = 0x80000000; }
  else { ynh = 0x7fffffff; }
  return ynh; }
    
```

# PhD Research Topic

## Abstract Interpretation-based **Static Analysis of Cost Properties** (resource consumption) of software, with a particular focus on **Energy Consumption**

### Cost Analysis: Bounds on Resource Consumption



WCET,  
Side-Channel



Parallelisation,  
Scheduling



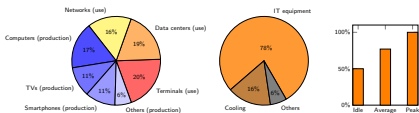
Transparency, Optimisation

# PhD Research Topic

## Abstract Interpretation-based **Static Analysis of Cost Properties** (resource consumption) of software, with a particular focus on **Energy Consumption**

Key personal motivation, in terms of societal impact: **carbon footprint of IT.**

Share of global emissions:  
**2.5%  $\rightsquigarrow$  5%** in the last ten years.



Energy Usage in IT. By subfield, and case studies on a data center.

Energy consumption of *programs* is relevant and understudied by carbon audit experts.

Previous collaboration: **ENTRA** project  
**EN**ergy **TR**ansparency



Also in contact with associations on evolution of carbon norms and regulations.



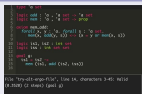
# Personal Research Interests and Background

## Background

- **2016–2018**, Preparatory Classes, Mathematics / Physics  
(Louis-le-Grand, Paris, France)
- **2018–2022**, École Polytechnique, MSc  
Multidisciplinary school of Engineering and Public Administration  
Major: Theoretical Computer Science and Mathematics
- **2021–2022**, MPRI, Formal Methods and Programming Languages, MSc  
Joint degree ENS/Polytechnique/Université de Paris

## Selected Past Projects (pre-PhD)

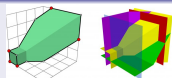
### Computer Science



SMT-Solver Alt-Ergo

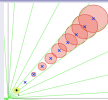


Categorical Approaches  
on Model Checking



Abstract Interpretation of Neural Networks  
using Tropical Geometry [SAS21]

### Mathematics Outreach



Undergraduate book on S-unit equations  
Geometric and Algebraic Number Theory



High-school  
Research Tournaments



High-school MOOCs

# Personal Research Interests and Background

## Current Research Interests

### Static Analysis of Programs and Systems

- Automated discovery of truths, beyond verification: *automated understanding and improvement*
- **Abstract Interpretation**
- **“Bounding the behaviour of systems”**, beyond software: hardware/networks, or even cyberphysical systems, biochemical reaction networks

### Applied Semantics

- Denotational Approaches
- Abstraction Methods
- **Order Theory**

### Geometric Viewpoints

### (Generalised) Recurrence Equations

i.e. functional discrete equations,  $f : \mathbb{Z}^k \rightarrow \mathbb{R}$ .

- Accurate, executable abstractions of systems
- Non-linear invariant inference
- Non-standard equations (CAS vs programs)

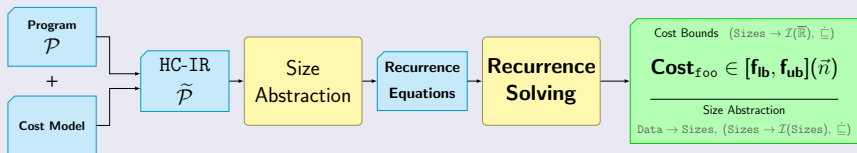
### Dynamic/Static Cooperations

- Machine Learning + Formal Methods
- Observation + Reasoning
- (Optimisation/Search) + (Logic/Order)

# PhD Research Topic

Abstract Interpretation-based **Static Analysis of Cost Properties** (resource consumption) of software, with a particular focus on **Energy Consumption**

## Our cost analysis pipeline



## Challenges

- Fine-grained (energy) cost models, hardware behaviours, etc.  
[WIP]. C.f. [ENTRA], WCET literature.
- Complex control flows, general programs  
[RustenholzMSc22, TPLP24, SAS24]. [WIP].
- State of the art in recurrence solvers  
[op.cit.].
- Improve size abstractions  
[RidouxMSc24]. [WIP].



# Generalised Recurrence Equations

i.e. functional discrete equations,  $f : \mathbb{Z}^k \rightarrow \mathbb{R}$ . (Undecidable: must aim for bounds.)

## CAS vs Generalised Equations

$$f(n) = a(n) \cdot f(\mathbf{n} - \mathbf{1}) + b(n)$$

complex factors, simple recursive calls  
(classical computer algebra)

$$f(\vec{n}) = \begin{cases} \dots \\ a \cdot f(\phi(\vec{n})) + b(\vec{n}) \\ \dots \end{cases}$$

simple factors, complex recursive calls  
complex control flow  
(program analysis)

## Conditionals, non-linear recursion, ...

$$f(\vec{n}) = \begin{cases} \dots \\ \sum_{j=1}^{k_i} (a_{i,j}(\vec{n}) \cdot f(\phi_{i,j}(\vec{n}))) + b_i(\vec{n}) & \text{if } \varphi_i(\vec{n}) \\ \dots \end{cases}$$

where  $a_{i,j} \geq 0$ , and  $\phi_{i,j}, b_i, \varphi_i$  arbitrary.

## (Unbounded) max/min

$$f(n) = \begin{cases} 0 & \text{if } n \leq 2 \\ n + \max_{1 \leq k \leq n-1} f(k) + f(n-k) & \text{if } n > 2 \end{cases}$$

## Self-composition

$$f(n) = \begin{cases} f(f(n-1)) + 1 & \text{if } n > 0 \\ 0 & \text{if } n = 0 \end{cases}$$

# Equation solving as pre/postfixpoint search [SAS24]

Equations  $\leftrightarrow$  Operators      Solutions  $\leftrightarrow$  Fixpoints      Bounds  $\leftarrow$  Pre/Postfixp

## Example

Search  $f : \mathbb{N}^2 \rightarrow \mathbb{R}$  such that

$$f(n, c) = \begin{cases} f(n-1, 0) + n + 300 & \text{if } n > 0 \text{ and } c \geq 100, \\ f(n-1, c+1) + n & \text{if } n > 0 \text{ and } c < 100, \\ c & \text{if } n = 0, \end{cases} \rightarrow$$

## Example

Search  $f : \mathbb{N}^2 \rightarrow \mathbb{R}$  such that  $f = \Phi f$ , i.e.  $f \in \text{Fixp}(\Phi)$ , where

$$\Phi : (\mathbb{N}^2 \rightarrow \mathbb{R}) \rightarrow (\mathbb{N}^2 \rightarrow \mathbb{R})$$
$$f \mapsto (n, c) \mapsto \begin{cases} f(n-1, 0) + n + 300 & \text{if } n > 0 \text{ and } c \geq 100, \\ f(n-1, c+1) + n & \text{if } n > 0 \text{ and } c < 100, \\ c & \text{if } n = 0. \end{cases}$$

For a complete lattice, order  $\mathcal{D} \rightarrow \mathbb{R}$  pointwise, and extend to  $\overline{\mathbb{R}} := \mathbb{R} \cup \{\pm\infty\}$

## Theorem

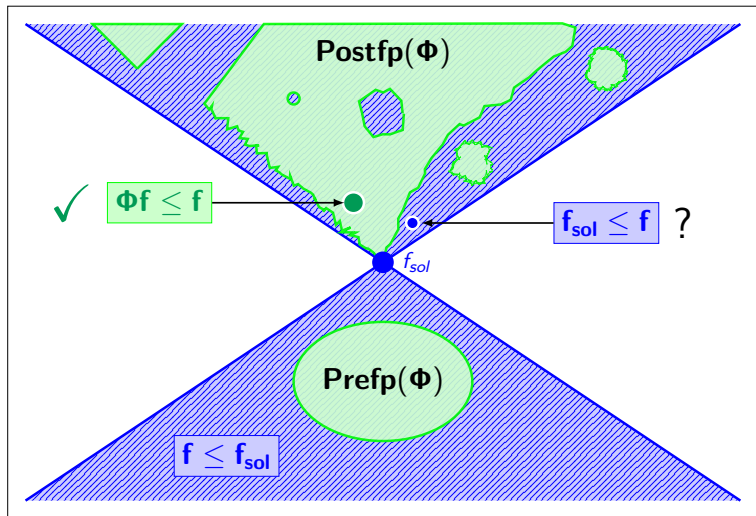
Let  $\Phi : (\mathcal{D} \rightarrow \overline{\mathbb{R}}) \rightarrow (\mathcal{D} \rightarrow \overline{\mathbb{R}})$  be a **monotone equation**.

- If  $f \in \text{Postfp}(\Phi)$ , i.e.  $\Phi f \leq f$ , then  $\text{lfp } \Phi \leq f$ .
- If  $f \in \text{Prefp}(\Phi)$ , i.e.  $f \leq \Phi f$ , then  $f \leq \text{gfp } \Phi$ .

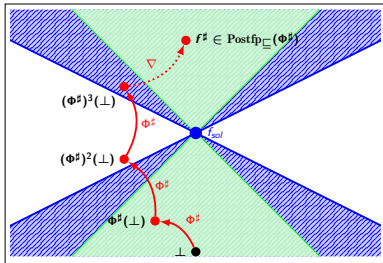
Insight: cost equations are typically monotone for this pointwise order.

# Equation solving as pre/postfixpoint search [SAS24]

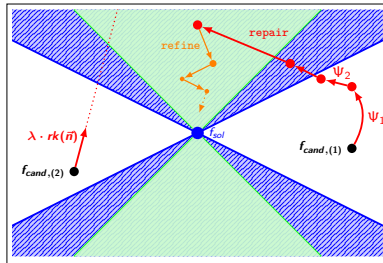
Equations  $\leftrightarrow$  Operators    Solutions  $\leftrightarrow$  Fixpoints    Bounds  $\leftarrow$  Pre/Postfixp



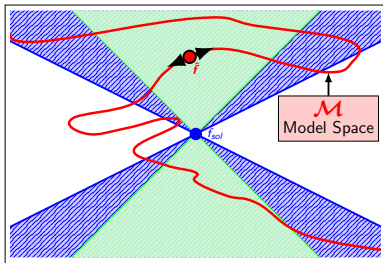
# Equation solving as pre/postfixpoint search [SAS24]



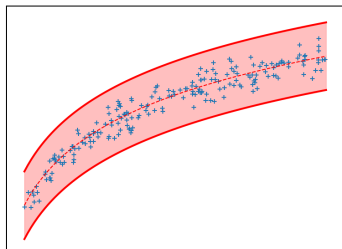
Abstract Interpretation



Geometry-based expression Repair



Search on subvarieties: **Templates**,  $\forall$ -elim



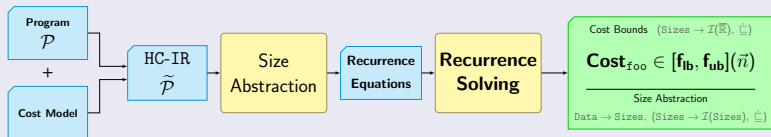
Constrained **Optimisation**,  
with *provability constraints*

# Interval Recurrence Equations @ Roskilde

Generalised signatures (richer domains/codomains):

- Classical:  $\mathbb{Z}^k \rightarrow \mathbb{R}$
- **Intervals**:  $\mathbb{Z}^k \rightarrow \mathcal{I}(\mathbb{R})$ ,  $\mathcal{I}(\mathbb{Z})^k \rightarrow \mathcal{I}(\mathbb{R})$ ,  $\mathcal{I}(\mathbb{Z})^k \rightarrow \mathcal{I}(\mathbb{Z})^r$
- With environment:  $L^\sharp \rightarrow \mathcal{I}(\mathbb{Z})^k \rightarrow \mathcal{I}(\mathbb{R})$

## Cost analysis pipeline



- Novel size abstractions  $\rightsquigarrow$  **interval** equations more appropriate.
- Non-monotonic equations? Set/**interval** approach. (CPS/CRN, virtual counters, ...)

To solve them, we want some **bound separation** technique.

$$\Phi_{\mathcal{I}} \in ((\mathbb{Z}^k \rightarrow \mathcal{I}(\mathbb{R})) \rightarrow (\mathbb{Z}^k \rightarrow \mathcal{I}(\mathbb{R}))) \rightarrow (\Phi_{lb}, \Phi_{ub}) \in ((\mathbb{Z}^k \rightarrow \mathbb{R}) \rightarrow (\mathbb{Z}^k \rightarrow \mathbb{R}))^2$$

# Interval Recurrence Equations @ Roskilde

To solve them, we want some **bound separation** technique.

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- Typical approach is conservative (and not yet well-formalised), especially in presence of some non-monotonicity.
- John has discovered a phenomenon where it is possible to preserve more precision.

$$\Phi_{\mathcal{I}} \rightarrow (\Phi_{\downarrow}, \Phi_{\uparrow})$$

However, its soundness is not yet proven, and seems to rely on the structure of  $\Phi_{\mathcal{I}}$ .

**Monotonicity properties.** Synchronised non-determinism?

- We will investigate the principles underlying this phenomenon: find out correct assumptions, and conclude with a proof.

Thank you for hosting me!

Questions?

(Now or later this month)