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# 40 Years of Adventure in Abstract Interpretation of Logic Programs

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Manuel Hermenegildo

with lots of help over the years from (among others):

**D. Cabeza**, E. Albert, P. Arenas, F. Bueno Carrillo, M. Carro, A. Casas, M. Codish, J. Correas, S.K. Debray, M. García de la Banda, S. Genaim, N.-W. Lin, P. López-García, K. Marriott, M. Marron, E. Mera, J. Morales, K. Muthukumar, M. Méndez-Lojo, J. Navas, P. Pietrzak, G. Puebla, F. Rossi, P. Stuckey, C. Vaucheret, R. Warren, D. Zanardini

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# ~~40~~ 25 Years of Adventure in Abstract Interpretation of Logic (and Imperative) Programs

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~~40~~ 25 Years of Adventure in  
Abstract Interpretation of Logic (and Imperative) Programs  
Or: *From Parallelism to Program Development and Back*

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# The Paper

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## *Non-Strict Independence-Based Program Parallelization Using Sharing and Freeness Information*

Daniel Cabeza and Manuel Hermenegildo

- Abstract Interpretation, Logic Programming, Parallelism.
- Done within the ParForCE project, time of great Pisa-Madrid collaboration.
- An attempt to complete some missing parts on this (now old, but relevant) topic.

Provide context: what happened before and after.

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## The Original Challenge / Early Steps: Parallelization and Abs. Int.

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- The original problem: LP parallelization (circa 1983 in US: UT Austin, MCC):
  - Parallel abstract machine, &-Prolog [ICLP'86, ICLP'87, ...]  $\Rightarrow$  real speedups!
  - Detecting dependencies (pointer “sharing”) among proc. calls, statements, etc.

Traditional approach (ad-hoc dataflow analysis [Chang, Despain, Degroot '85]):  
correctness? — we wanted something *rigorous and more powerful*.

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Traditional approach (ad-hoc dataflow analysis [Chang, Despain, Degroot '85]):  
correctness? — we wanted something *rigorous and more powerful*.
- Our first “obsession:” correctness/practicality –speedups possible? AI practical?  
Built system [Warren, Debray, Herme. “MA3 system” ICSLP'88]
- Bruynooghe’s framework [87-91]: multivariance + genericity of framework  
–parametric on the domains– (but no tabling or efficient fixpoint).
- The fixpoint algorithm and PLAI analyzer: efficient, context sensitive, multivariant,  
parametric analysis! [Muthukumar, Herme. NACL'89]
  - Tabling, multiple call–success pairs Dependency tracking Interprocedural,  
dealing with mutual recursion, etc. (project/extend).
- Many useful extensions (1990 on, Spain, mostly at UPM; also UNM): Incremental  
framework; CLP; concurrent programs; Extension to Java/Java bytecode

## Some Achievements in Parallelization

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- Fully automatic parallelizers for logic programs
  - arguably the most powerful parallelizers for “irregular” applications.

[ Herme. and Warren, CAN’87, Bueno, G. de la Banda, and Herme. ICLP’94, TOPLAS’99]

  - Parallelization using non-strict independence [Cabeza and Herme. SAS’94]
  - Parallelization of constraint programs [G. de la Banda and Herme. PLILP’96]

Perhaps the first fully implemented, practical application of AI?
- Prompted considerable *abstract domain development*:
  - Set sharing. [Jacobs-Langen NACL 89, Muthukumar and Herme. NACL’89 (abstr. unif.)]
  - Set sharing and freeness. [Muthukumar and Herme. ICLP’91]
  - Def (propositional horn clauses) [de la Banda/Herme. WSA’92, Sondergaard, Marriott]
  - Combinations with depth-k, shape analysis (regular types), etc.
  - *Set sharing for Java* [Méndez-Lojo, Herme. VMCAI’08]
- (C)LP/Prolog/Ciao very useful: allow studying challenging problems (pointers, irregular computations, irregular data, dynamic heap, dynamic dispatch, etc.) in much better context.

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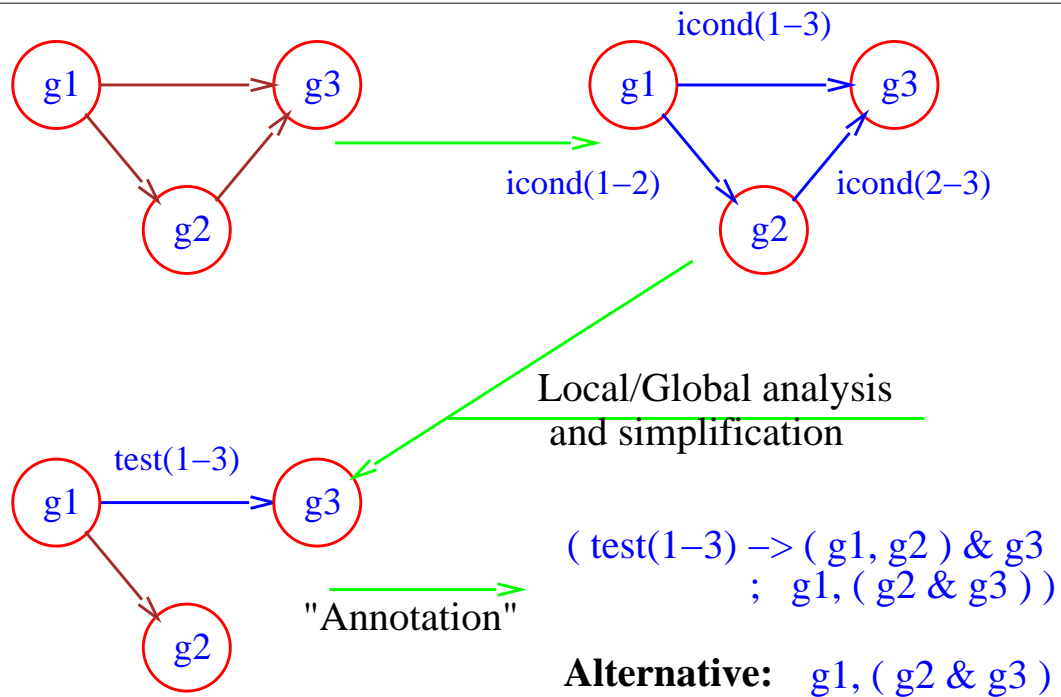
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- **ParForCE and other projects –much collaboration with Giorgio / Pisa!**



## Parallelization Process

- Conditional dependency graph (of some segment, e.g., a clause):
  - vertices are possible tasks (statements, calls,...),
  - edges=possible dependency (labels=conditions needed for independence).
- Local or global analysis used to reduce/remove checks in the edges.

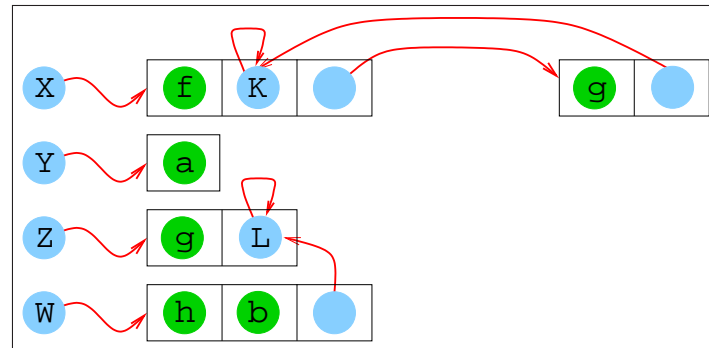
```
foo(...) :-
  g1(...),
  g2(...),
  g3(...).
```



## A Priori Independence: Strict Independence

- Correctness and efficiency (search space preservation) guaranteed for  $p$  &  $q$  if no shared variables.
- The “pointers” view:  
correctness and efficiency guaranteed if there are no “pointers” between  $p$  and  $q$ .

```
main :- X=f(K,g(K)), Y=a,
      Z=g(L), W=h(b,L),
      ----->
      p(X,Y),
      q(Y,Z),
      r(W).
```



$p$  and  $q$  are strictly independent, but  $q$  and  $r$  are not.

## Independence – Non-Strict Independence

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- Pure goals: only one thread “touches” each shared variable. Example:

```
main :- t(X,Y), p(X), q(Y).
t(X,Y) :- Y = f(X).
```

- Impure goals: only rightmost “touches” each shared variable. Example:

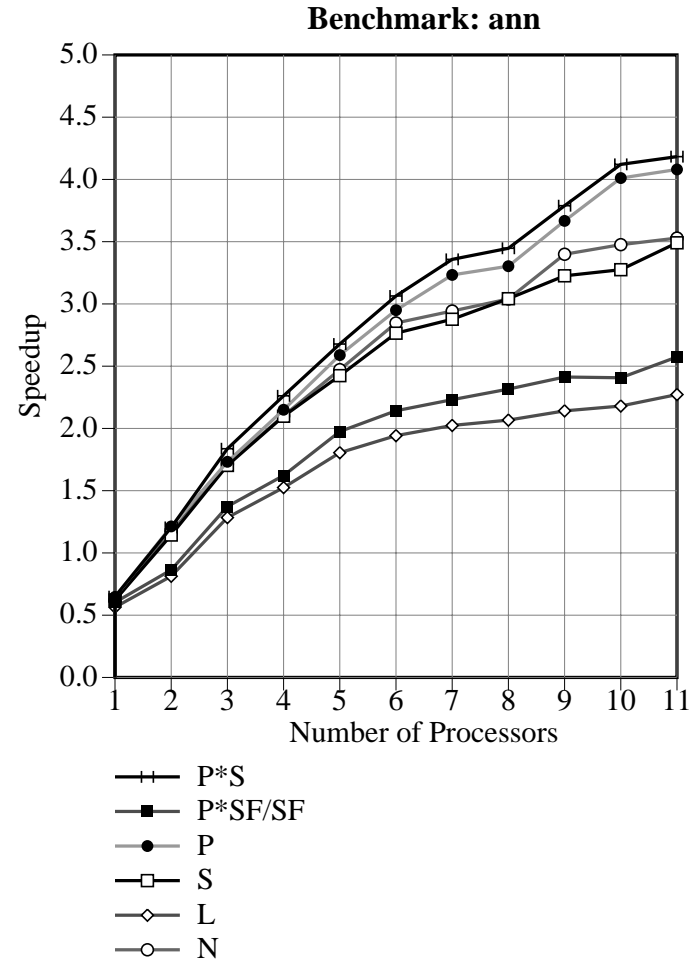
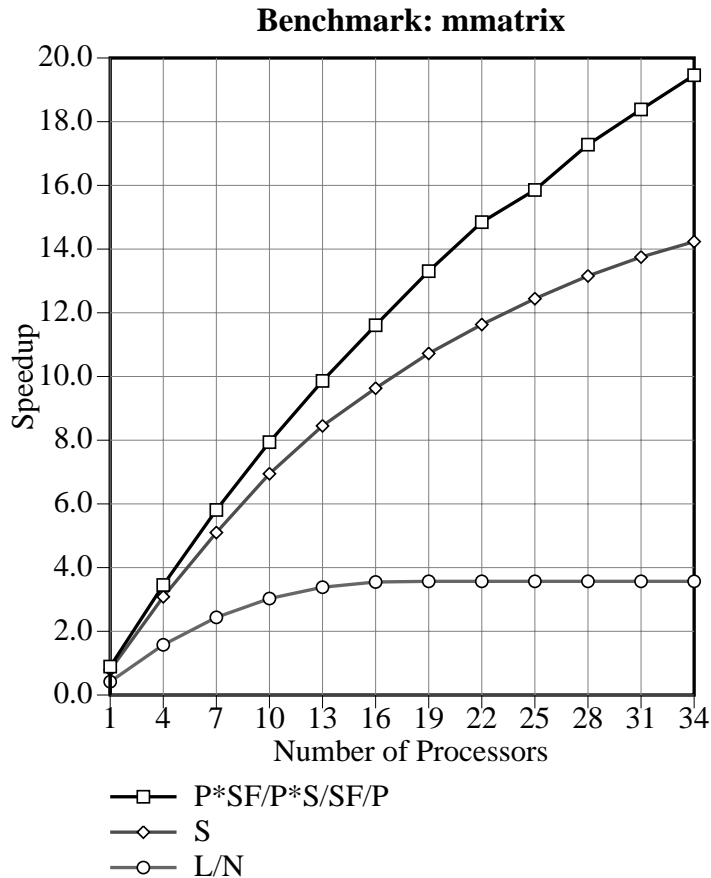
```
main :- t(X,Y), p(X), q(Y).
t(X,Y) :- Y = a.    p(X) :- var(X), ..., X=b, ...
```

- Very important in programs using “incomplete structures.”

```
flatten(Xs,Ys) :- flatten(Xs,Ys, []).
flatten([], Xs, Xs).
flatten([X|Xs],Ys,Zs) :- flatten(X,Ys,Ys1), flatten(Xs,Ys1,Zs).
flatten(X, [X|Xs], Xs) :- atomic(X), X \== [].
```

- Another example: qsort with difference lists.
- **Paper:** NSI from sharing+freeness; new run-time tests (allvars, sharedvars).

## Some Speedups (Using Different Abstract Domains)



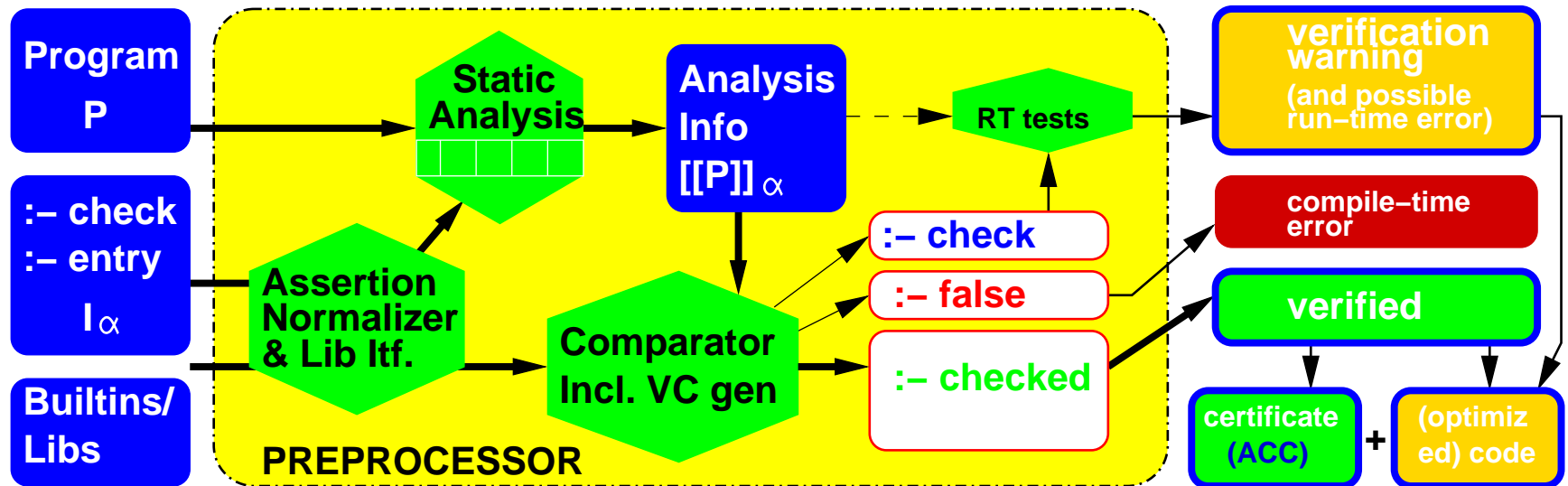
*(ann is the parallelizer parallelizing itself;  
1-10 proc.: actual speedups on Sequent Symmetry; 10+ simulator projections from execution traces)*

## The Second Phase: Program Development using AI / Next Gen. LP

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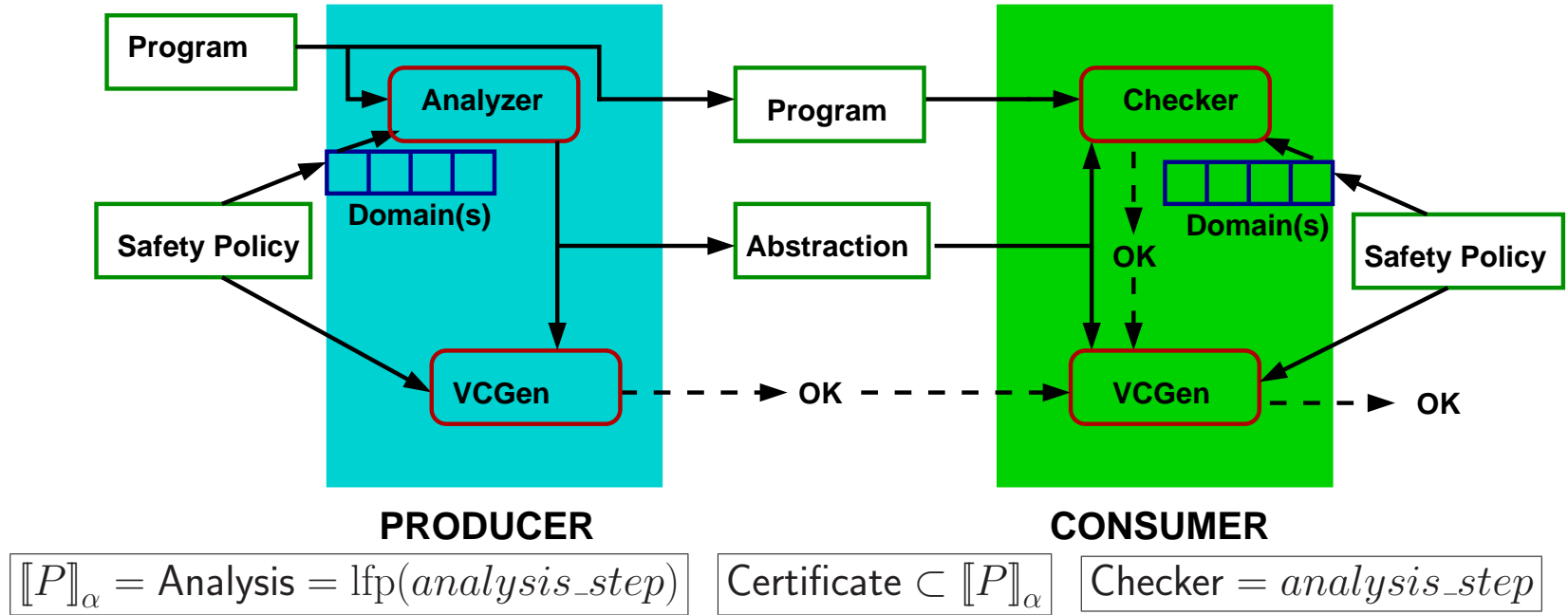
- The next stage:
  - not just optimization (parallelization, abstract partial evaluation, ...), but
  - **program development** fundamentally based on abstract interpretation.
- Great influence of AI and LP in **programming language design**:  
**the “Ciao” language and environment design**;  
*AI-based* compiler / env. (assertion based vs. strongly-typed, type systems as domains, multiparadigm –again, Giorgio–, etc.).
- Ideas lurking for a long time, crystallized in first prototypes in 1994-97  
 [PPCP'94, Ciao system design], and:
  - Overall design [ILPS'97, AADEBUG'97, ICLP'99, LOPSTR'99, SAS'03, SCP'05]
  - Assertion language [LNCS 1870]
  - Modular extensions [Pietrzak, Correas, Puebla, Herme. LPAR'06]
  - Abstract diagnosis [Alpuente, Comini, Escobar, Falaschi, Lucas, LOPSTR'02] [Gallardo, Merino, Pimentel, SAS'02] [Pietrzak, Herme. ICLP'07]
  - Extensions to Java [Albert, Gómez-Zamalloa, Hubert, Puebla PADL'07]

# The CiaoPP Verification/Diagnosis Framework [AADEBUG'97]

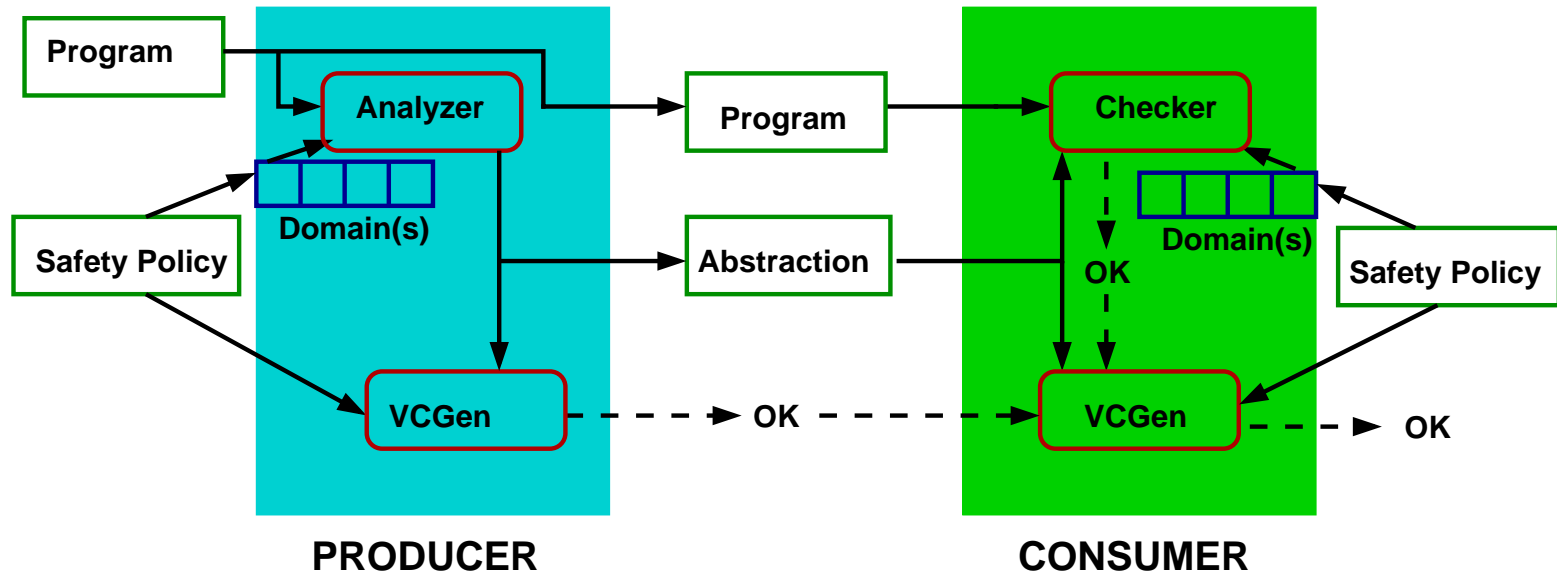


- $I_\alpha$  (partial specification) provided via a language of *optional* assertions.
  - State properties at relevant points.
  - Talk about properties which can be predefined or user-defined.  
Types, cost, data sizes, termination, pointer aliasing, no-exception, ...
- Implemented for Ciao and (less mature) for Java and Java bytecode.

# The Abstraction Carrying Code (ACC) Scheme



## The Abstraction Carrying Code (ACC) Scheme



$$\llbracket P \rrbracket_\alpha = \text{Analysis} = \text{lfp}(\text{analysis\_step})$$

$$\text{Certificate} \subset \llbracket P \rrbracket_\alpha$$

$$\text{Checker} = \text{analysis\_step}$$

- Basic proposal [Albert, Puebla, Herme. COCV'04, LPAR'04, ICLP'04, PPDP'05, NGC'08]
- Incremental version [Albert, Arenas, Puebla LPAR'06]
- Certificate reduction (fixpoint compression) [Albert, Arenas, Puebla, Herme. ICLP'06]
- MOBIUS project [TGC'06].
- Incorporated in CiaoPP for types, modes, shapes, sizes, cost, det, termination, non-failure, resources, etc.



## Combination with Partial Evaluation; Optimization; Scalability

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- Combination with Partial Evaluation:
  - Abstract executability. Multiple abstract specialization [Puebla, Herme. PEPM'95]; application in parallelization [LOPSTR'97, JLP'99]
  - Full integration of Partial Evaluation and AI [Puebla, Albert, Herme. SAS'06]  
→ important contribution to the AI-based program development model.
- Application to program optimization (other than parallelization): abstract machines and native compilation [Morales, Carro, Herme. PADL'04, ICLP'05, LOPSTR'06]; embedded systems [Carro, Morales, Muller, Puebla, Herme. CASES'06].
- Modularity, Scalability, Practicality Issues:
  - Efficient, incremental intermodular analysis / fixpoint calculation [Bueno, G. de la Banda, Herme., Marriott, Puebla, Stuckey, Correas LOPSTR'01, LOPSTR'04, LOPSTR'05].
  - Widening of set-sharing [Navas, Bueno, Herme. PADL'06]
  - Dealing with the full ISO-Prolog standard [Bueno, Cabeza, Herme., Puebla ESOP'96]
- Domain combinations, goal-dependent vs. goal indep. analysis (flow sensitivity) [Codish, Mulkers, Bruy., G. de la Banda, Herme. PEPM'93, LPAR'94, TOPLAS'95, JLP'97]

## Inference of Resource-related and other Complex Properties

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- Cost, resources (motivated by granularity control –lots of AI!):
  - Upper bounds (execution steps); application to granularity control [Debray, Lin, Herme., PLDI'90].
  - Lower bounds (execution steps) [w/López-García, ILPS'97, SAS'94].
  - Extension to Java bytecode [Albert, Arenas, Genaim, Puebla, Zanardini ESOP'07].
  - Execution times [Mera, López-García, Puebla, Carro, Herme., PADL'07].
  - User-definable resources for LP [Navas, Mera, López-García, Herme., ICLP'07].
  - Heap space analysis (Java bytecode) [Albert, Genaim, Gómez-Zamalloa, ISMM '07].
- Non-failure / no exceptions  
[Bueno, Debray, López-García, Herme. ICLP'97]; **multivariant version** [FLOPS'04].
- Determinacy analysis [Bueno, López-García, Herme. LOPSTR'04].
- Heap / shape analysis (C++/Java) [Marron, Herme., Kapur, Stefanovic LCPC'06, PASTE'07, CC'08]; Type domains, type widenings [Vaucheret, Bueno SAS'02].
- Termination analysis (Java) [Albert, Arenas, Codish, Genaim, Puebla, Zanardini WST'07].

## Final Thoughts / The Next 25 Years!

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- Go mainstream, make everyday tools! (Ciao, COSTA, ...) –coll. w/Industry (e.g., ES\_PASS).
  - Further work on scalability, modularity, domains, widenings, ...
  - Emphasis on resource-related properties; specially *user-defined*.
  - Improve diagnosis.
  - Develop ACC further, apply in practice to, e.g., small devices (MOBIUS).
  - Multi-language environments.
- *Back to parallelism! A big push to **parallelization**, **granularity control**, ...*
- *Develop new, even more dynamic, multiparadigm, high-level languages, getting correctness and real speed (without user burden), thanks to LP and AI.*

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But, mainly, thanks Giorgio –what an adventure!  
Look forward to the next 25 years together!

## Conditions for Non-Strict Independence Based on ShFr Info

- We consider the parallelization of pairs of goals.

- Let the situation be:  $\{\widehat{\beta}\} p \{\widehat{\psi}\} \dots q$ .

We define:

$$S(p) = \{L \in \widehat{\beta}_{SH} \mid L \cap (\neq \emptyset)\}$$

$$SH = S(p) \cap S(q) = \{L \in \widehat{\beta}_{SH} \mid L \cap (\neq \emptyset) \\ \wedge L \cap (\neq \emptyset)\}$$

- Conditions for non-strict independence for p and q:

$$C1 \quad \forall L \in SH \quad L \cap \widehat{\psi}_{FR} \neq \emptyset$$

$$C2 \quad \neg (\exists N_1 \dots N_k \in S(p) \quad \exists L \in \widehat{\psi}_{SH}$$

$$L = \cup_{i=1}^k N_i \quad \wedge \quad N_1, N_2 \in SH$$

$$\wedge \forall i, j \quad 1 \leq i < j \leq k \quad N_i \cap N_j \cap \widehat{\beta}_{FR} = \emptyset)$$

- C1: preserves freeness of shared variables.
- C2: preserves independence of shared variables.
- More relaxed conditions if information re. partial answers and purity of goals.

## Run-Time Checks for NSI Based on ShFr Info

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- Run-time checks can be automatically included to ensure NSI when the previous conditions do not hold.
- The method uses analysis information.
- Possible checks are:
  - $\text{ground}(X)$ :  $X$  is ground.
  - $\text{allvars}(X, \mathcal{F})$ : every free variable in  $X$  is in the list  $\mathcal{F}$ .
  - $\text{indep}(X, Y)$ :  $X$  and  $Y$  do not share variables.
  - $\text{sharedvars}(X, Y, \mathcal{F})$ : every free variable shared by  $X$  and  $Y$  is in the list  $\mathcal{F}$ .
- The method generalizes the techniques previously proposed for detection of SI.
- Even when only SI is present, the tests generated may be better than the traditional tests.