

Search Combinators

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**Search heuristics
are crucial.**

Support for Search?

General Purpose
Programming Language



“everything is possible,
nothing is easy”

Solver-Provided
Options



“everything is easy,
nothing is possible”

State-of-the-Art

Modularity: Prolog

- ✓ `label1(Vars1) , label2(Vars2)`
- ✓ `label1(Vars1) ; label2(Vars2)`
- ✓ `once(label1(Vars1))`
- ✓ `once((label1(Vars1),label2(Vars2)))`

Lack of Modularity

X `Ids(label l (Vars l))`

Lack of Modularity

✗ `Ids(label1 (Vars1))`

✗ `Ids((label1 (Vars1) , label2(Vars2)))`

Lack of Modularity

✗ `Ids(label1 (Vars1))`

✗ `Ids((label1 (Vars1) , label2(Vars2)))`

✓ `Ids_label1 (Vars1)`

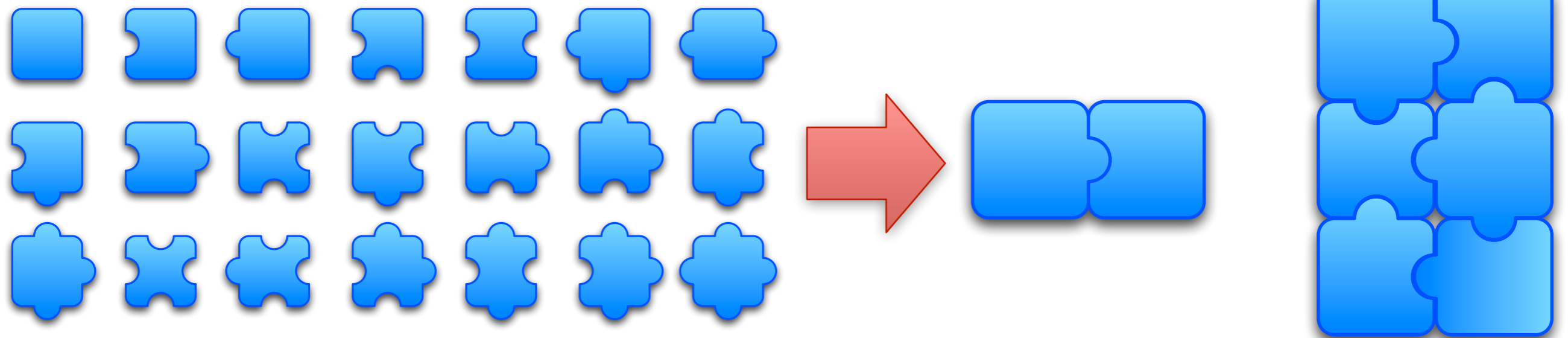
✓ `Ids_label1_label2(Vars1,Vars2)`

Can we do better?

- ✓ Lots of **expressivity** and flexibility
- ✓ Lots of **productivity** through high-level specifications
- ✓ **Modular reuse** of search specifications

Yes: Search Combinators

High-level **modular** building blocks



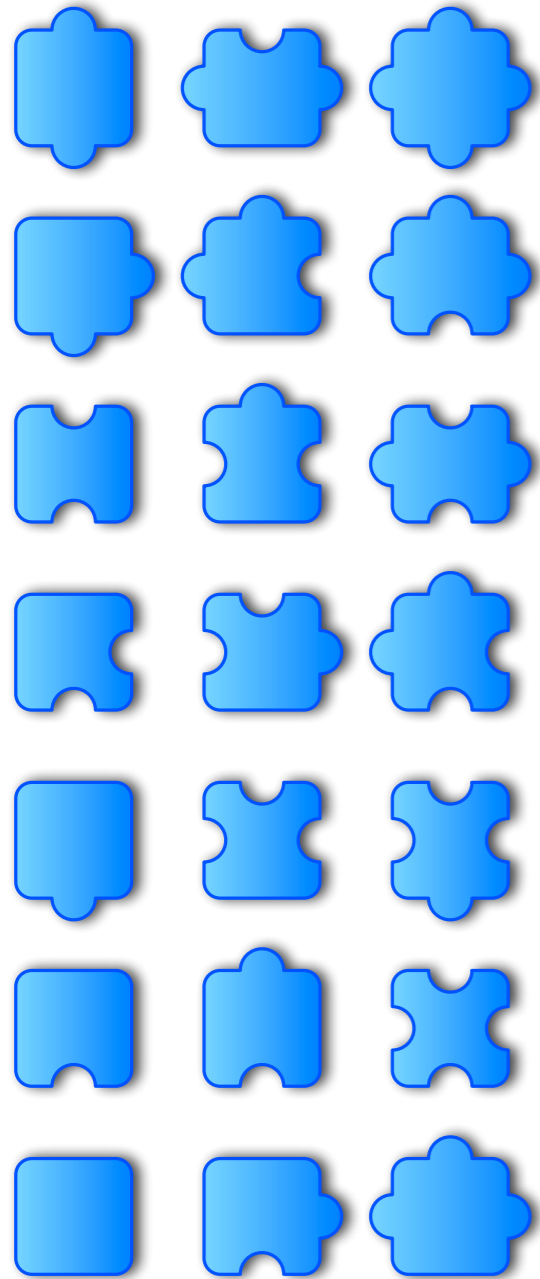
“Everything is possible and easy”

Base Search

```
s ≡  
int_search(vars, var_sel, val_sel)
```

- provided by the solver
- augment with combinators

Combinators



prune

let(v, e, s)

assign(v, e)

post(c, s)

if(c, s_1, s_2)

and($[s_1, s_2, \dots, s_n]$)

or($[s_1, s_2, \dots, s_n]$)

portfolio($[s_1, s_2, \dots, s_n]$)

restart(c, s)

Statistics Combinators



`depth (v , s)`



`discrepancy (v , s)`



`nodes (v , s)`

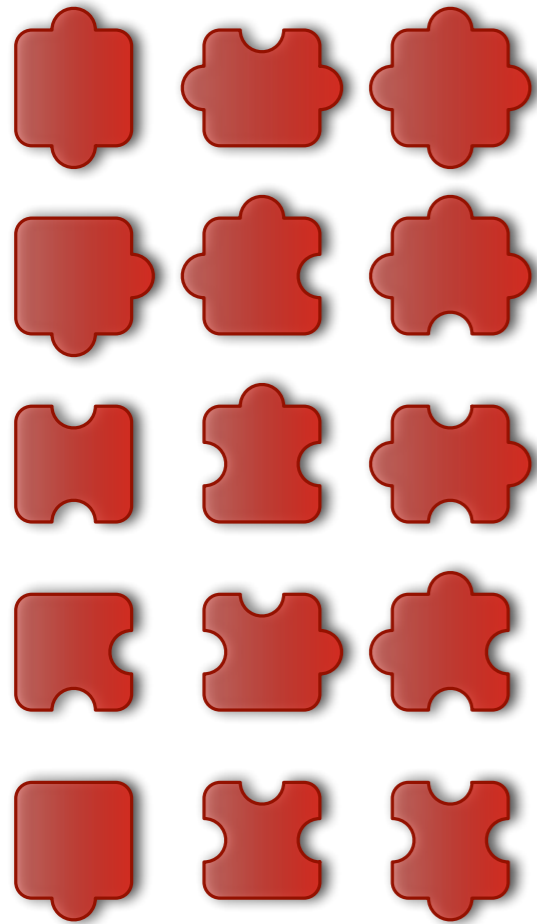


`failures (v , s)`



`time (v , s)`

Statistics Combinators



`depth(v, s)`

`discrepancy(v, s)`

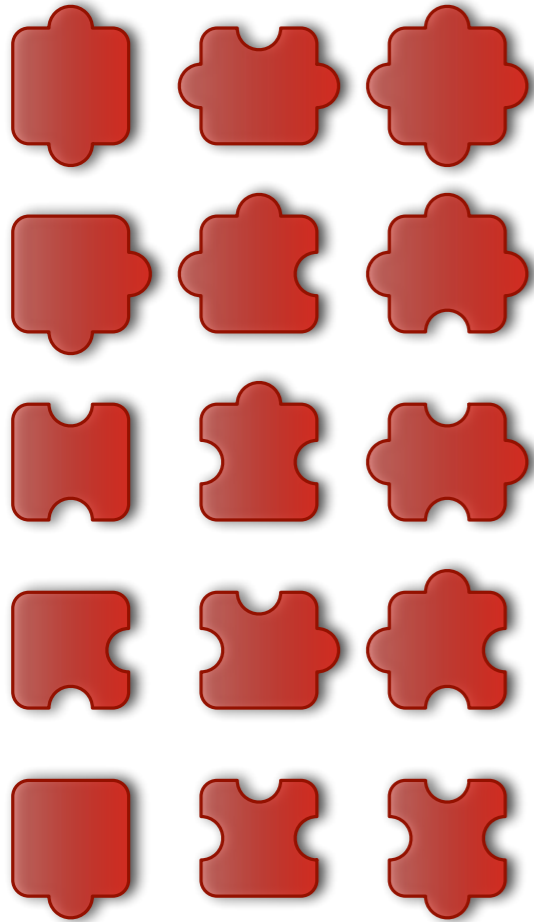
`nodes(v, s)`

`failures(v, s)`

`time(v, s)`

```
if(v < 5, depth(v, s1), s2)
```

Statistics Combinators



`depth (v , s)`

`discrepancy (v , s)`

`nodes (v , s)`

`failures (v , s)`

`time (v , s)`

`if (depth < 5 , s1 , s2)`

Reusable Abstractions

```
limit(c, s) ≡ if(c, s, prune)
```

```
for(v, l, u, s) ≡ ...
```

```
lds(s) ≡  
  for(n, 0, ∞,  
    limit(discrepancy ≤ n, s)  
  )
```

Reuse Examples

✓ `lds (int_search (vars, ...))`

✓ `lds (and ([int_search (vars1, ...)
 , int_search (vars2, ...)]))`

✓ `lds (or ([int_search (vars1, ...)
 , int_search (vars2, ...)]))`

...

More Abstractions

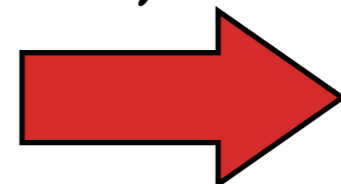
`bab(obj, s)`

`restart_bab(obj, s)`

`dicho(obj, s, lb, ub)`

`id(s)`

`hot_start(c, s1, s2)`



see paper

Radiotherapy Planning

```
bab(k,  
    and([int_search(N, ...)]  
        ++  
        [once(int_search(rowi, ...))  
          | i in 1..n  
        ]  
    )  
)
```

**Modular
Syntax**

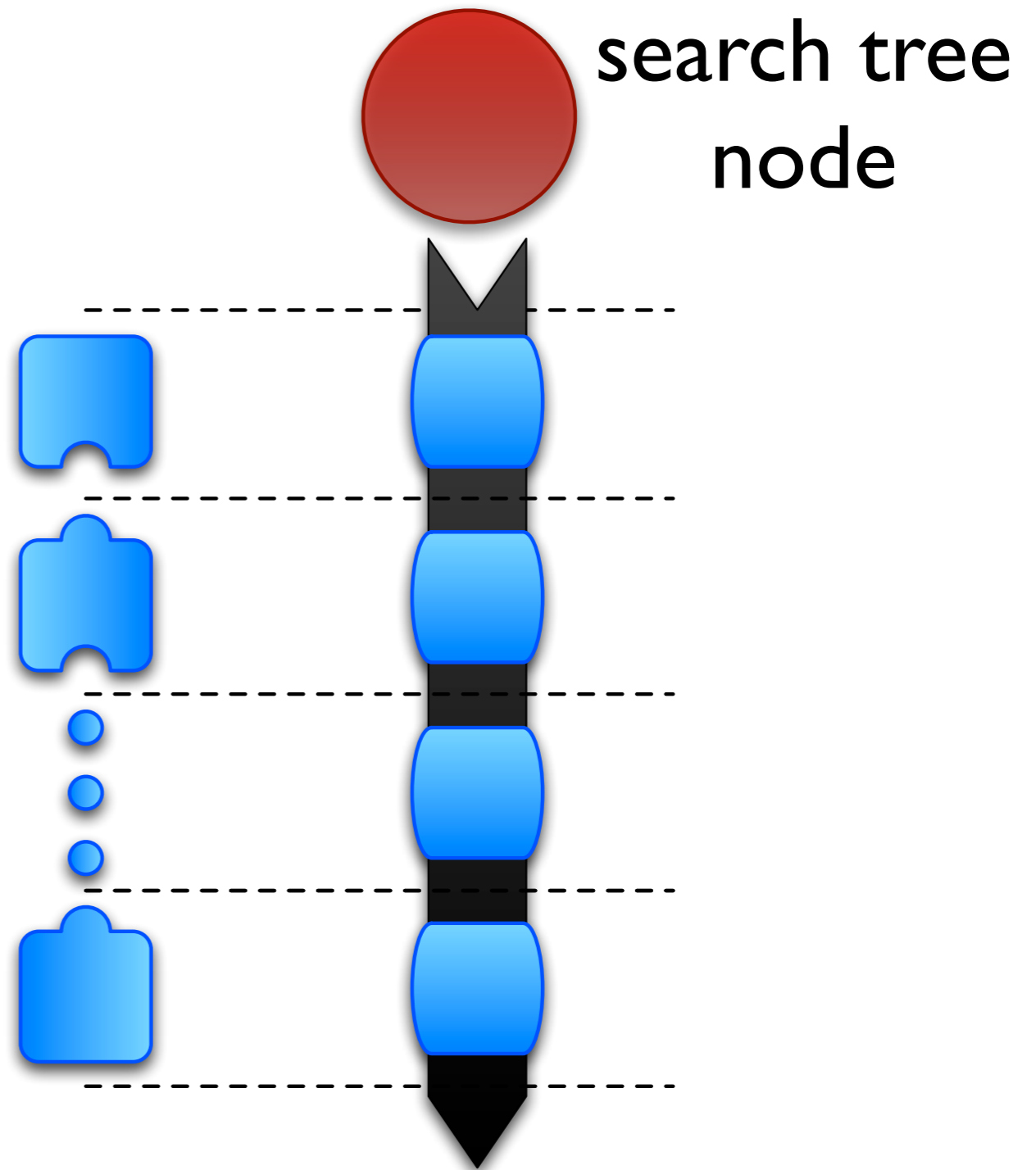
vs.

**Modular
Semantics**

Modular Semantics

traditional modularity:

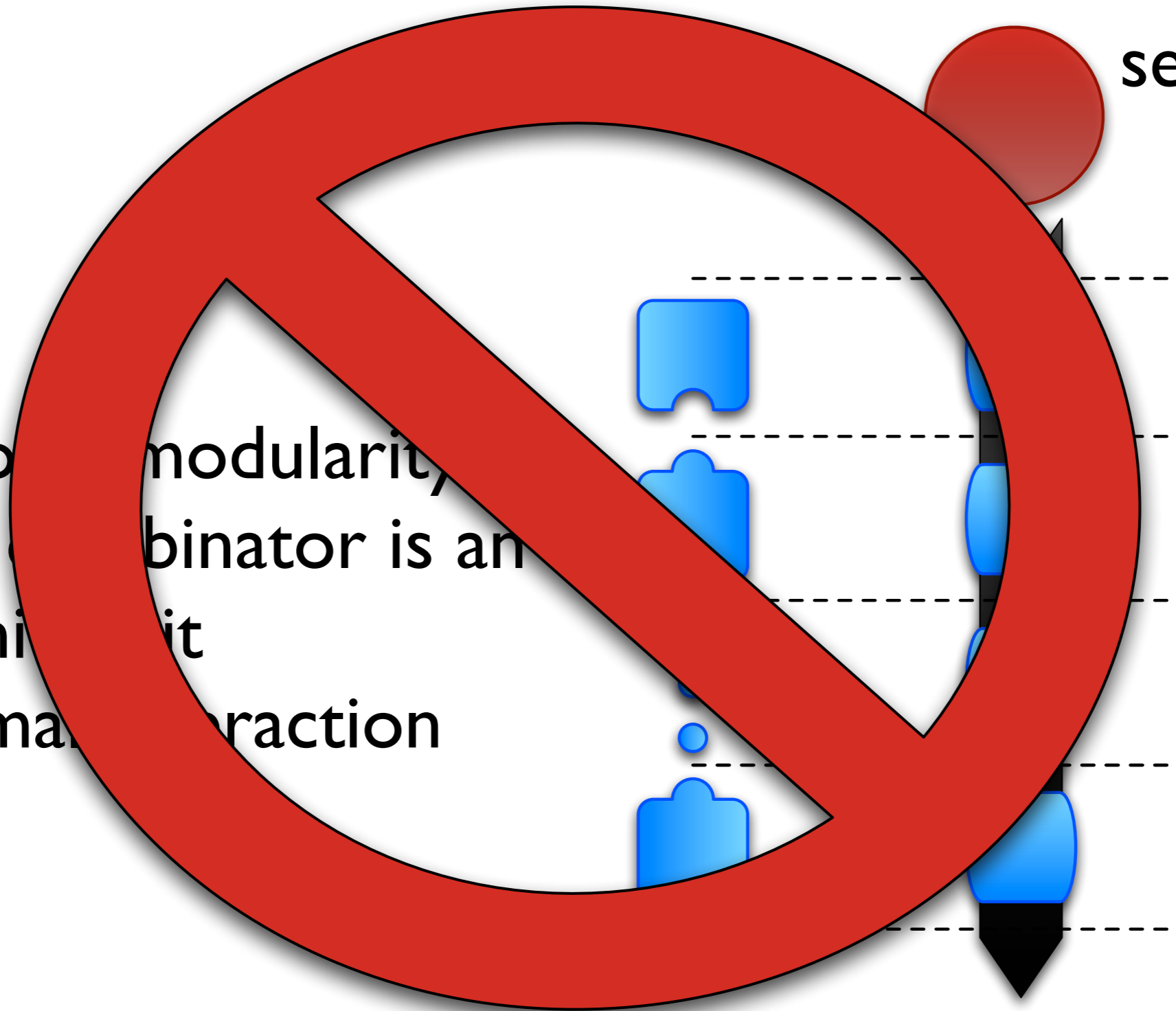
- each combinator is an atomic unit
- minimal interaction



Modular Semantics

search tree
node

- traditional modularity
- each combinator is an atomic unit
 - minimal interaction



Modular Semantics

- **cross-cutting** behavior
- highly **entangled** in monolithic code

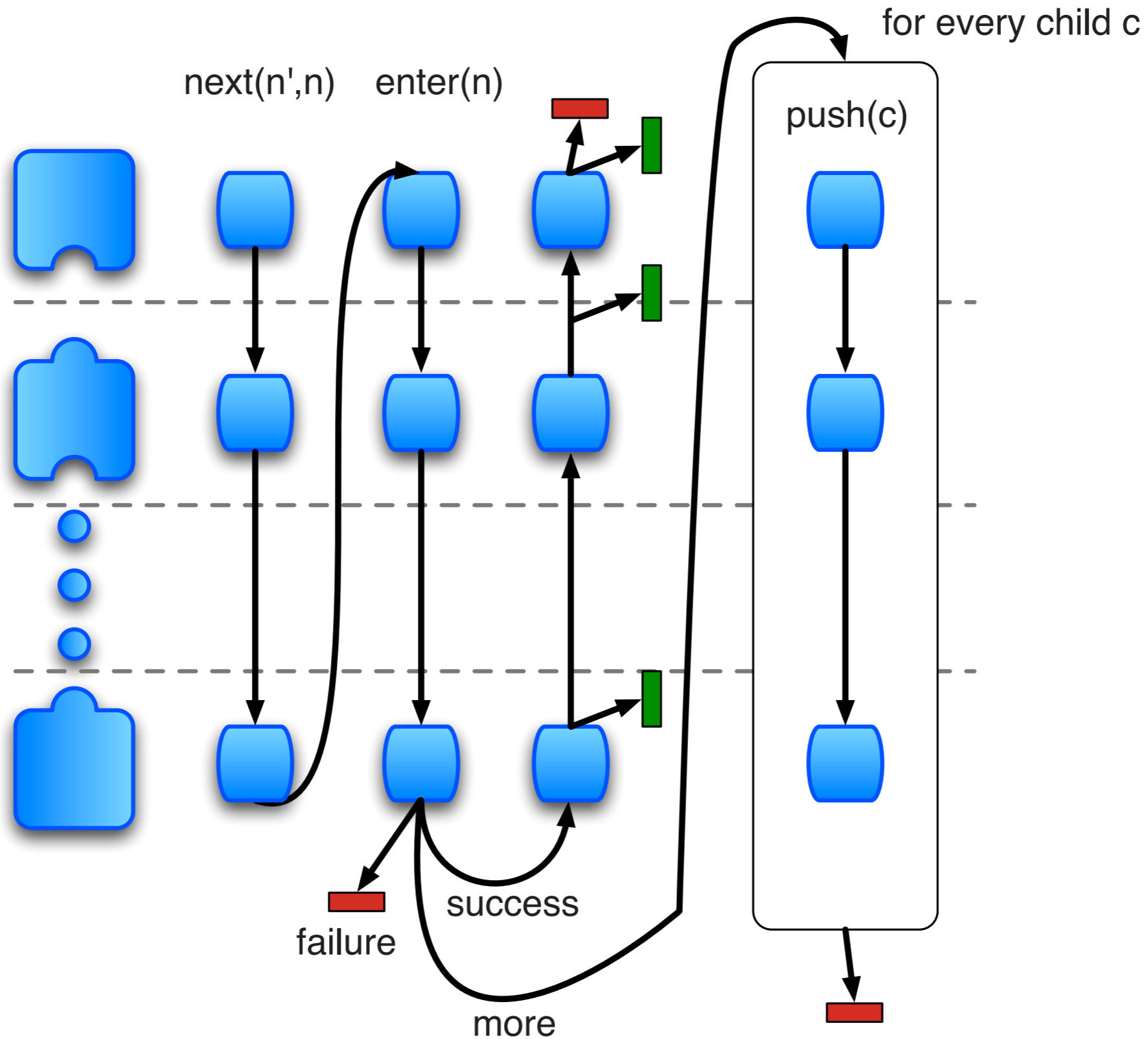


➔ “Aspect-Oriented Programming”

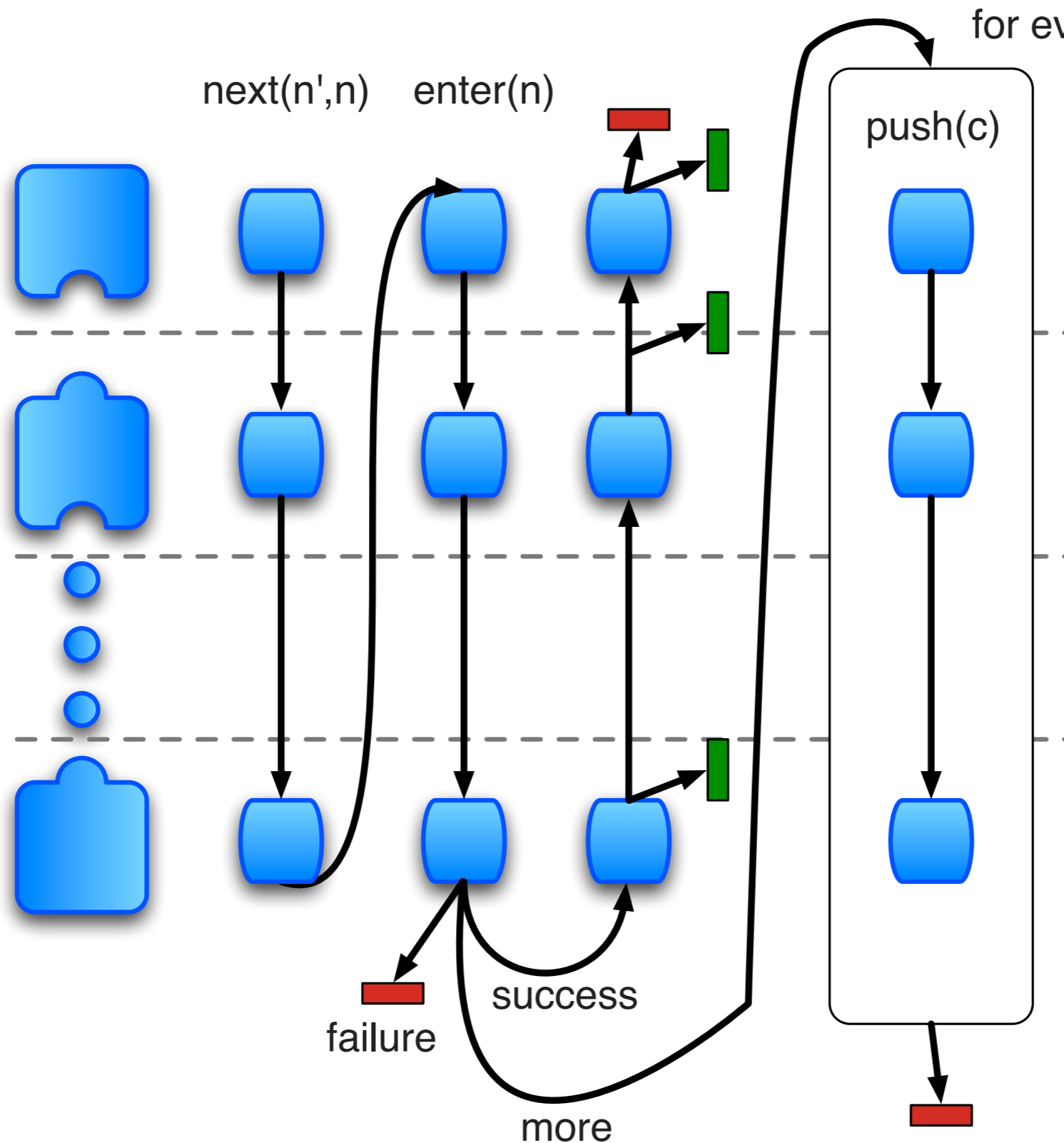
Functional **Mixin** Inheritance

- disciplined form of AOP
 - ★ meaningful and pre-defined set of interaction points
- no AOP system needed

Mixin-based Interaction



Mixin-based Interaction



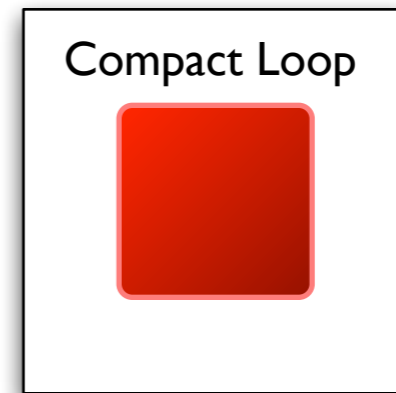
Details:
see paper

Implementations

DSL

Haskell

C++

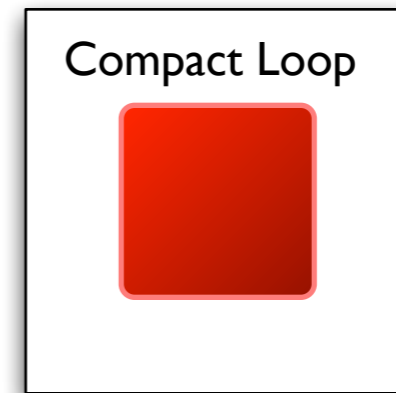
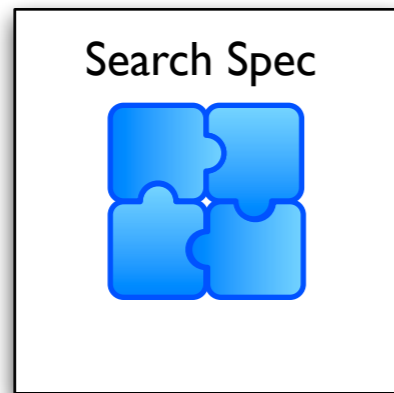


Implementations

DSL

Haskell

C++

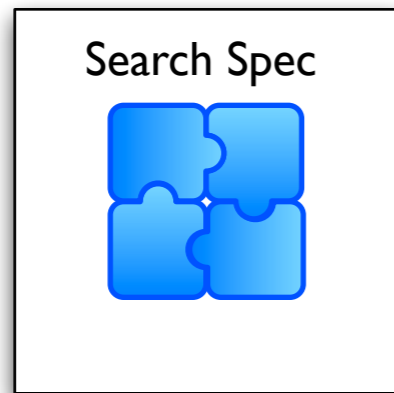


Implementations

DSL

Haskell

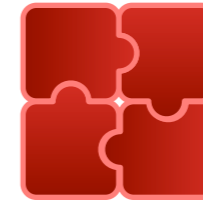
C++



Interpreted



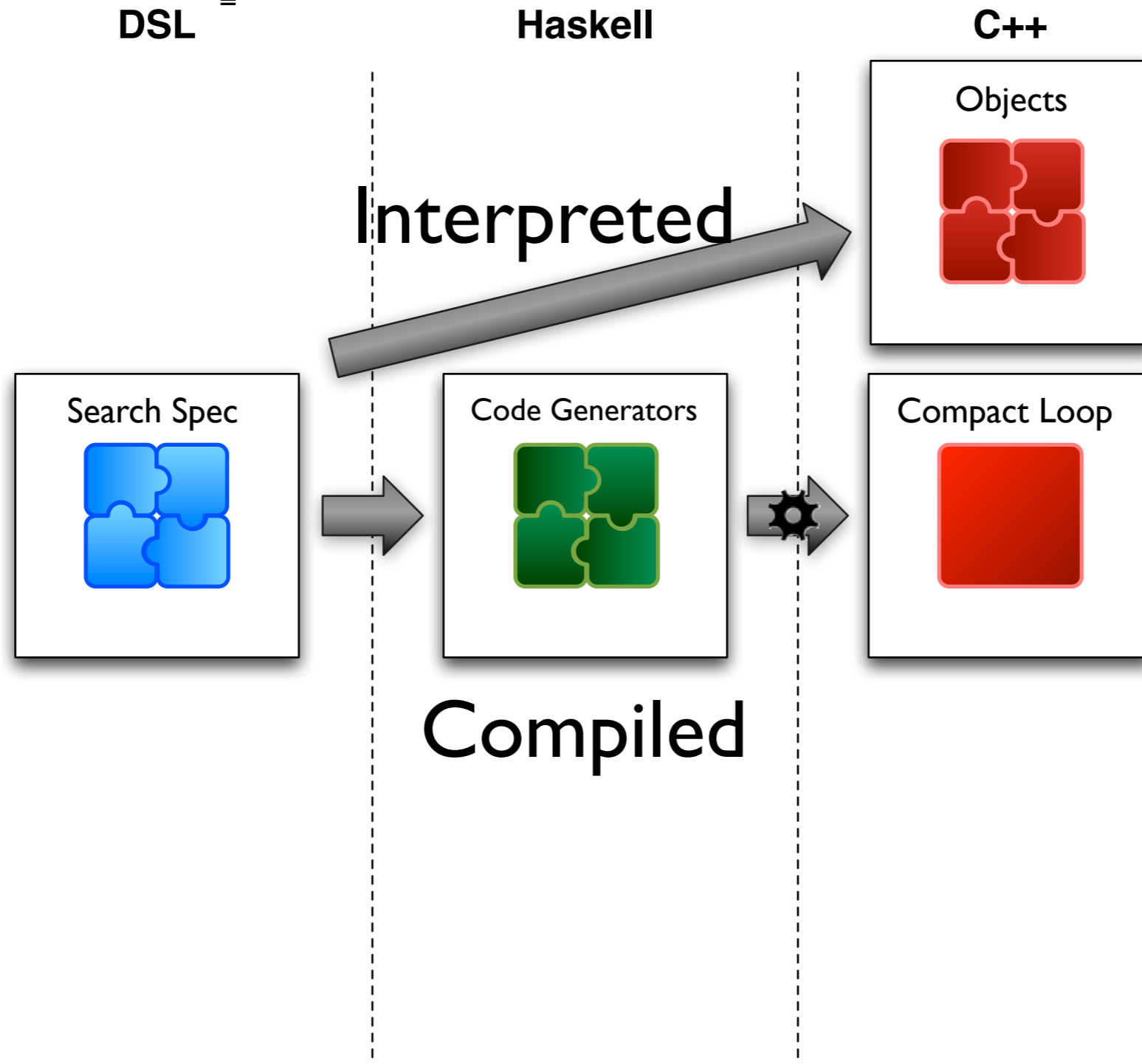
Objects



Compact Loop

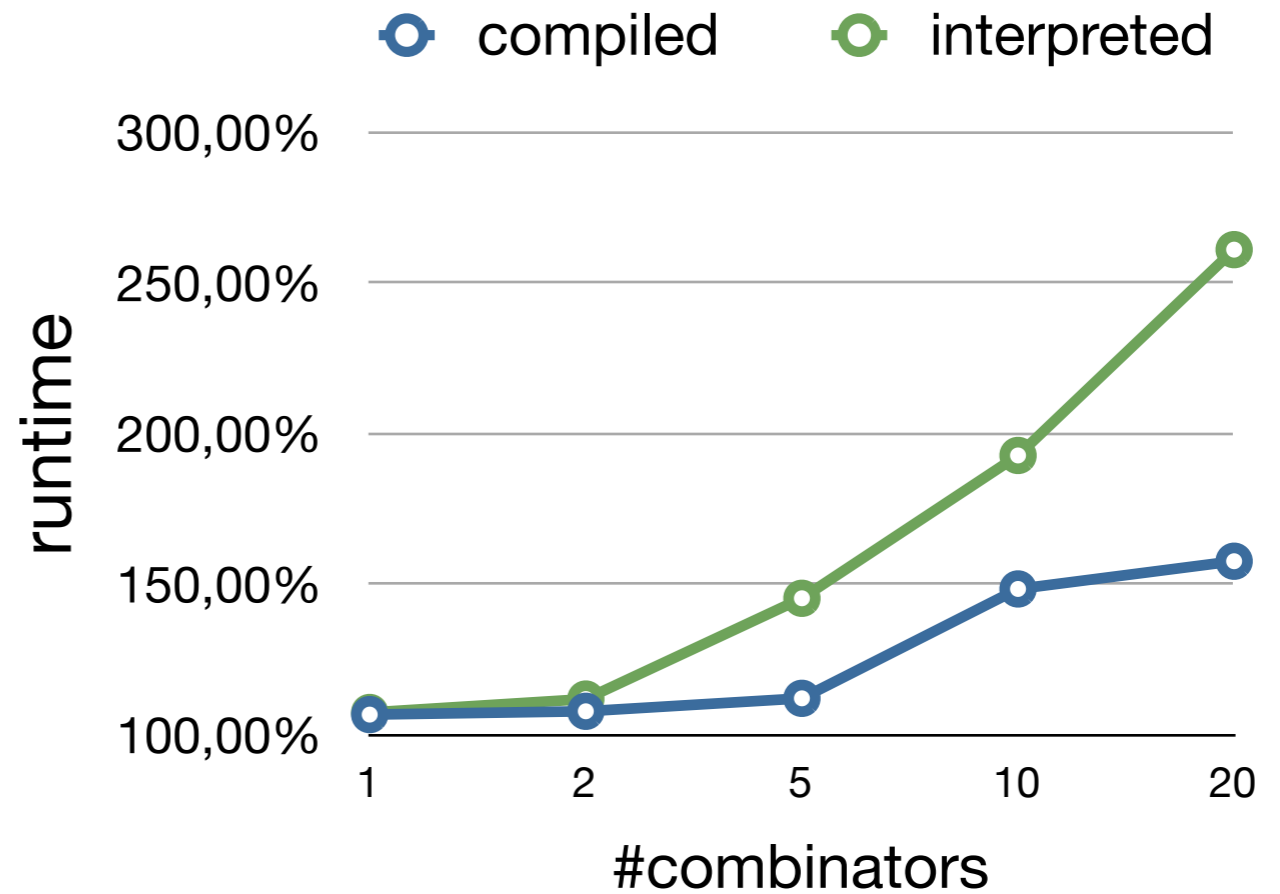
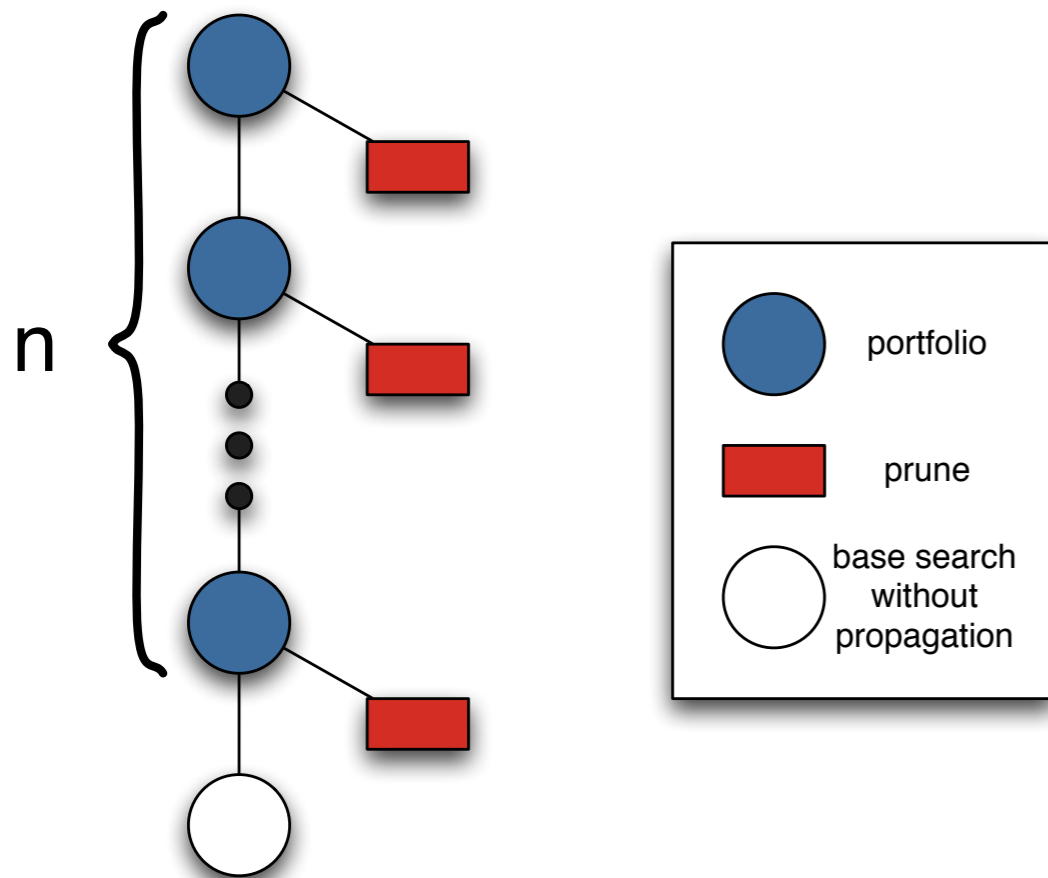


Implementations

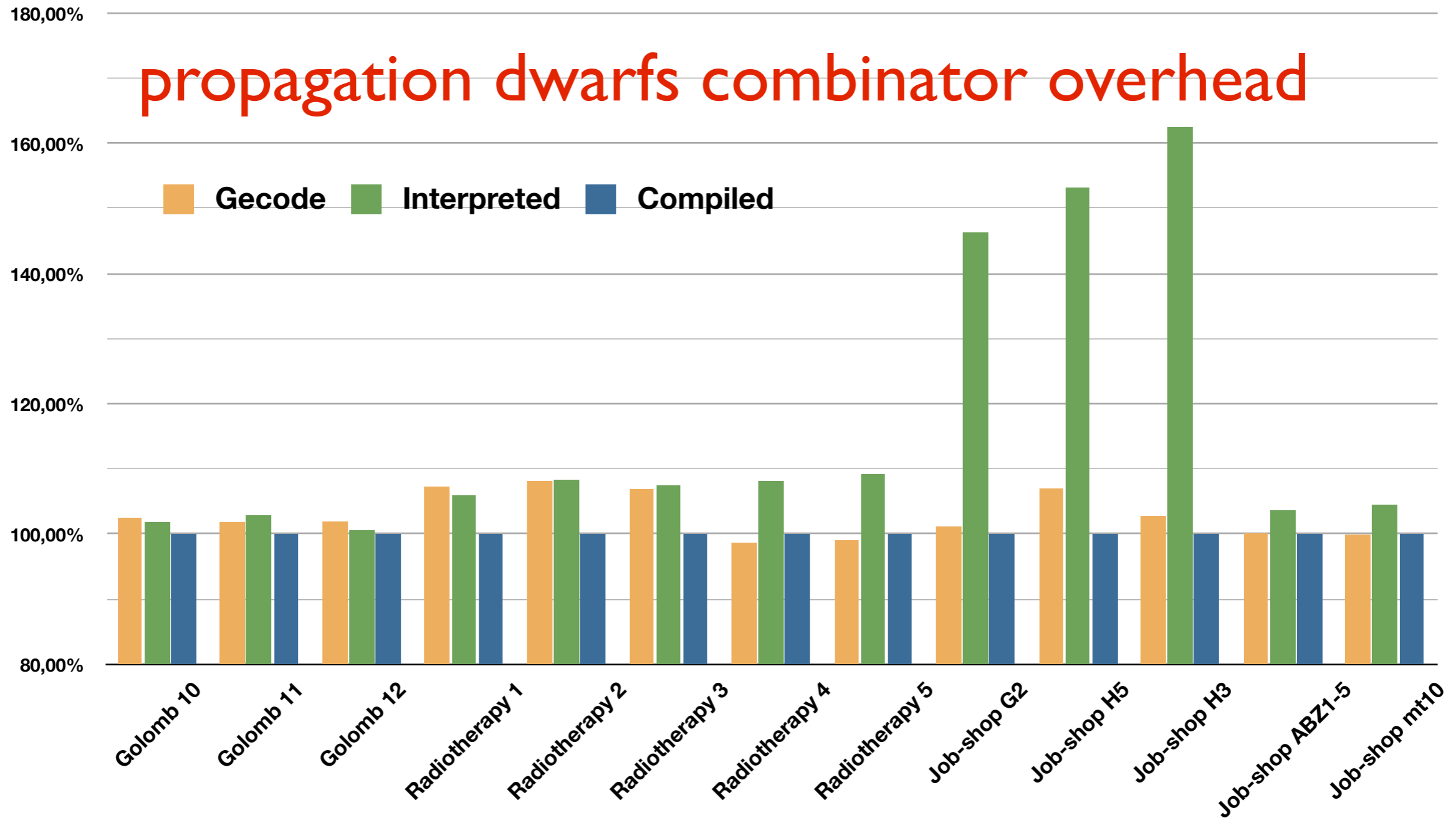


Combinator Overhead?

Worst-case Scenario



In Practice



Summary

- high-level **modular modeling** of search
- low-level **modular implementation**
- **competitive performance** compared to hand-coded algorithm

Future Work

- Optimizations
- MiniZinc integration
- Combinators for parallel search
- Extend other solving technology (e.g., LP)
 - ➔ Combinators for hybrid search

Thank You!



Combinator Overhead

