

GENERATING SIMULATION MODELS FROM COMPONENTS:

Industrial use cases in design space exploration and machine learning

**NEXT GENERATION COMBINATORY LOGIC SYNTHESIS: CLSP**

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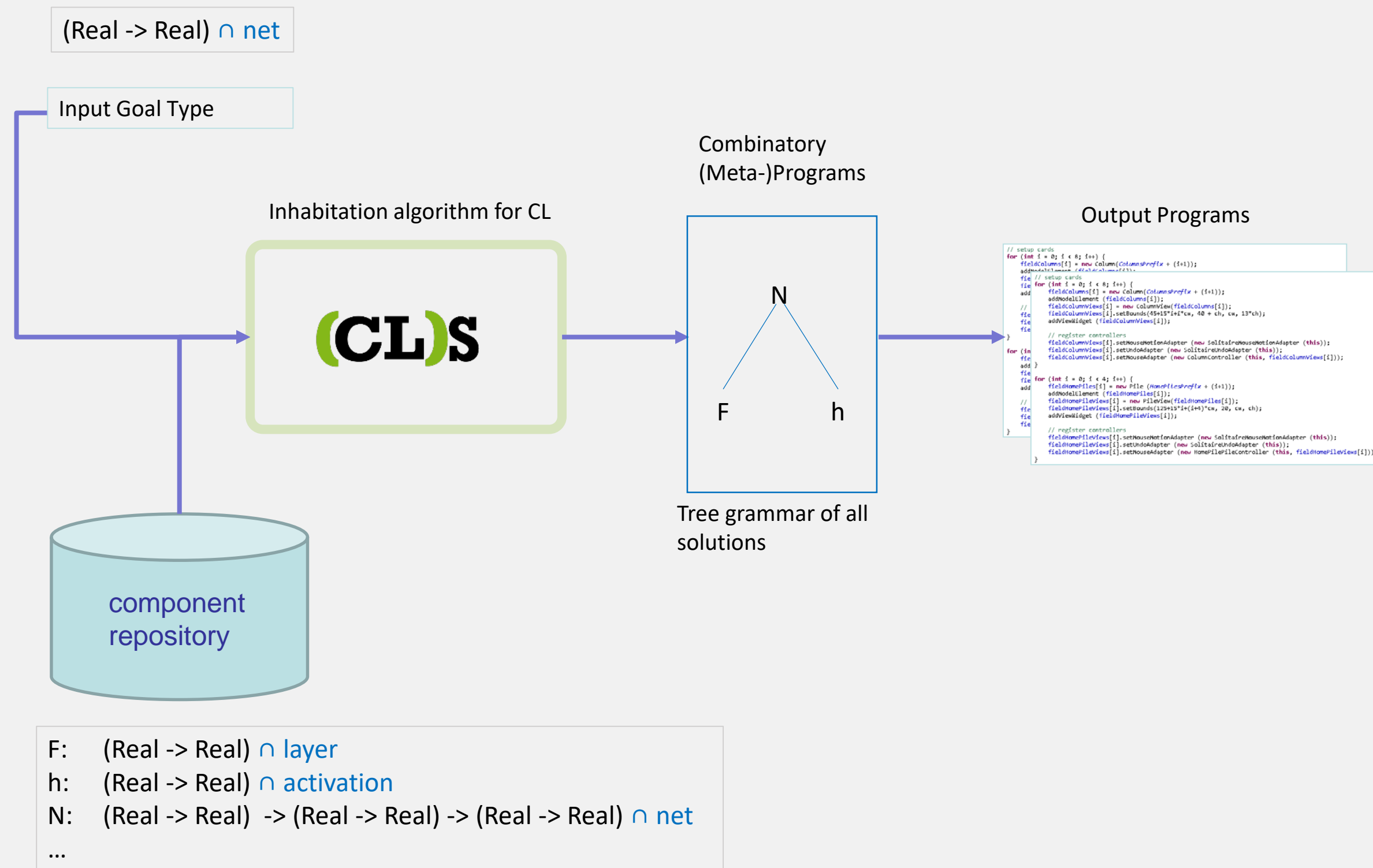


# COMBINATORY LOGIC SYNTHESIZER recap

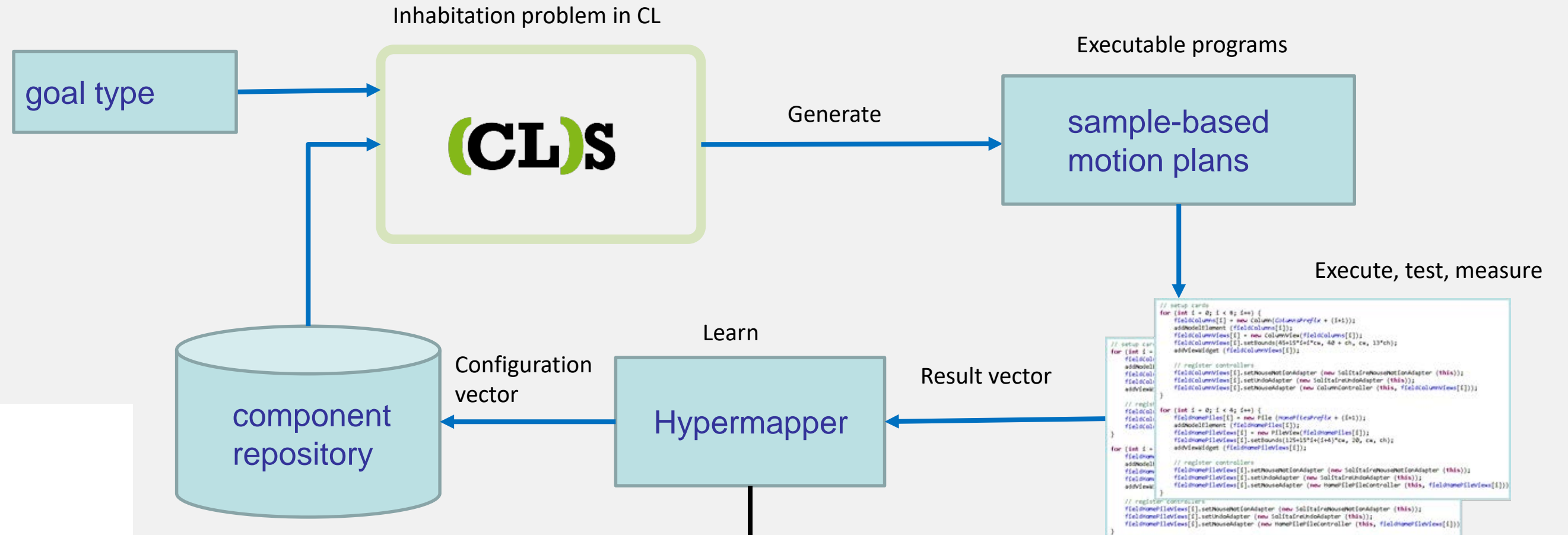
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THE (CL)S FRAMEWORK IS A LANGUAGE-AGNOSTIC AND FORMALLY VERIFIED FRAMEWORK THAT IS ABLE TO GENERATE ALL COMBINATIONS OF MODULAR COMPONENTS THAT SATISFY A PARTICULAR REQUEST/SPECIFICATION.

# Basic synthesis pipeline of CLS-framework



# Design space exploration and learning with CLS-framework



```

// setup cards
for (int i = 0; i < 4; i++) {
  fieldColumn[i] = new Column(ColumnPrefix + (i+1));
  addNodeElement (fieldColumn[i]);
  fieldColumnView[i] = new ColumnView(fieldColumn[i]);
  fieldColumnView[i].setBounds(40+15*i*cw, 40 + cw, 13*ch);
  addViewWidget (fieldColumnView[i]);
}

// register controllers
fieldColumnView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldColumnView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldColumnView[i].setNouseAdapter (new ColumnController (this, fieldColumnView[i]));
}

// register controllers
fieldHomeView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldHomeView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldHomeView[i].setNouseAdapter (new HomeFileController (this, fieldHomeView[i]));
}

// register controllers
fieldHomeView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldHomeView[i].setNouseAdapter (new SolitaireNouseAdapter (this));
fieldHomeView[i].setNouseAdapter (new HomeFileController (this, fieldHomeView[i]));
}
  
```

$\Gamma_s = \{$   
 PlannerAssembly:  
*any\_planner*  $\rightarrow$  *any\_state\_validator*  $\rightarrow$   
*any\_motion\_validator*  $\rightarrow$  *any\_simplification*  $\rightarrow$   
*sbmp\_input*  $\rightarrow$  *sbmp\_program*,  
  
 PRMStarSchema :  
*(any\_opt\_obj*  $\rightarrow$  *sampler\_space*  $\rightarrow$  *PRMStar*)  $\cap$   
*(any\_opt\_obj*  $\rightarrow$  *sampler\_valid\_state*  $\rightarrow$  *PRMStar*)  $\cap$   
*(any\_opt\_obj*  $\rightarrow$  *sampler\_informed*  $\rightarrow$  *PRMStar*),  
  
 ESTSchema :  
*obj\_path*  $\rightarrow$  *sampler\_valid\_state*  $\rightarrow$  *EST*,  
 [...]  
 }

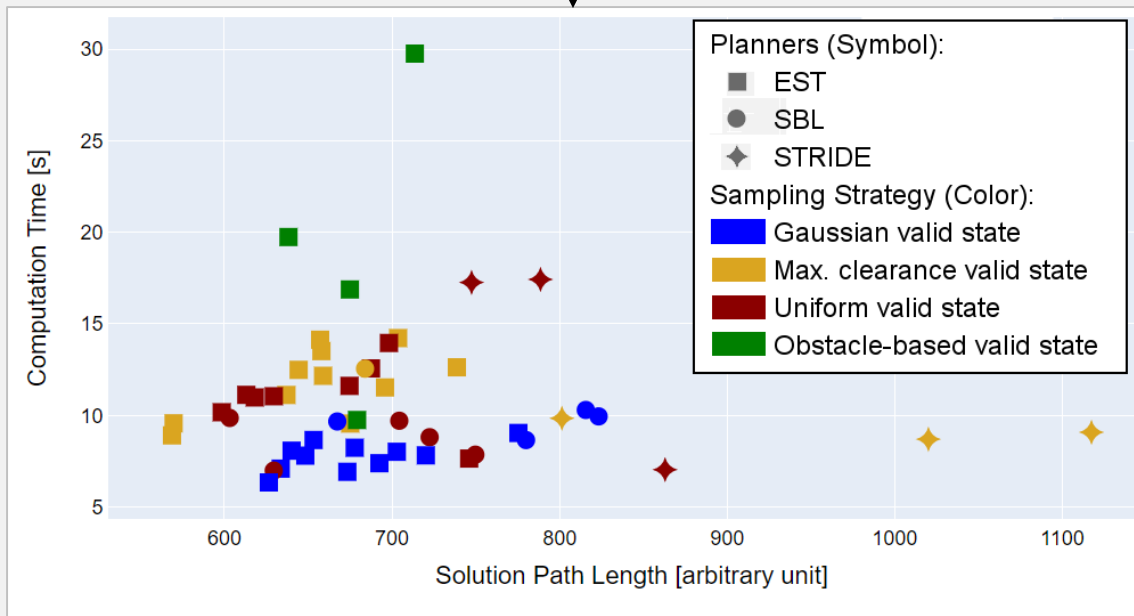
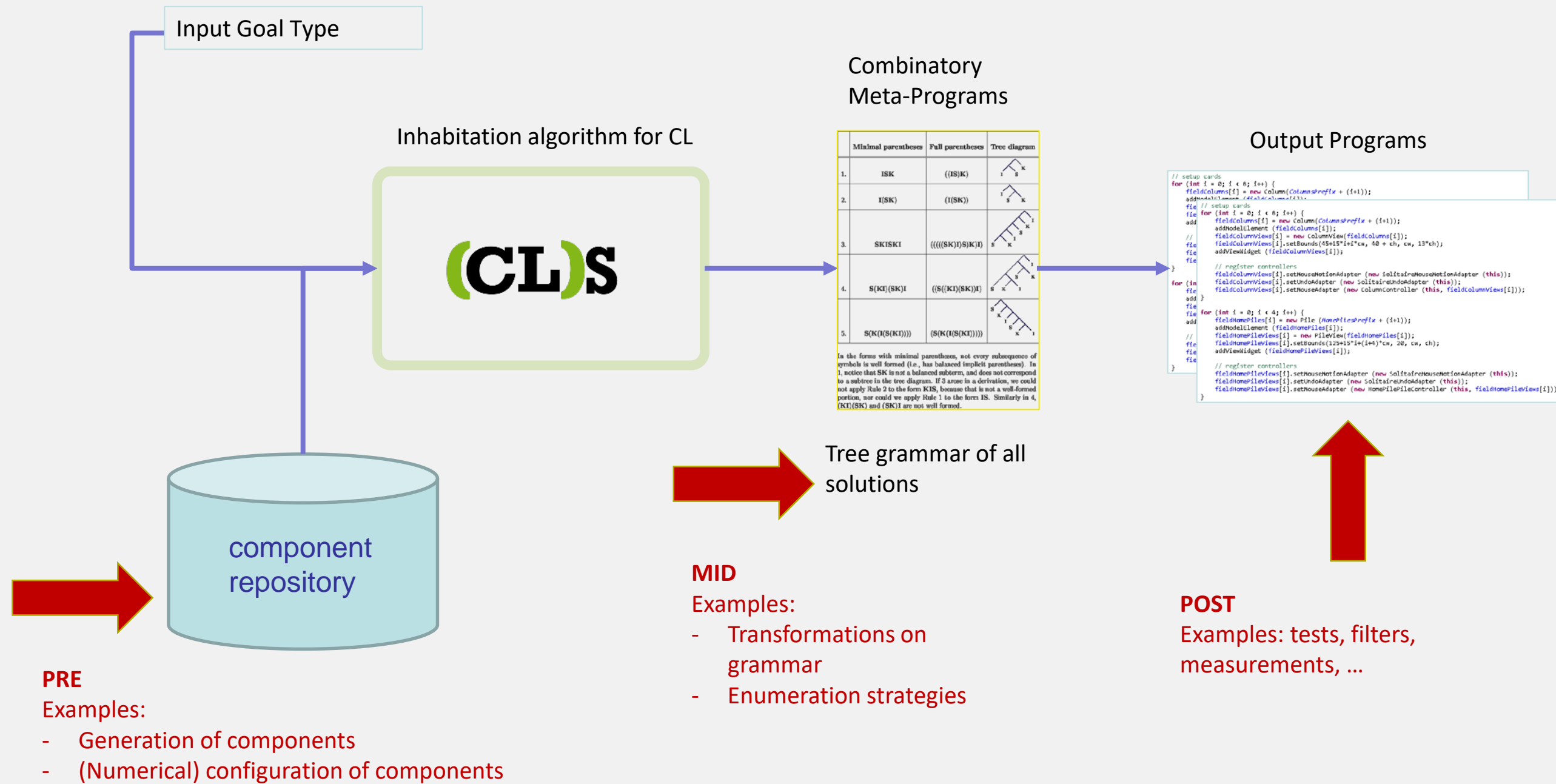
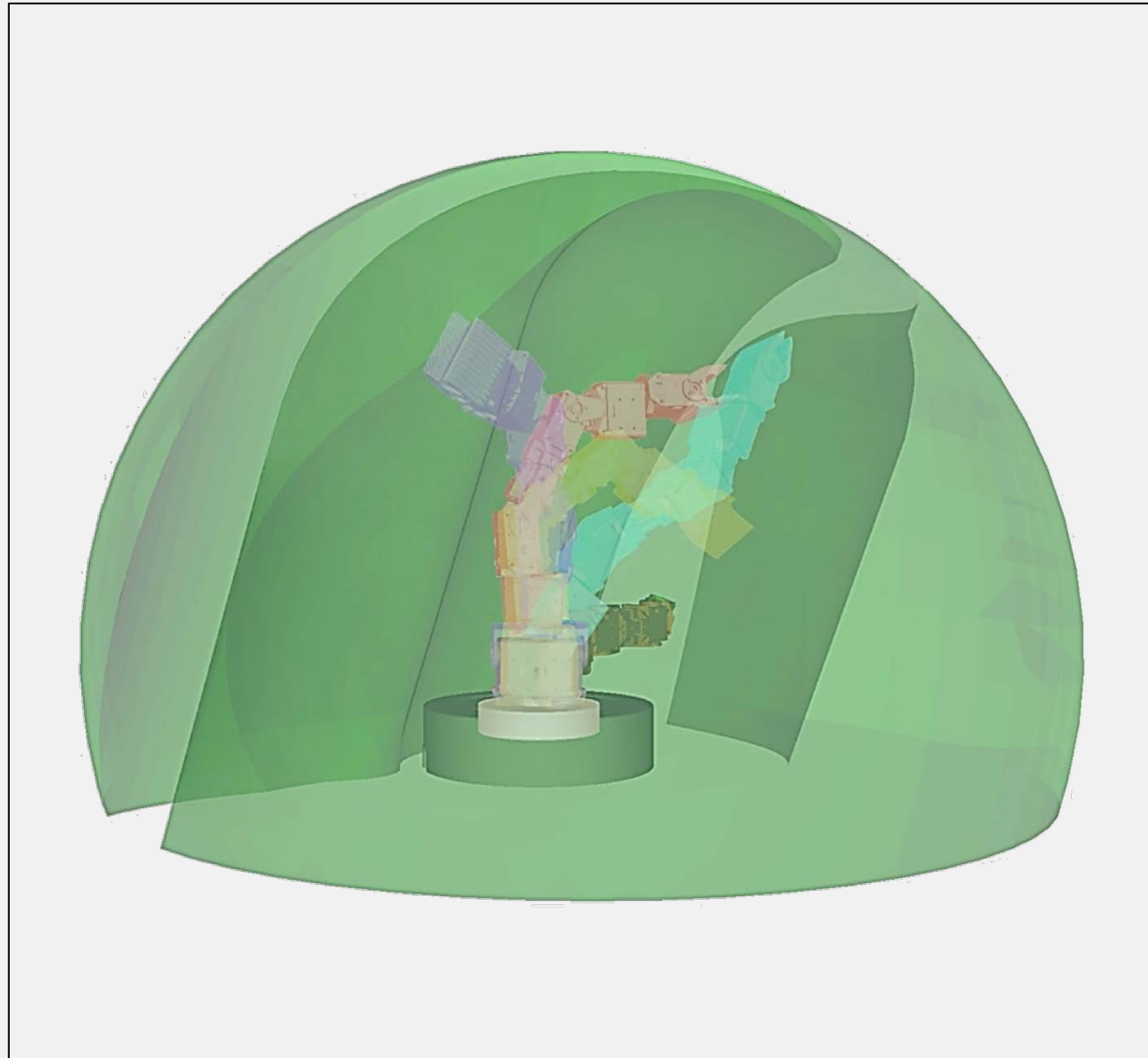


Fig. 3. Excerpt of the semantic repository  $\Gamma_s$ , showing the type signature of the combinators PlannerAssembly, PRMStarSchema, and ESTSchema

# Extensions to CLS-framework

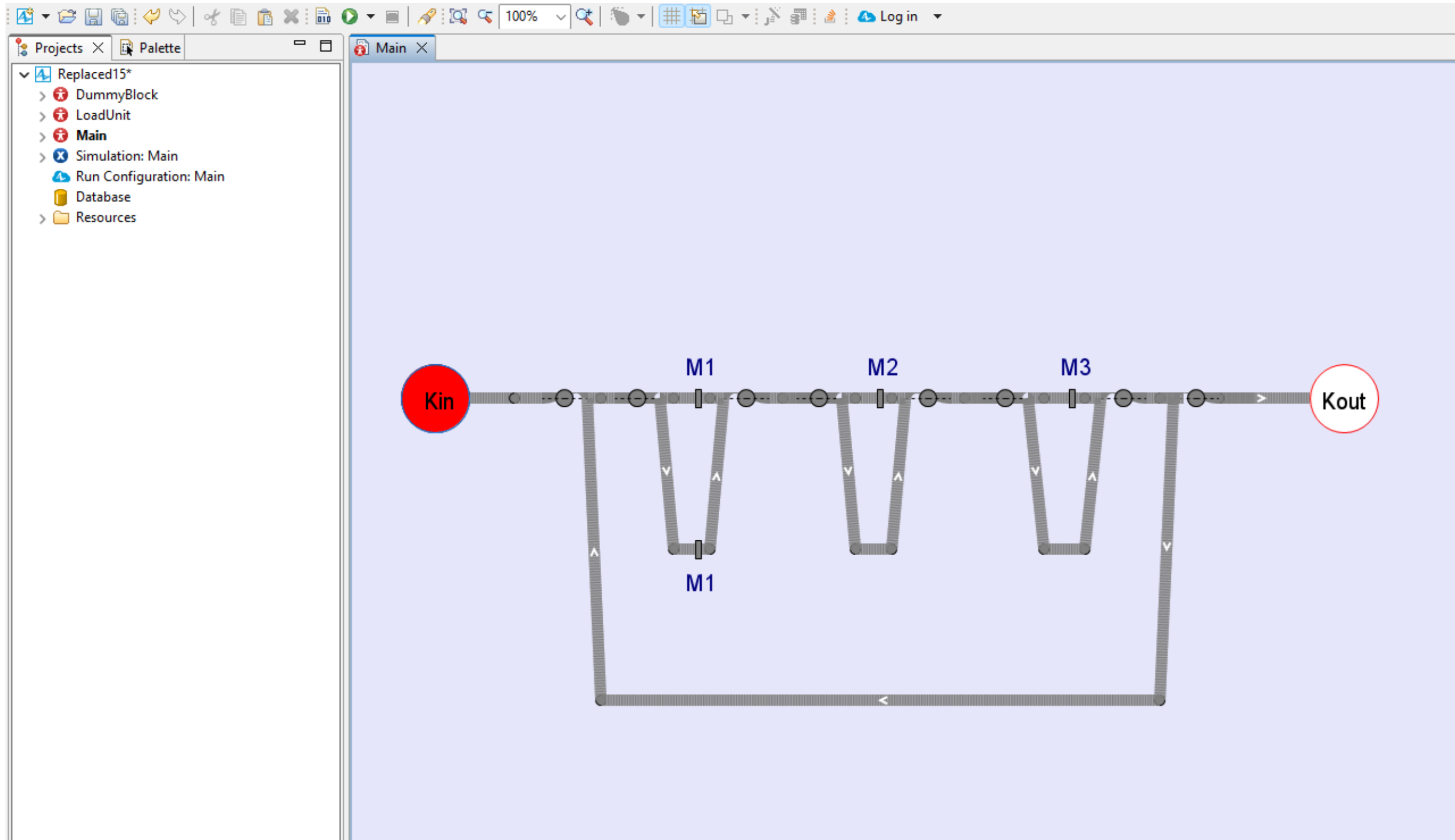




# MOTION PLANNING

TACKLING A FUNDAMENTAL PROBLEM OF ROBOTICS WITH (CL)S: FINDING A COMPROMISE BETWEEN PERFORMANCE METRICS.

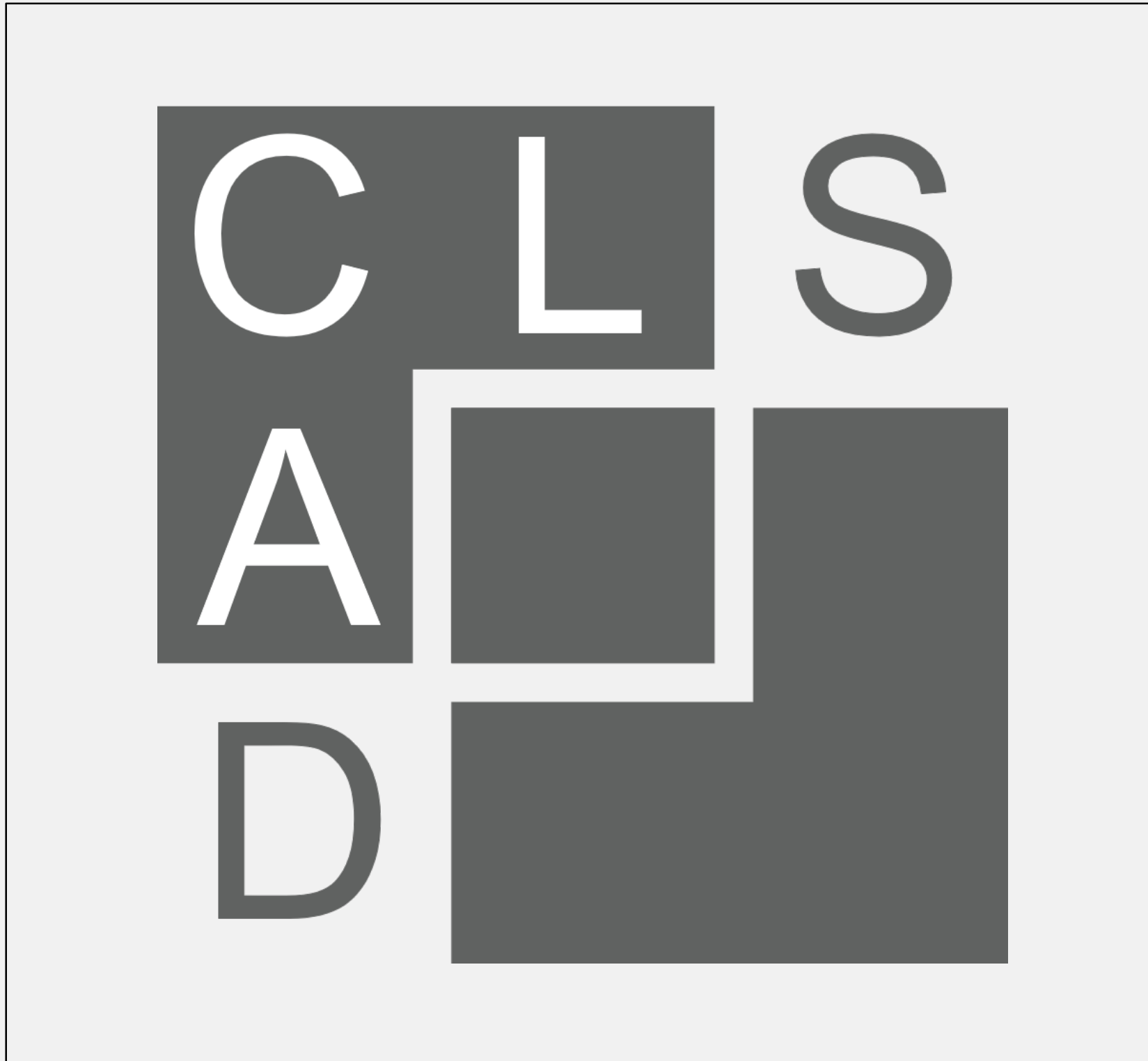
# Executable Simulation Models



- All generated solutions can be compiled into an executable simulation model in **AnyLogic**
- See solution #15 from previous step

```
#####--15--#####
```

```
|(1)| -> |(2)| -> |(3)|  
|(1)|   |-->|   |-->|  
|<-----|
```



# SYNTHESIS OF CAD ASSEMBLIES

RELIEVING CAD SOFTWARE ENGINEERS FROM REPEATING THE SAME BASIC  
TASKS OVER AND OVER;  
AUTO-GENERATING ASSEMBLIES AND IMPROVING CREATIVITY.

Constantin Chaumet, Jakob Rehof, Thomas Schuster: *A knowledge-driven framework for synthesizing designs from modular components.*

34<sup>th</sup> CIRP Design Conference, 2024



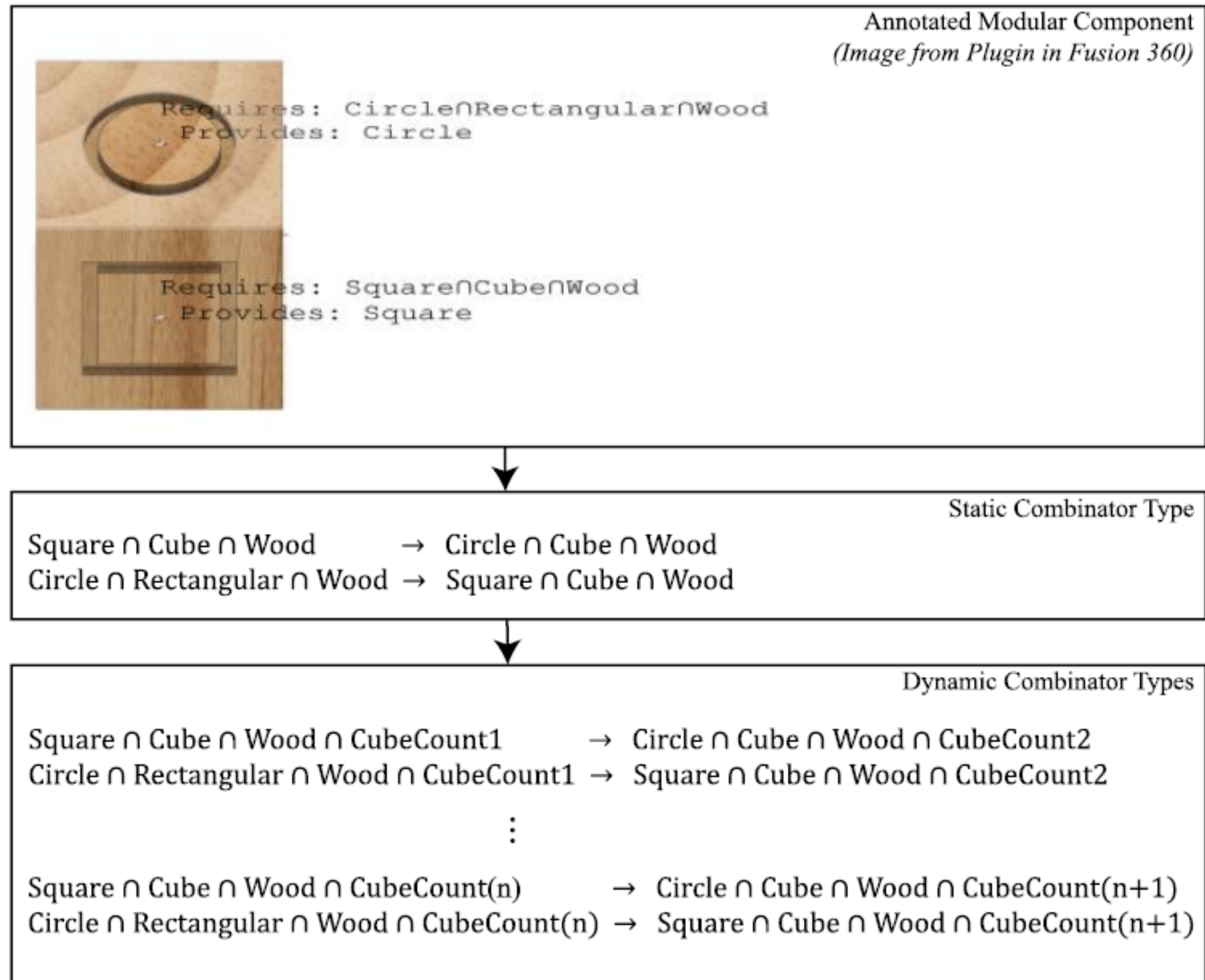
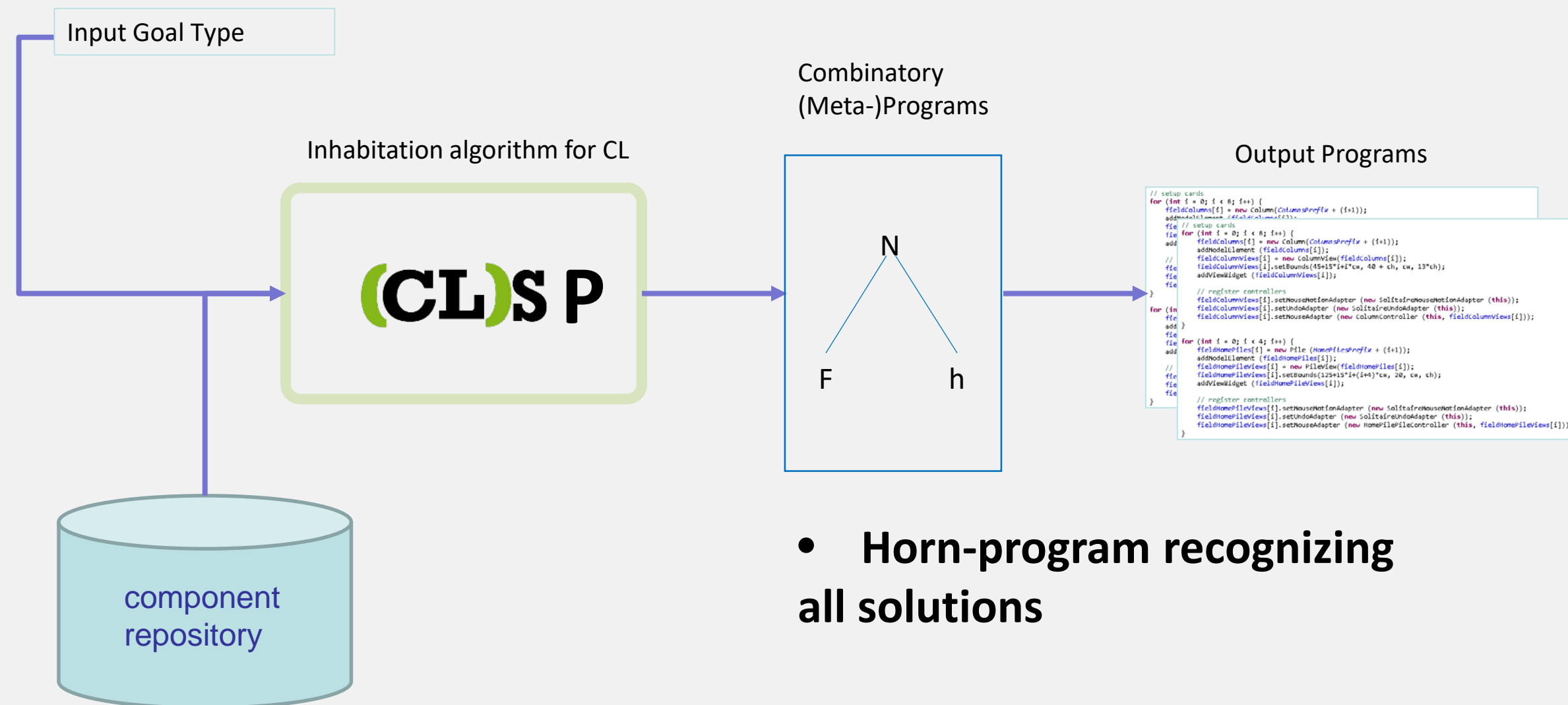


Fig. 3. Dynamic type generation for repository.

# Next generation CLS: CLS with predicates (CLSP)



- **Dependent type specifications with computable predicates**

- **Horn-program recognizing all solutions**

Size	$\Gamma_{\text{FCL}}^{\mathcal{M}}$	$\Gamma_{\text{FCLP}(\text{lit})}^{\mathcal{M}}$	$\Gamma_{\text{FCLP}(\text{pos})}^{\mathcal{M}}$	$\Gamma_{\text{FCLP}(\text{pred})}^{\mathcal{M}}$	$\Gamma_{\text{FCLP}}^{\mathcal{M}}$
$10 \times 10$	1.3 s	0.5 s	0.3 s	0.1 s	0.1 s
$20 \times 20$	21.9 s	8.0 s	6.4 s	2.4 s	1.9 s
$30 \times 30$	125.2 s	41.0 s	30.7 s	12.8 s	9.8 s
$40 \times 40$	464.7 s	130.2 s	97.9 s	42.3 s	32.4 s
$50 \times 50$	1279.8 s	322.2 s	239.5 s	103.2 s	78.5 s
$60 \times 60$	3038.5 s	645.4 s	486.3 s	214.2 s	160.2 s
$70 \times 70$	—	1195.6 s	893.5 s	384.9 s	299.4 s

■ **Figure 3** Benchmarks for different maze sizes and different type environments

Finite Combinatory Logic with Predicates (see slides part 2)

# Ongoing and future work with CLSP

- Further integration with
  - constraint solving
  - optimizers
  - ML
- Simulation-based machine learning
- Controlled experiments and statistics
- Categorical framework for synthesizing learners
- Further industrial applications

# Finite Combinatory Logic with Predicates

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SummerSoc 2024  
Crete

# Intersection Types with Covariant Constructors and Literals

## Definition

$$\sigma, \tau ::= \omega \mid \sigma \rightarrow \tau \mid \sigma \cap \tau \mid c(\sigma) \mid !$$

$\sigma, \tau$  : intersection type  
 $c$  : unary type constructor  
 $!$  : literal

## Example

$(x(3) \cap y(1)) \rightarrow (x(4) \cap y(1))$	move right on a grid
$\text{pos}((3, 1)) \rightarrow \text{pos}((4, 1))$	any (python) object as literal
$(\text{True} \rightarrow \text{False}) \cap (\text{False} \rightarrow \text{True})$	finite function type

# Parameterized Types

## Definition

$$\varphi, \psi ::= \sigma \mid \langle \alpha : t \rangle \Rightarrow \varphi \mid \langle \langle x : \sigma \rangle \rangle \Rightarrow \varphi \mid P \Rightarrow \varphi$$

$\varphi, \psi$	:	parameterized type
$\sigma$	:	intersection type
$\alpha$	:	literal variable
$t$	:	collection identifier
$x$	:	term variable
$P$	:	decidable predicate

## Example (move right on a grid)

$$\langle \alpha : \mathbb{N}^2 \rangle \Rightarrow \langle \beta : \mathbb{N}^2 \rangle \Rightarrow \left( \beta = (\pi_1(\alpha) + 1, \pi_2(\alpha)) \right) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta)$$

## Example (count motors)

$$\langle \alpha : \mathbb{N} \rangle \Rightarrow \langle \langle x : \text{Part} \rangle \rangle \Rightarrow \left( \alpha = \text{numMotors}(x) \right) \Rightarrow \text{Assembly}(\alpha)$$



# Combinatory Terms and Arguments

## Definition

$$\begin{aligned} M, N & ::= A \mid M T \\ T & ::= M \mid I \end{aligned}$$

$M, N$  : combinatory term  
 $A$  : combinator  
 $T$  : combinatory argument  
 $I$  : literal

## Example (move right, then down on a grid)

Down  $(1, 0)$   $(1, 1)$  (Right  $(0, 0)$   $(1, 0)$  Start)

# Environments

## Definition (Type Environment)

$$\Gamma ::= \{A_1 : \varphi_1, \dots, A_n : \varphi_n\}$$

$\Gamma$  : type environment

$A_i$  : combinator

$\varphi_i$  : parameterized type

## Definition (Literal Environment)

$$\Delta ::= \{l_1 : t_1, \dots, l_n : t_n\}$$

$\Delta$  : literal environment

$l_i$  : literal

$t_i$  : collection identifier

## Example (Maze)

$$\Gamma = \{\text{Right} : \{\alpha : \mathbb{N}^2\} \Rightarrow \{\beta : \mathbb{N}^2\} \Rightarrow \text{isRight}(\beta, \alpha) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta), \\ \text{Left} : \dots, \text{Down} : \dots, \text{Up} : \dots, \text{Start} : \text{pos}((0, 0))\}$$

$$\Delta = \{(x, y) : \mathbb{N}^2 \mid \text{isFree}((x, y)) \text{ where } x, y \in \{0, \dots, 10\}\}$$

# Finite Combinatory Logic with Predicates (FCLP)

## Definition

FCL

$$\frac{(A : \varphi) \in \Gamma}{\Gamma; \Delta \vdash A : \varphi} \text{ (Var)}$$

$$\frac{\Gamma; \Delta \vdash M : \sigma \quad \sigma \leq \tau}{\Gamma; \Delta \vdash M : \tau} (\leq)$$

$$\frac{\Gamma; \Delta \vdash M : \sigma \rightarrow \tau \quad \Gamma; \Delta \vdash N : \sigma}{\Gamma; \Delta \vdash MN : \tau} (\rightarrow E)$$

extra

$$\frac{\Gamma; \Delta \vdash M : P \Rightarrow \varphi \quad P \text{ holds}}{\Gamma; \Delta \vdash M : \varphi} (PE)$$

$$\frac{\Gamma; \Delta \vdash M : \langle \alpha : t \rangle \Rightarrow \varphi \quad (l : t) \in \Delta}{\Gamma; \Delta \vdash MI : \varphi[\alpha := l]} (\langle \rangle E)$$

$$\frac{\Gamma; \Delta \vdash M : \langle \langle x : \sigma \rangle \rangle \Rightarrow \varphi \quad \Gamma; \Delta \vdash N : \sigma}{\Gamma; \Delta \vdash MN : \varphi[x := N]} (\langle \langle \rangle \rangle E)$$

## Example

$\Delta$	
	$\nabla$

$\Gamma = \{\text{Right} : \{\alpha : \mathbb{N}^2\} \Rightarrow \{\beta : \mathbb{N}^2\} \Rightarrow \text{isRight}(\beta, \alpha) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta),$   
 $\text{Left} : \dots, \text{Down} : \dots, \text{Up} : \dots, \text{Start} : \text{pos}((0, 0))\}$

$\Delta = \{(0, 0) : \mathbb{N}^2, (1, 0) : \mathbb{N}^2, (1, 1) : \mathbb{N}^2\}$   
 $\text{isRight}((1, 0), (0, 0)) = \text{True}, \dots$

$\Gamma, \Delta \vdash ? : \text{pos}((1, 1))$

$\Downarrow$

- Down (1, 0) (1, 1) (Right (0, 0) (1, 0) Start)
- Down ... (Right ... (Left ... (Right ... Start)))
- ...

# Properties

## Lemma

The following rule is derivable  $\frac{\Gamma; \Delta \vdash M : \sigma \quad \Gamma; \Delta \vdash M : \tau}{\Gamma; \Delta \vdash M : \sigma \cap \tau}$  (nl)

## Lemma

The following is equivalent

- $\{A_1 : \sigma_1, \dots, A_n : \sigma_n\}; \emptyset \vdash M : \tau$
- $\{A_1 : \sigma_1, \dots, A_n : \sigma_n\} \vdash M : \tau$  in FCL( $n, \leq$ )

## Lemma

Intersection type checking “ $\Gamma; \Delta \vdash M : \sigma?$ ” is decidable.

## Lemma

Intersection type inhabitation “ $\Gamma; \Delta \vdash ? : \sigma$ ” is semi-decidable.

# Decidable Fragment

# Arity

## Definition

$$\text{ar}(\langle \alpha : t \rangle \Rightarrow \varphi) = \text{ar}(\langle x : \sigma \rangle \Rightarrow \varphi) = 1 + \text{ar}(\varphi)$$

$$\text{ar}(P \Rightarrow \varphi) = \text{ar}(\varphi)$$

$$\text{ar}(\omega) = \text{ar}(c(\sigma)) = \text{ar}(l) = \text{ar}(\alpha) = 0$$

$$\text{ar}(\sigma \rightarrow \tau) = 1 + \text{ar}(\tau)$$

$$\text{ar}(\sigma \cap \tau) = \max\{\text{ar}(\sigma), \text{ar}(\tau)\}$$

where  $\tau \neq \omega$

## Lemma (Maximal Arity)

If  $(A : \varphi) \in \Gamma$ ,  $n > \text{ar}(\varphi)$ , and  $\Gamma; \Delta \vdash A T_1 \dots T_n : \tau$ , then  $\tau = \omega$ .

↪ maximal arity of typed combinator  $(A : \varphi)$  is  $\text{ar}(\varphi)$

## Example (move right on a grid)

$$\text{ar}(\langle \alpha : \mathbb{N}^2 \rangle \Rightarrow \langle \beta : \mathbb{N}^2 \rangle \Rightarrow (\beta = (\pi_1(\alpha) + 1, \pi_2(\alpha))) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta)) = 3$$

# Literal and Term Constraints

## Definition (Term Constraint)

A *term constraint* is either  $x = M$  or  $x \neq M$ .

## Example (Term Constraint)

$$x \neq S(Sy)$$

## Definition (Literal Constraint)

A *literal constraint* is a predicate  $P$  referencing only literal variables.

## Example (Literal Constraint)

$$\beta = (\pi_1(\alpha) + 1, \pi_2(\alpha))$$



# Inhabitation with Literal and Term Constraints

## Problem (Inhabitation with Literal and Term Constraints)

Given

- *type environment  $\Gamma$  using literal and term constraints only*
- *literal environment  $\Delta$*
- *intersection type  $\tau$*

*is there a combinatory term  $M$  such that*

- *$M$  respects arities in  $\Gamma$*
- *$\Gamma; \Delta \vdash M : \tau$  holds?*

## Theorem

*Intersection type inhabitation with literal and term constraints is decidable.*

## Proof.

Reduce inhabitation to decidable emptiness of bottom-up tree automata with term constraints [Reuß and Seidl 2010]. □

- Maze uses literal (and term) constraints only

# FCL vs. FCLP Workflows

*FCLP isn't just an update for CLS, it's faster, sleeker, snazzier – a whole new level!*  
(ChatGPT on FCLP)

# FCL Workflow

- 1 Compute “dynamic” environment  $\Gamma$
- 2 Compute goal type  $\tau$
- 3 Ask  $\Gamma \vdash ? : \tau$
- ↪ Tree grammar  $\mathcal{G}$
- 4 Enumerate terms of  $\mathcal{G}$ :  $M_1, M_2, \dots$
- 5 Filter enumerated terms
- 6 Interpret filtered terms:  $\llbracket M_{i_1} \rrbracket, \llbracket M_{i_2} \rrbracket, \dots$

# FCLP Workflow

- 1 Fix *parametric* environment  $\Gamma$
- 2 Compute literal environment  $\Delta$
- 3 Compute goal type  $\tau$
- 4 Ask  $\Gamma; \Delta \vdash ? : \tau$
- ↪ Logic program  $\mathcal{H}$  (list of Horn clauses)
- 5 Enumerate terms in the model of  $\mathcal{H}$ :  $M_1, M_2, \dots$
- 6 Interpret terms:  $\llbracket M_1 \rrbracket, \llbracket M_2 \rrbracket, \dots$

## Benefits

- Parametric environment is fixed (5 combinators for Maze)
- Literal predicates hold in  $\mathcal{H}$  (no generate-and-test)
- Non-literal predicates are evaluated in the model construction of  $\mathcal{H}$

# Horn Clauses

## Example (count motors)

$$\mathbf{A} : \{\alpha : \mathbb{N}\} \Rightarrow \langle\langle \mathbf{x} : \text{Part} \rangle\rangle \Rightarrow (\alpha = \text{numMotors}(\mathbf{x})) \Rightarrow \text{Assembly}(\alpha)$$

$\Downarrow$

$$Q_{\text{Assembly}(0)}(\mathbf{A}0 \mathbf{x}) \leftarrow Q_{\text{Part}}(\mathbf{x}), (0 = \text{numMotors}(\mathbf{x}))$$

$$Q_{\text{Assembly}(1)}(\mathbf{A}1 \mathbf{x}) \leftarrow Q_{\text{Part}}(\mathbf{x}), (1 = \text{numMotors}(\mathbf{x}))$$

$$Q_{\text{Assembly}(2)}(\mathbf{A}2 \mathbf{x}) \leftarrow Q_{\text{Part}}(\mathbf{x}), (2 = \text{numMotors}(\mathbf{x}))$$

...

# Specification Comparison

*FCL stands trembling as FCLP rockets in, a supersonic revolution  
rewriting the rules!* (Google Bard on FCLP)

# Parameterized vs. Dynamic Specification

## Example (Parameterized Specification)

$\text{Right} : \{\alpha : \mathbb{N}^2\} \Rightarrow \{\beta : \mathbb{N}^2\} \Rightarrow \text{isRight}(\beta, \alpha) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta)$

- fixed
- small specification  $\rightsquigarrow$  fast subtyping  $\rightsquigarrow$  fast synthesis
- inhabitants contain parameters:  $\text{Right}(\mathbf{0}, \mathbf{0}) (\mathbf{1}, \mathbf{0}) (\dots)$

## Example (Dynamic Specification)

$\text{Right}_{\text{FCL}} : \prod_{x=0}^{n-1} \prod_{y=0}^n (\text{pos}((x, y)) \rightarrow \text{pos}((x + 1, y)))$

- depends on  $n$
- formed by computation
- large specification  $\rightsquigarrow$  slow subtyping  $\rightsquigarrow$  slow synthesis
- instance-oblivious inhabitants:  $\text{Right}_{\text{FCL}}(\text{Down}_{\text{FCL}}(\dots))$

# Parameters vs. Combinators vs. Substitutions

## Example (Parameter Propagation)

$$A : \{\alpha : \mathbb{N}^2\} \Rightarrow a(\alpha)$$

$$B : \{\alpha : \mathbb{N}^2\} \Rightarrow b(\alpha)$$

$$F : \{\alpha : \mathbb{N}^2\} \Rightarrow (\pi_1(\alpha) + \pi_2(\alpha) = 2) \Rightarrow a(\alpha) \rightarrow b(\alpha) \rightarrow f$$

$$\Gamma; \Delta \vdash ? : f$$

⇓

$$F(0, 2) (A(0, 2)) (B(0, 2))$$

$$F(1, 1) (A(1, 1)) (B(1, 1))$$

$$F(2, 0) (A(2, 0)) (B(2, 0))$$

- $\Delta$  can become large
- terms contain parameter information
- configuration can change subterms
- configuration can be changed in subterms
- configuration predicates part of specification



# Parameters vs. Combinators vs. Substitutions

## Example (Configuration Combinator)

$A : \text{config} \rightarrow a$

$B : \text{config} \rightarrow b$

$C : \text{config}$

$F : \text{config} \rightarrow a \rightarrow b \rightarrow f$

$\Gamma; \emptyset \vdash ? : f$

$\Downarrow$

$FC(AC)(BC)$

- interpretation of  $C$  instantiates configuration
- configuration can not change subterms
- configuration can not be changed in subterms
- configuration predicates not part of specification

# Parameters vs. Combinators vs. Substitutions

## Example (Application in Context)

$A : a$

$B : b$

$F : a \rightarrow b \rightarrow f$

$\Gamma; \emptyset \vdash ? : f$

$\Downarrow$

$F A B$

$\llbracket A \rrbracket = \lambda \text{config}. \text{do} A \text{ config}$

$\llbracket B \rrbracket = \lambda \text{config}. \text{do} B \text{ config}$

$\llbracket F \rrbracket = \lambda \text{config}. a \ b. \text{do} F \text{ config} (a \text{ config}) (b \text{ config})$

$\llbracket F A B \rrbracket =_{\beta} \lambda \text{config}. \text{do} F \text{ config} (\text{do} A \text{ config}) (\text{do} B \text{ config})$

- interpretation as function from `config`
- configuration not part of specification
- configuration does not appear in terms
- combinator interpretation is “eierlegende Wollmilchsau”

# Restriction Comparison

*FCLP empowers the CLS framework to operate at unprecedented levels of efficiency, scalability, and precision.* (Llama on FCLP)

# Generate-and-Test vs. Invariant

## Example (Filter Looping Maze Solutions)

Right :  $\{\alpha : \mathbb{N}^2\} \Rightarrow \{\beta : \mathbb{N}^2\} \Rightarrow \text{isRight}(\beta, \alpha) \Rightarrow \text{pos}(\alpha) \rightarrow \text{pos}(\beta)$ ,

Left : ..., Down : ..., Up : ...,

Start :  $\text{pos}((0,0))$

$\Gamma; \{(0,0), \dots, (10,10)\} \vdash ? : \text{pos}((10,10))$

$\Downarrow$   
candidates

$\Downarrow$   
filter looping solutions

$\Downarrow$   
filtered results

- many unwanted candidates
- arbitrary time between results
- non-termination: infinitely many candidates / finitely many results

# Generate-and-Test vs. Invariant

## Example (Avoid Looping Maze Solutions)

Right :  $\langle \alpha : \mathbb{N}^2 \rangle \Rightarrow \langle \beta : \mathbb{N}^2 \rangle \Rightarrow \langle \langle x : \text{pos}(\alpha) \rangle \rangle \Rightarrow$   
 $(\text{isRight}(\beta, \alpha) \wedge \text{notIn}(\beta, x)) \Rightarrow \text{pos}(\beta),$

Left : ..., Down : ..., Up : ...,

Start :  $\text{pos}((0,0))$

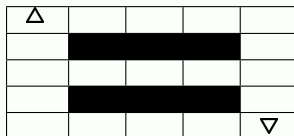
$\Gamma; \{ (0,0), \dots, (10,10) \} \vdash ? : \text{pos}((10,10))$

$\Downarrow$   
loop-free results

- no unwanted candidates
- improved performance
- termination for finite result set

# Generate-and-Test vs. Invariant

## Example (Loop-free Maze Solutions)



	FCL	FCLP
time	20s	0.5s
behavior	non-termination	termination

*Imagine a maze. FCL bumbles around like a lost puppy, while FCLP zooms through like a laser beam.* (Claude on FCLP)

# Bibliography I



Reuß, Andreas and Helmut Seidl (2010). “Bottom-Up Tree Automata with Term Constraints.” In: *Logic for Programming, Artificial Intelligence, and Reasoning - 17th International Conference, LPAR-17, Yogyakarta, Indonesia, October 10-15, 2010. Proceedings*. Ed. by Christian G. Fermüller and Andrei Voronkov. Vol. 6397. Lecture Notes in Computer Science. Springer, pp. 581–593. DOI: [10.1007/978-3-642-16242-8\\_41](https://doi.org/10.1007/978-3-642-16242-8_41). URL: [https://doi.org/10.1007/978-3-642-16242-8\\_41](https://doi.org/10.1007/978-3-642-16242-8_41).