## JULIASOFT code analysis reinvented



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## CIL to Java-bytecode Translation for Static Analysis Leveraging

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## **Static Program Analysis**

- Automatic analysis of the behavior of software
- Target some specific properties
- Static: without executing the program
  - Need a model of the semantic of the programming language
- Sound: detect all bugs w.r.t. the property of interest
  - False alarms: the analysis failes to prove correct a correct sw



## **Bytecode languages**

- Machine-independent low-level languages
- Interpreted or Just-In-Time compiled
- Based on local variables, stack of values, heap
- Object-oriented (for the purposes of this work)



## The Julia static analyzer







# Java Bytecode (JB) vs. CIL





## Concrete semantics $\rightarrow_{CIL}$

$$\frac{typeOf(v_1) = typeOf(v_2)}{\langle \text{add}, (s :: v_1 :: v_2, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: (v_1 + v_2), l, a, h)} \text{ (add)} \qquad \frac{\langle \text{Idloc } i, (s, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: l(i), l, a, h)}{\langle \text{Idloc } i, (s, i, a, h) \rangle \rightarrow_{\text{CIL}} (s, l(i), l(i), l(i))} \text{ (Idloc)} \qquad \frac{\langle \text{Idloc } i, (s, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: l(i), l(i), l(i))}{\langle \text{Idloc } i, (s, i, a, h) \rangle \rightarrow_{\text{CIL}} (s :: l(i), l(i), l(i))} \text{ (Idloc)}$$

$$isStatic(m(\arg_{\emptyset}, \dots, \arg_{i})) = false \land t \neq null \land$$

$$\frac{\langle body(m(\arg_{\emptyset}, \dots, \arg_{i}), (t, v_{1}, \dots, v_{i})), ([], \emptyset, [0 \mapsto t, j \mapsto v_{j} : j \in [1..i]], h) \rangle \rightarrow_{CIL} (s', l', a', h')}{\langle call m(\arg_{1}, \dots, \arg_{i}), (s :: t :: v_{1} :: \dots :: v_{i}, l, a, h) \rangle \rightarrow_{CIL} (s, l, a, h')}$$

$$(call)$$

$$isStatic(m(\arg_0, \dots, \arg_i)) = true \land$$

$$\langle body(m(\arg_0, \dots, \arg_i), (v_1, \dots, v_i)), ([], \emptyset, [j-1 \mapsto v_j : j \in [1..i]], h) \rangle \rightarrow_{CIL} (s', l', a', h')$$

$$\langle call m(\arg_1, \dots, \arg_i), (s :: v_1 :: \dots :: v_i, l, a, h) \rangle \rightarrow_{CIL} (s, l, a, h') \quad (call static)$$

$$\frac{\textit{fresh}(\mathsf{T},\mathsf{h}) = (r,\mathsf{h}_1) \land \langle \textit{body}(\texttt{ctor}(\texttt{arg}_1,\cdots,\texttt{arg}_i),(v_1,\cdots,v_i)),([],\emptyset,[0\mapsto r,j\mapsto v_j:j\in[1..i]],\mathsf{h}_1) \rangle \rightarrow_{\mathsf{CIL}}(s',\mathsf{I}',\mathsf{a}',\mathsf{h}')}{\langle \texttt{newobj}\;\mathsf{T}(\mathsf{a}_1,\cdots,\mathsf{a}_i),(s::v_1:\cdots:v_i,\mathsf{I},\mathsf{a},\mathsf{h}) \rangle \rightarrow_{\mathsf{CIL}}(s::r,\mathsf{I},\mathsf{a},\mathsf{h}')} (\texttt{newobj}\;\mathsf{T}(\mathsf{a}_1,\cdots,\mathsf{a}_i),(s::v_1:\cdots:v_i,\mathsf{I},\mathsf{a},\mathsf{h}) \rangle \rightarrow_{\mathsf{CIL}}(s::r,\mathsf{I},\mathsf{a},\mathsf{h}')}$$

$$\frac{o \neq \text{null}}{\langle \text{ldfld } f, (s :: o, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: h(o)(f), l, a, h)} (\text{ldfld}) \qquad \frac{o \neq \text{null} \quad s' = h(o)[f \mapsto v]}{\langle \text{stfld } f, (s :: o :: v, l, a, h) \rangle \rightarrow_{\text{CIL}} (s, l, a, h[o \mapsto s'])} (\text{stfld}) \\ \frac{typeOf(v_1) = typeOf(v_2) \land v_1 > v_2}{\langle \text{bgt } l, (s :: v_1 :: v_2, l, a, h) \rangle \rightarrow_{\text{CIL}} \langle l, (s, l, a, h) \rangle} (\text{bgt true}) \qquad \frac{typeOf(v_1) = typeOf(v_2) \land v_1 \le v_2}{\langle \text{bgt } l, (s :: v_1 :: v_2, l, a, h) \rangle \rightarrow_{\text{CIL}} (s, l, a, h)} (\text{bgt false}) \\ \overline{\langle \text{Idloca } i, (s, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: r_i, l, a, h)} (\text{Idloca}) \qquad \overline{\langle \text{stind}, (s :: r_i :: v, l, a, h) \rangle \rightarrow_{\text{CIL}} (s, l, a, h)} (\text{stind}) \\ \overline{\langle \text{Idloca } i, (s :: v, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: v :: v, l, a, h)} (\text{Idloca}) \qquad \overline{\langle \text{Idind}, (s :: r_i, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: h(r_i), l, a, h)} (\text{Idloca}) \\ \overline{\langle \text{Idloca } i, (s :: v, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: v :: v, l, a, h)} (\text{Idloca}) \qquad \overline{\langle \text{Idind}, (s :: r_i, l, a, h) \rangle \rightarrow_{\text{CIL}} (s :: h(r_i), l, a, h)} (\text{Idloca})$$

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#### Figure 5: Concrete CIL semantics.

## **Concrete semantics** $\rightarrow$ <sub>JB</sub>

 $typeOf(v) \neq Long$  $\frac{1}{\langle \mathsf{dup}, (s :: v, \mathsf{l}, \mathsf{h}) \rangle \to_{\mathsf{IB}} (s :: v :: v, \mathsf{l}, \mathsf{h})} (\mathsf{dup})$  $typeOf(v_1) \neq Long$  $\frac{typeOf(v) = \text{Long}}{\langle \text{dup2}, (s :: v, \text{I}, \text{h}) \rangle \rightarrow_{\text{JB}} (s :: v :: v, \text{I}, \text{h})} (\text{dup2 64})$  $\overline{\langle \mathsf{dup2}, (s::v_1::v_2,\mathsf{l},\mathsf{h})\rangle} \rightarrow_{\mathsf{JB}} (s::v_1::v_2::v_1::v_2,\mathsf{l},\mathsf{h})} (\mathsf{dup2}\;\mathsf{32})$  $\frac{typeOf(v_1) = \text{Long} \land typeOf(v_2) = \text{Long}}{\langle \text{ladd}, (s :: v_1 :: v_2, l, h) \rangle \rightarrow_{\mathsf{IB}} (s :: (v_1 + v_2), l, h)}$ (1add)  $typeOf(v_1) = Int \land typeOf(v_2) = Int$  $\frac{1}{\langle \mathsf{iadd}, (s :: v_1 :: v_2, \mathsf{l}, \mathsf{h}) \rangle \rightarrow_\mathsf{IB} (s :: (v_1 + v_2), \mathsf{l}, \mathsf{h})} (\mathsf{iadd})$  $\frac{x = \Im VMprefix(typeOf(I(i)))}{\langle x \text{load } i, (s, I, h) \rangle \rightarrow_{\mathsf{IB}} (s :: I(i), I, h)} (x \text{load})$  $\frac{x = \mathcal{J}VMprefix(typeOf(v))}{\langle x \text{ store } i, (s :: v, l, h) \rangle \rightarrow_{\mathsf{IB}} (s, \mathsf{I}[i \mapsto v], h)} (x \text{ store})$  $isStatic(m(arg_0, \dots, arg_i)) = false \land t \neq null \land$  $\langle body(\mathsf{m}(\operatorname{arg}_{\theta}, \cdots, \operatorname{arg}_{i}), (t, v_{1}, \cdots, v_{i})), ([], [0 \mapsto t, j \mapsto v_{j} : j \in [1..i]], h) \rangle \rightarrow_{\mathsf{JB}} (\mathsf{s}', \mathsf{I}', \mathsf{h}')$ (invokevirtual) (invokevirtual m(arg<sub>1</sub>,  $\cdots$ , arg<sub>i</sub>),  $(s :: t :: v_1 :: \cdots :: v_i, |, h)) \rightarrow_{1B} (s, |, h')$  $isStatic(m(arg_0, \cdots, arg_i)) = true \wedge$  $\langle body(\mathsf{m}(\mathsf{arg}_{\emptyset}, \cdots, \mathsf{arg}_{i}), (v_{1}, \cdots, v_{i})), ([], [j-1 \mapsto v_{j} : j \in [1..i]], h) \rangle \rightarrow_{\mathsf{JB}} (s', \mathsf{I}', \mathsf{h}')$  (invokestatic) (invokestatic m(arg<sub>1</sub> $, \dots,$ arg<sub>i</sub> $), (s :: v_1 :: \dots :: v_i, l, h)) \rightarrow_{IB} (s, l, h')$  $\frac{\textit{fresh}(T, h) = (r, h')}{\langle \mathsf{new} \ \mathsf{T}, (s, \mathsf{I}, h) \rangle \rightarrow_{\mathsf{IB}} (s :: r, \mathsf{I}, h')} (\mathsf{new})$  $\frac{o \neq \text{null}}{\langle \text{getfield } f, (s :: o, l, h) \rangle \rightarrow_{\text{JB}} (s :: h(o)(f), l, h)} \text{ (getfield)}$  $\frac{o \neq \mathsf{null} \quad s' = \mathsf{h}(o)[\mathsf{f} \mapsto v]}{\langle \mathsf{putfield}\,\mathsf{f},\,(s\,::\,o\,::\,v,\,\mathsf{l},\,\mathsf{h})\rangle \rightarrow_{\mathsf{JB}}(s,\,\mathsf{l},\,\mathsf{h}[o\mapsto s'])} \quad (\mathsf{putfield})$  $\frac{typeOf(v_1) = \text{Int} \land typeOf(v_2) = \text{Int} \land v_1 > v_2}{\langle \text{if\_icmpgt l}, (s :: v_1 :: v_2, \text{l}, \text{h}) \rangle \rightarrow_{\text{JB}} \langle 1, (s, \text{l}, \text{h}) \rangle} \left( \begin{array}{c} \text{if\_icmpgt} \\ \text{true} \end{array} \right)$  $typeOf(v_1) = Int \land typeOf(v_2) = Int \land v_1 \le v_2 \text{ (if_icmpgt)}$  $\langle \text{if icmpgt l}, (s :: v_1 :: v_2, l, h) \rangle \rightarrow_{\text{IB}} (s, l, h)$  false

Figure 6: Concrete JB semantics.



# Statement translation $\mathbb{T}[[st_{CIL}, K]] = st_{JB}$

$\mathbb{T}[\![dup, \overline{s} :: t, \overline{l}, \overline{a}, \overline{w}]\!] =$	$\begin{cases} dup & \text{if } t \neq \text{Long} \\ dup2 & \text{if } t = \text{Long} \end{cases}$
$\mathbb{T}[\![add,\overline{s}::t_1::t_2,\overline{I},\overline{a},\overline{w}]\!] =$	$\begin{cases} i \text{ add } if t_1 = t_2 = \text{Int} \\ ladd & if t_1 = t_2 = \text{Long} \end{cases}$
$\mathbb{T}[[1dloc i, \overline{s}, \overline{l}, \overline{a}, \overline{w}]] =$	x load j where $j =  \overline{a}  + 64\frac{ \overline{a} }{\overline{a}} + i + 64\frac{i}{\overline{a}} \wedge x = \mathcal{J}VMprefix(typeOf(\overline{I}(i)))$
$\mathbb{T}[[stloc i, \overline{s} :: t, \overline{l}, \overline{a}, \overline{w}]] =$	xstore j where $j =  \overline{a}  + 64\frac{ \overline{a} }{a} + i + 64\frac{i}{1} \land x = JVMprefix(typeOf(\overline{I}(1)))$
$\mathbb{T}\llbracket [ \text{ldarg i, } \overline{s}, \overline{l}, \overline{a}, \overline{w} ] ] =$	xload j where $j = i + 64_a^i \land x = \Im VM prefix(typeOf(\overline{a}(i)))$
$\mathbb{T}[\operatorname{call} m(\operatorname{arg}_1, \cdots, \operatorname{arg}_i)]$ =	invoke; aload $p_{idx_1}^1$ ; getfield value; $x_{idx_1}$ store $p_{idx_1}^2$ ; ···
$\overline{\mathbf{s}} :: t_1 :: \cdots :: t_i, \overline{\mathbf{l}}, \overline{\mathbf{a}}, \overline{\mathbf{w}} :: p_1 :: \cdots :: p_i ]$	$\cdots$ aload $p_{idx_i}^1$ ; getfield value; $x_{idx_i}$ store $p_{idx_i}^2$ ;
	where invoke = $\begin{cases} invokestatic m(arg_1, \dots, arg_i) & if isStatic(m(arg_1, \dots, arg_i)) \\ invokevirtual m(arg_1, \dots, arg_i) & otherwise \end{cases}$
	$\{idx_1, \cdots, idx_j\} = \{k : \arg_k \in \operatorname{Ref}_{\operatorname{Loc}}\}$
	$\forall k \in [1j] : x_{idx_k} = \mathcal{J}VMprefix(typeOf( (p_{idx_k}^2))) \land \forall r \in [1i] : p_i = (p_i^1, p_j^2)$
$\mathbb{T}[[newobj T(a_1, \cdots, a_i)], =$	$x_i$ store $idx_i$ ; ··· ; $x_1$ store $idx_1$ ; new T ; dup ;
$\overline{s} :: t_1 :: \cdots :: t_i, I, \overline{a}, \overline{w}]$	$x_1$ load $idx_1;\cdots;x_i$ load $idx_i;$ invokevirtual $<$ init $>$ (arg <sub>1</sub> , $\cdots$ , arg <sub>i</sub> )
	where $\forall j \in [1i] : x_j = \mathcal{W}Mprefix(a_j) \land idx_j = freshIdx(newobj T(a_1, \dots, a_i), j)$
$\mathbb{T}\llbracket   ldfld f, \overline{s} :: t_{o}, \overline{l}, \overline{a}, \overline{w} \rrbracket =$	getfield f
$\mathbb{T}[[stfld f, \overline{s} :: t_o :: t_v, \overline{I}, \overline{a}, \overline{w}]] =$	putfield f
$\mathbb{T}\llbracket bgt k, \overline{s} :: t_1 :: t_2, \overline{l}, \overline{a}, \overline{w} \rrbracket =$	if_icmpgt k' where k' = $statementIdx(getBody(bgt k)(k))$ if $t_1 = t_2 = Int$
$\mathbb{T}[[1dloca i, \overline{s}, \overline{l}, \overline{a}, \overline{w}]] =$	$\mathbb{T}[\text{newobj WrapRef}(); dup2; stloc j; ldloc i; stfld value, \overline{s}, \overline{l}, \overline{a}, \overline{w}]$
	where $j = freshIdx(1dloca i, 0)$
$\mathbb{T}[[stind, \overline{s}, \overline{l}, \overline{a}, \overline{w}]] =$	$\mathbb{T}[[stfld value, \overline{s}, \overline{l}, \overline{a}, \overline{w}]]$
$\mathbb{T}[[1dind, \overline{s}, \overline{l}, \overline{a}, \overline{w}]] =$	$\mathbb{T}[$ ldfld value, $\overline{s}$ , $\overline{\overline{i}}$ , $\overline{\overline{a}}$ , $\overline{w}]$





# Experimental results Efficiency and precision

Table 1: Experimental results on the 5 most starred Github C# projects.

Program	LOC	met.	fail	Tr. t.	An.t.	Al	F	Prec.
CodeHub	32,510	4,887	0	0'07"	0'43"	9	1	89%
SignalR	71,207	6,610	3	0'07"	0'50"	8	1	88%
Dapper	22,513	1,058	0	0'07"	0'29"	13	3	77%
ShareX	171,580	11,568	14	0'58"	2'08"	57	0	100%
Nancy	109,139	8,817	0	0'07"	1'25"	18	1	94%
Total	406,949	32,940	17	1'26"	4'35"	105	6	94%

- 5 most popular GitHub repositories written in C#
- Efficiency:
  - Analyze industrial-size software in a few minutes
  - Translation time comparable to the analysis time.
- Precision:
  - 6/105 alarms (6%) are false because the translation

![](_page_13_Picture_9.jpeg)

# Experimental results Libraries

Library	# met.	# fail	% fail	Tr. t.	Mem.
mscorlib	28,344	870	3.07%	23"	158
Sys.Core	6,988	47	0.68%	4"	96
Sys.Design	13,509	4	0.03%	20"	180
Sys	17,851	242	1.36%	21"	142
Sys.Runtime.Serial	5,624	74	1.32%	5"	86
Sys.ServiceModel	34,603	80	0.23%	34"	156
Sys.Web	28,249	38	0.13%	37"	216
Sys.Web.Extensions	4,245	0	0.00%	4"	109
Sys.Windows.Forms	28,319	53	0.19%	42"	189
Sys.XML	12,727	171	1.34%	23"	146
Total	180,460	1,579	0.87%	3'33"	

Table 2: Experimental results on libraries.

- 10 largest system libraries of .NET framework
- Study how much code we can translate
  - 99.13% of the methods, with a worst case of 96.93%

![](_page_14_Picture_6.jpeg)

## Limitations and future work

### Native [and unsafe] code

- Code written in languages other than bytecode
- Linked to and executed by the virtual machine/runtime env.
- Static analysis requires a (manually written) model
- Cannot be translated by our approach
  - We cannot execute the translation of a CIL program with the JVM
- "Naming conventions" introduced by the compiler
  - Need some polishing to link warnings back to the source code

### Support .NET frameworks

ASP.NET, etc..

![](_page_15_Picture_11.jpeg)

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![](_page_16_Picture_2.jpeg)

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![](_page_16_Picture_3.jpeg)

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![](_page_16_Picture_7.jpeg)

DNV∙GL

# Thank vou. Questions?

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