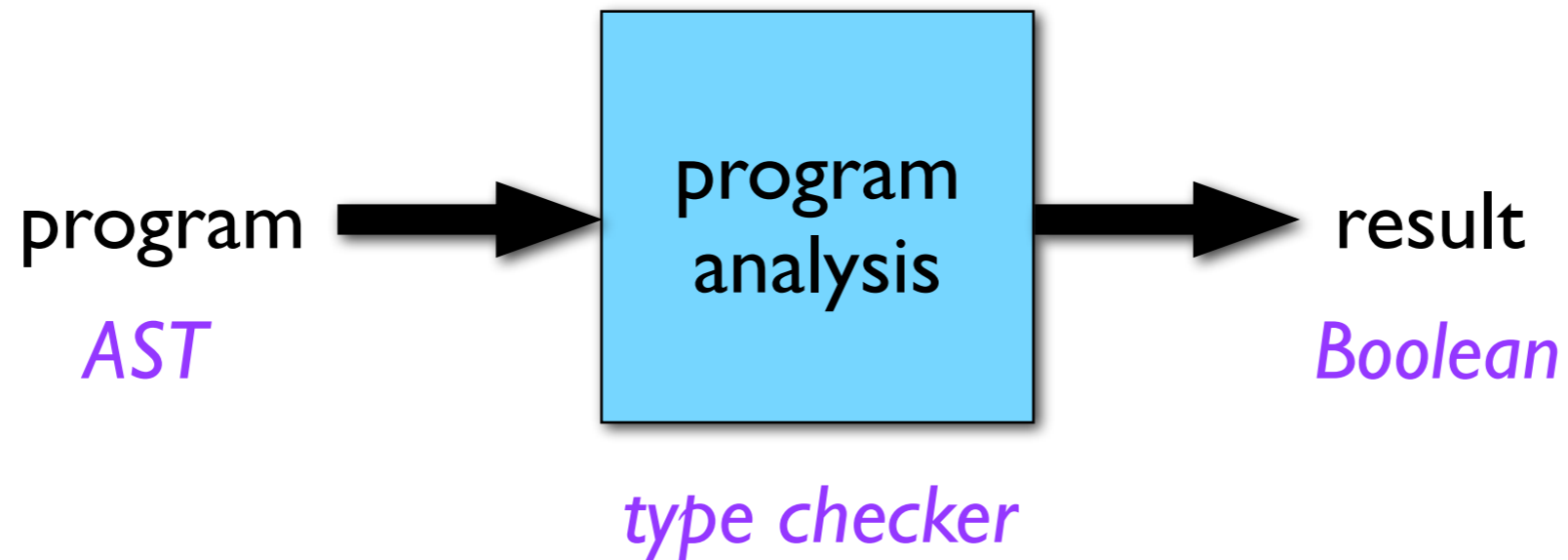


# **Toward Variational Data Structures**

Eric Walkingshaw  
University of Marburg

# Program analysis



```
class Buffer {  
  int buff = 0;  
  int get() {  
    return buff;  
  }  
  void set(int x) {  
    buff = x;  
  }  
}
```

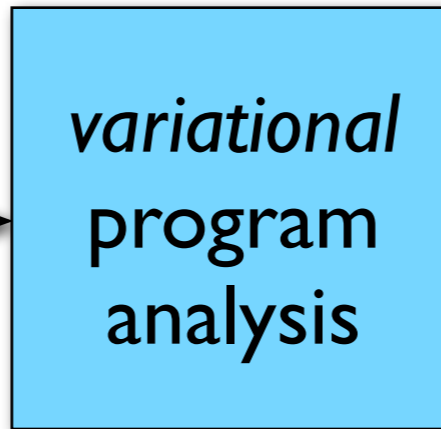
A code snippet for a C++ class named 'Buffer'. The code is enclosed in a light gray box with a black border. A large green checkmark is positioned to the right of the top right corner of the box, indicating that the code is correct or passes analysis.

# Variational program analyses

“variability-aware”

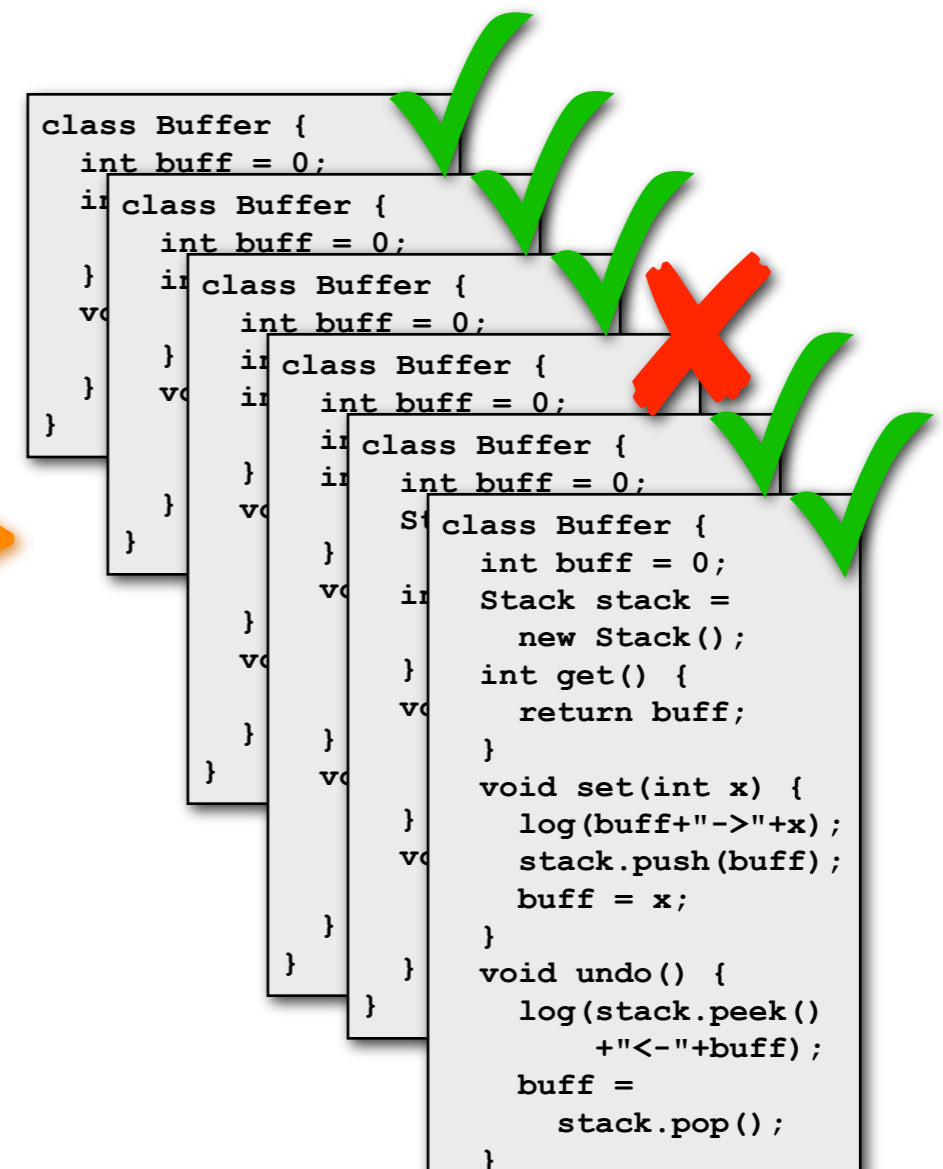
“family-based”

variational  
program

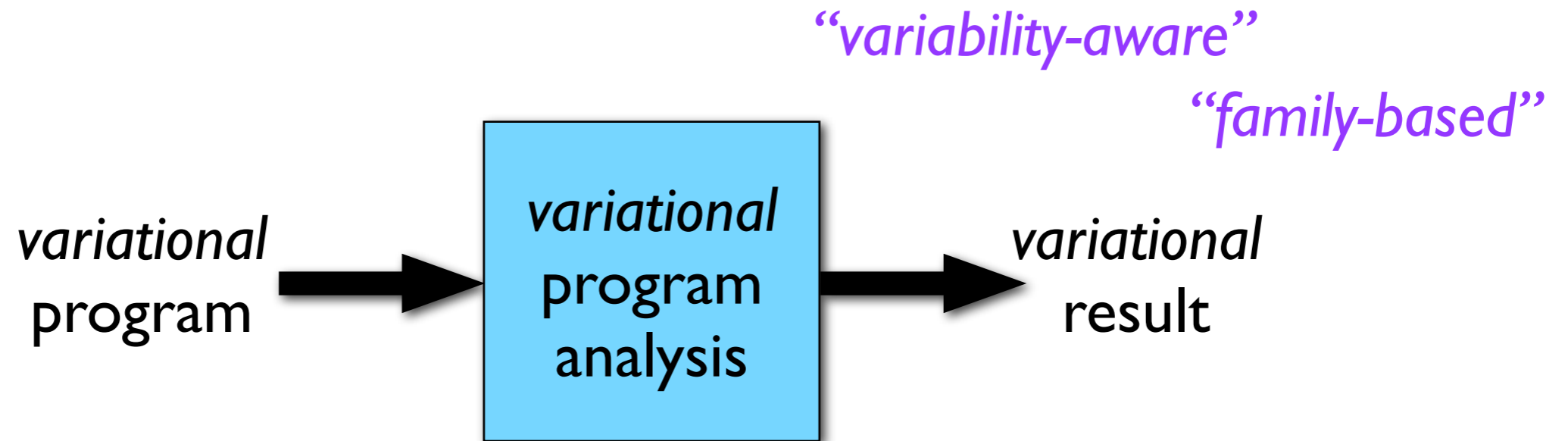


variational  
result

```
class Buffer {
  int buff = 0;
  #ifdef UndoOne
  int back = 0;
  #endif
  #ifdef UndoMany
  Stack stack =
    new Stack();
  #endif
  int get() {
    return buff;
  }
  void set(int x) {
    #ifdef Logging
    log(buff+"->" + x);
    #endif
    #ifdef UndoOne
    back = buff;
    #endif
    #ifdef UndoMany
    stack.push(buff);
    #endif
    buff = x;
  }
  #ifdef UndoOne
  void undo() {
    #ifdef Logging
    log(back+"<-" + buff);
    #endif
    buff = back;
  }
  #endif
  #ifdef UndoMany
  void undo() {
    #ifdef Logging
    log(stack.peek()
      + "<-" + buff);
    #endif
    buff =
      stack.pop();
  }
  #endif
}
```



# Variational program analyses



*How do we implement these things efficiently?*

# Goal of this talk

Promote foundational research  
on *variational data structures*

Develop variational program analyses systematically:

- identify where variation occurs in underlying data types
- identify/prioritize operations
- analyze trade-offs between variational implementations

*Many other applications too!*

# Collaborators



Christian Kästner  
Carnegie Mellon



Sven Apel  
Passau



Martin Erwig  
Oregon State



Eric Bodden  
Darmstadt

## Variational ...

- parsing in TypeChef
- type checking in FFJ<sub>PL</sub>
- type checking in TypeChef

- type inference in VLC
- programming in Haskell DSL
- data-flow analysis in SPL<sup>LIFT</sup>

# Outline of talk

1. Introduction

2. Functional view of variation

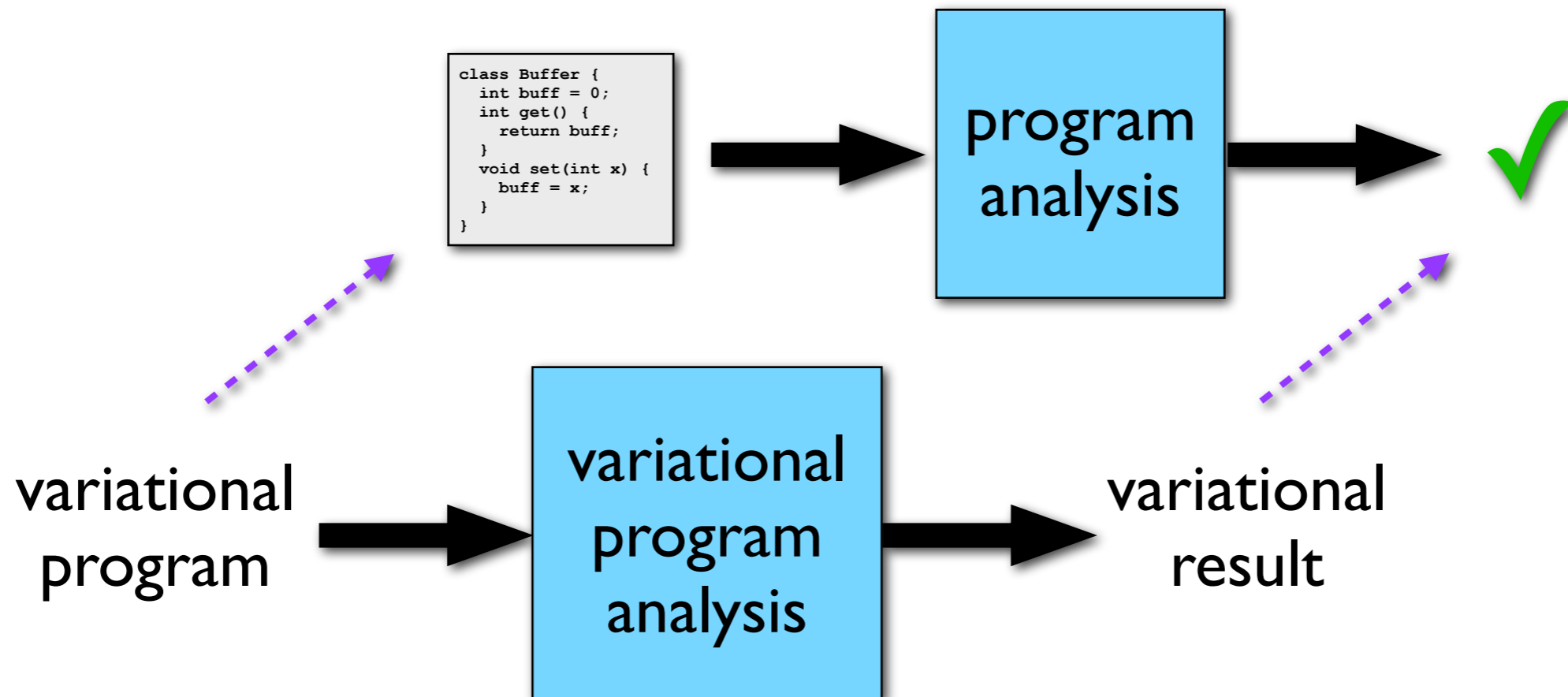
3. Variational data types

4. Variational lists

5. Conclusion

# Variation preservation

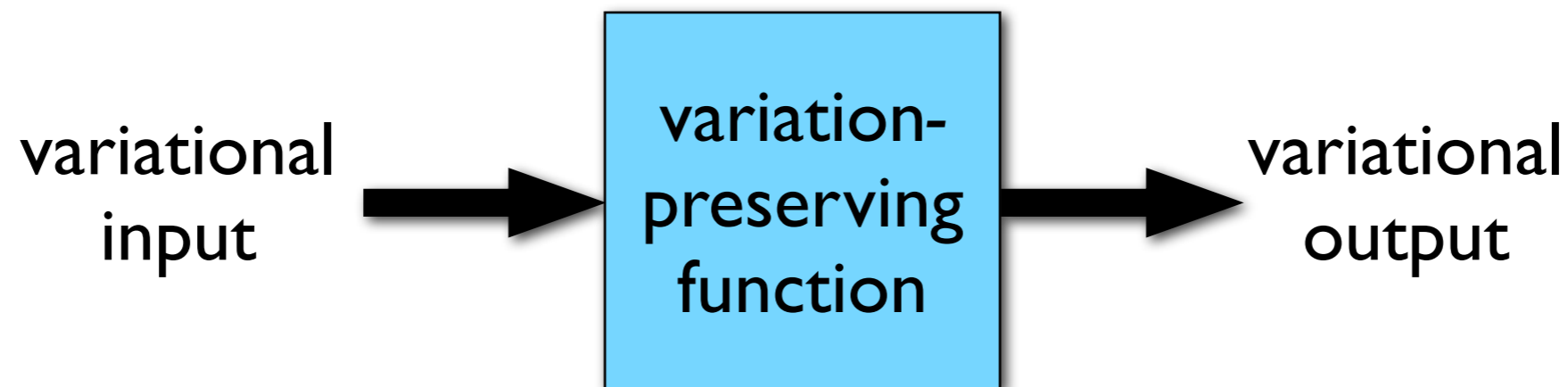
Variability in input must be *preserved* in output  
(correspondence between variants)





# Variation-preserving functions

Can generalize beyond variational program analyses



Supports *computing with variational data*

e.g. variational test execution

Supports *simultaneous exploration of alternatives*

e.g. route/travel planning

# Variation-preserving functions

*Plain function*

$$f : (A_1, \dots, A_n) \rightarrow B$$

*Variation-preserving function*

$$f_v : (V[A_1], \dots, V[A_n]) \rightarrow V[B]$$

*may choose some inputs to be non-variational*

# Promoting static variation to input parameters

```
String format(String s) {  
  #if COLOR  
    ...  
  #else  
    ...  
  #endif  
}
```

```
String format(Boolean color, String l) {  
  if (color) {  
    ...  
  } else {  
    ...  
  }  
}
```

**format<sub>v</sub>** : (V[Boolean], String) → V[String]

# Outline of talk

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# Variational data types

*Configuration space*

$$C = \{c_1, \dots, c_n\}$$

*configurations*

*Variational data type*

$$V[A] : C \rightarrow A$$

*mapping from configurations  
to values of type A*

$$\{(c_1, a_1), \dots, (c_n, a_n)\}$$

*explicit representation  
(doesn't scale, many duplicates)*

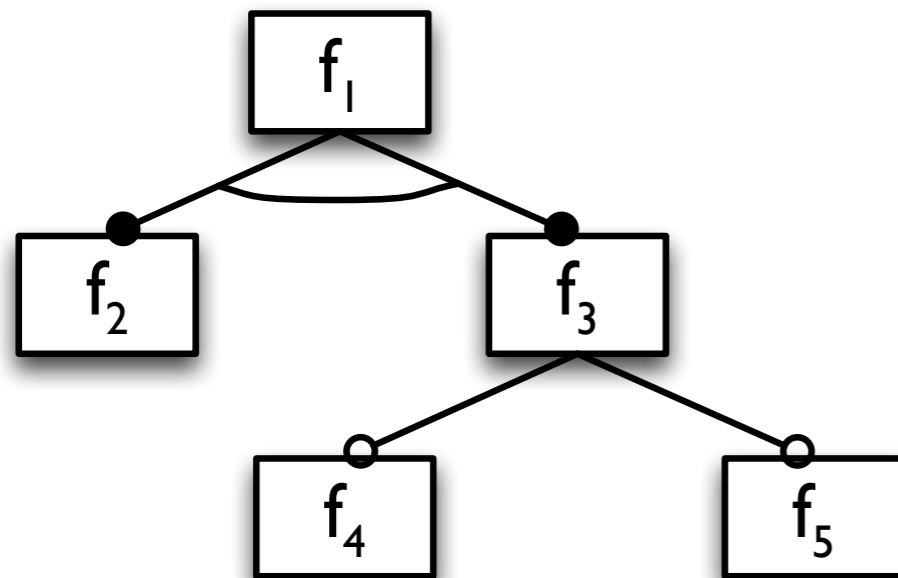
# Variational data types

*Configuration space*

$$C = \{c_1, \dots, c_n\}$$

*Variational data type*

$$V[A] : C \rightarrow A$$



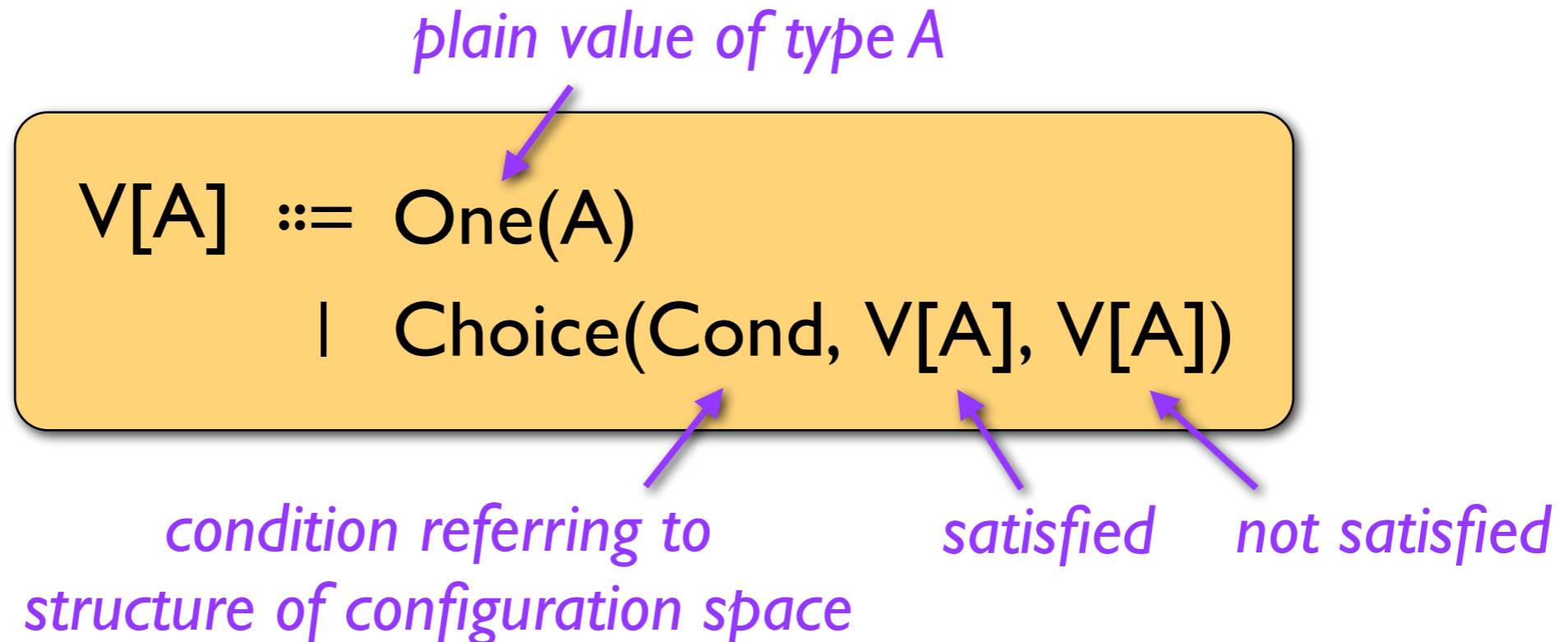
*Can exploit structure in configuration space*

$$\{ (f_4 \wedge f_5, a_1), (\neg f_4 \vee \neg f_5, a_2) \}$$

*Labels must partition the configuration space*

# Implementing variational data types

## Option I: “Choice trees”



$\text{Choice}(C_1, \text{One}(a_1),$   
 $\quad \text{Choice}(C_2, \text{One}(a_2), \text{One}(a_3)))$

$C_1\langle a_1, C_2\langle a_2, a_3 \rangle \rangle$       *syntactic sugar*

# Implementing variational data types

## Option I: “Choice trees”

$$\begin{aligned} V[A] ::= & \text{One}(A) \\ & | \text{Choice}(\text{Cond}, V[A], V[A]) \end{aligned}$$

If conditions are:

- simple references  $\equiv$  choice calculus
- boolean formulas  $\equiv$  TypeChef



# Implementing variational data types

## Option 2: “Formula maps”

*existing map data structure*

$V[A] ::= \text{Map}[A, \text{Formula}]$

$\text{Map}( \{ a_1 \Rightarrow f_4 \wedge f_5 ,$   
 $a_2 \Rightarrow \neg f_4 \vee \neg f_5 \} )$

# Implementation trade-offs

## Partition invariant:

- choice trees – *by construction*
- formula maps – *explicitly maintained*

*exactly one value  
per configuration*

## Space minimality:

- choice trees – *not maintained*
- formula maps – *by construction*

*each variant  
appears once*

	add	select
choice tree	log n	log n
formula map	n	n

*(assumes SAT-solving is very fast)*

# Computing with variational data types

Can systematically “lift” many operations on  $A$  to  $V[A]$

$\text{map} : (A \rightarrow B) \rightarrow V[A] \rightarrow V[B]$   
 $\text{flatMap} : (A \rightarrow V[B]) \rightarrow V[A] \rightarrow V[B]$

$V[\cdot]$  is a monad

$v = C\langle 13, D\langle 42, 67 \rangle \rangle \quad : V[\text{Integer}]$

$\text{map}(\text{even}, v) = C\langle \text{false}, D\langle \text{true}, \text{false} \rangle \rangle \quad : V[\text{Boolean}]$

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# Need for specialized variational data structures

List[A]

```
nil      : List[A]
cons     : (A, List[A]) → List[A]
get      : (List[A], Int) → A
length   : List[A] → Int
```

List #1	List #2	V[List[A]]	List[V[A]]
[1, 2, 3]	[1, 4, 3]	D⟨[1, 2, 3], [1, 4, 3]⟩	[1, D⟨2, 4⟩, 3]
[5, 6]	[5, 6, 7]	D⟨[5, 6], [5, 6, 7]⟩	<i>impossible</i>

*no sharing*

*not expressive*

# Variational tail list

## Option 1: Add variational constructor

TList[A]

```
nil      : TList[A]
cons     : (A, TList[A]) → TList[A]
vlist    : V[TList[A]]  → TList[A]
get      : (TList[A], Int) → V[Opt[A]]
length   : TList[A]     → V[Int]
```

*can be null*

$x = \text{cons}(5, \text{cons}(6, \text{vlist}(\text{D}\langle \text{nil}, \text{cons}(7, \text{nil}) \rangle)))$        $\text{D}\langle [5, 6], [5, 6, 7] \rangle$

$\text{length}(x) = \text{D}\langle 2, 3 \rangle$

$\text{get}(x, 3) = \text{D}\langle \text{null}, 7 \rangle$

- maximally expressive
- generic technique for algebraic data types (GTTSE'12)

# Variational tail list

Option 1: Add variational constructor

TList[A]

```
nil      : TList[A]
cons     : (A, TList[A]) → TList[A]
vlist    : V[TList[A]]  → TList[A]
get      : (TList[A], Int) → V[Opt[A]]
length   : TList[A]     → V[Int]
```

```
y = cons(1, vlist(D⟨cons(2, cons(3, nil)),
                 cons(4, cons(3, nil))⟩))
```

$D\langle [1, 2, 3], [1, 4, 3] \rangle$

only supports prefix sharing

# Variational, optional element list

Option 2: Make head variational and optional

**OList[A]**

```
nil      : OList[A]
cons     : (V[Opt[A]], OList[A]) → OList[A]
get      : (OList[A], Int)       → V[Opt[A]]
length  : OList[A]              → V[Int]
```

$x = \text{cons}(\text{One}(5), \text{cons}(\text{One}(6), \text{cons}(\text{D}\langle \text{One}(\text{null}), \text{One}(7) \rangle, \text{nil})))$   
 $\text{D}\langle [5, 6], [5, 6, 7] \rangle$

$y = \text{cons}(\text{One}(1), \text{cons}(\text{D}\langle \text{One}(2), \text{One}(4) \rangle, \text{cons}(3, \text{nil})))$   
 $\text{D}\langle [1, 2, 3], [1, 4, 3] \rangle$



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# Summary

## Functional view of computing with variation

- variation in inputs *preserved* in output

## Variational data types – $V[\cdot]$

- choice trees vs. formula maps (time vs. space)
- systematic lifting of plain functions

## Variational data structures

- limitations of  $V[\cdot]$
- some example variational list data structures

# Conclusion

## Goal of this talk

Promote foundational research  
on *variational data structures*

## Opportunity for us as a community:

- many external applications
- we're the experts on coping with variation
- surface is barely scratched ...