

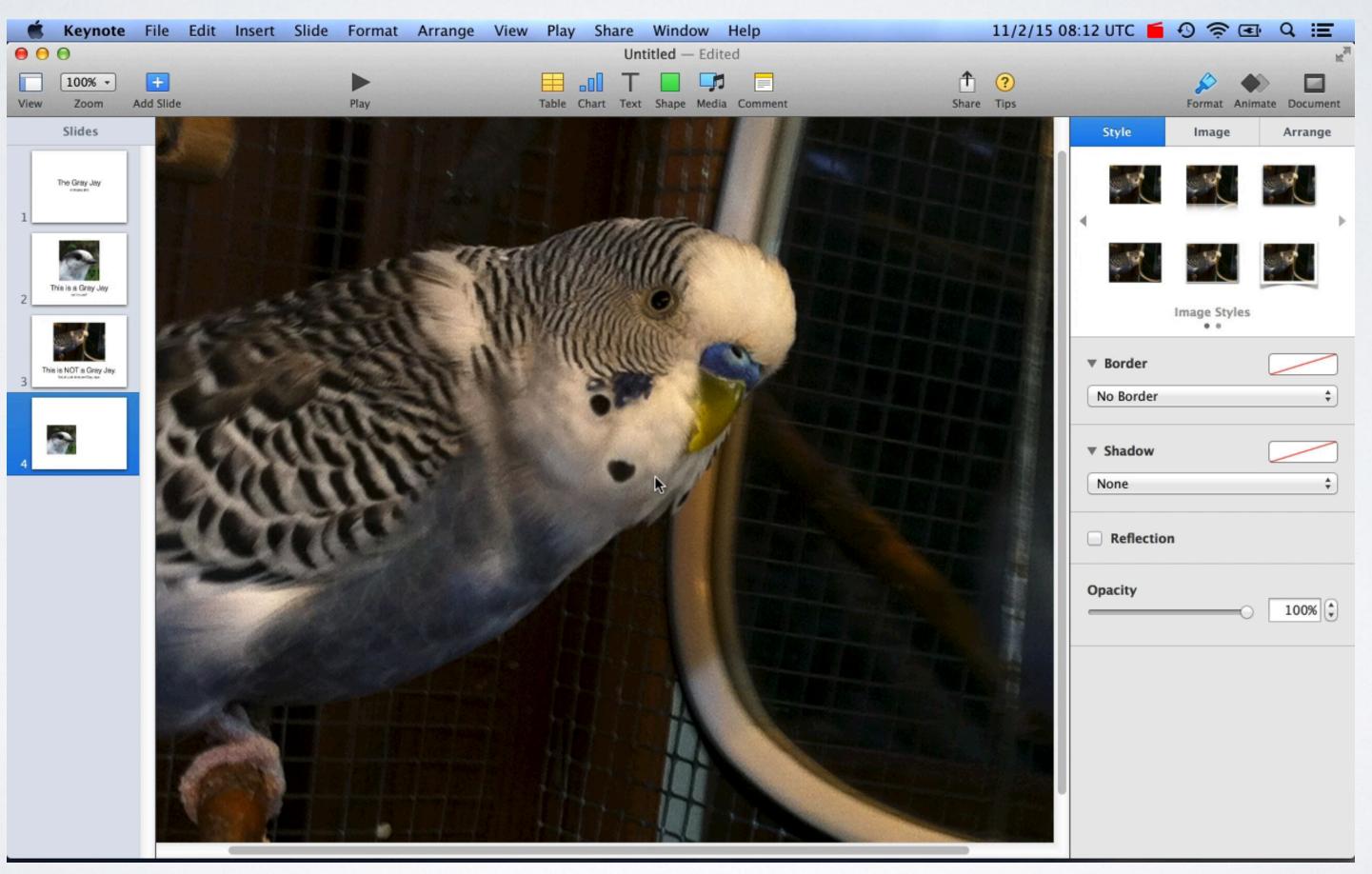
$\bigcirc \bigcirc \bigcirc$	length.ml — maniposynth	Maniposynth × +
ſĴ	🔀 length.ml 1, U 🗙 ເຊິ່ 🖬 🕮 🖤	$\leftrightarrow \rightarrow \mathbb{C}$ (i) localhost:1111/length.ml $\oplus \bigstar \circledast \ddagger \mathbb{C}$ :
	<pre>int list 1 let int_list = [ 0; 0; 0 ] [@@pos 69, 72] 2</pre>	The Magnificent Manifold Undo (第乙) Redo (企業乙) if (??) then (??) else (??) - length (??) - Top level - drag items from the menus above, or double-click below to write code
	<pre>'a list -&gt; int 3 let rec length list = 4 match list with 5   hd :: tail → 6   let length2 = length tail [@@pos 55, 12] in 7   1 + length2</pre>	int_list = [0;0;0] [0;0;0] length_int = length <sup>[0;0;0]</sup> int_list <b>3</b>
	<pre>8   [] → 0 9 [@@pos 77, 200] 10 int 11 let length_int = length int_list [@@pos 276, 76] 12</pre>	length       rec         list       [hd] 0; 0; 0]       [hd] 0; 0]       [hd] 0; 0]         Return       3       2       1       0         Bindings inside function - drag what you want below, or double-click to write code       1       0         hd       tail       length2 = length       tail
(Q) کیک ۲۰۰۲ ۲۰۰۲ ۲۰۰۲ ۲۰۰۲ ۲۰۰۲ ۲۰۰۲ ۲۰۰۲ ۲۰۰	ster* - ↔ 0↓ 1↑ - ⊗ 0 ▲ 1 - ☞ opam(4.07.1) - Spaces: 2 UTF-8 LF OCaml 🔊 4	O     □     O       Return expression(s) and value(s)     ←       1 + 0     list →       0     □       1     0       Synth (HE)

### Brian Hempel and Ravi Chugh

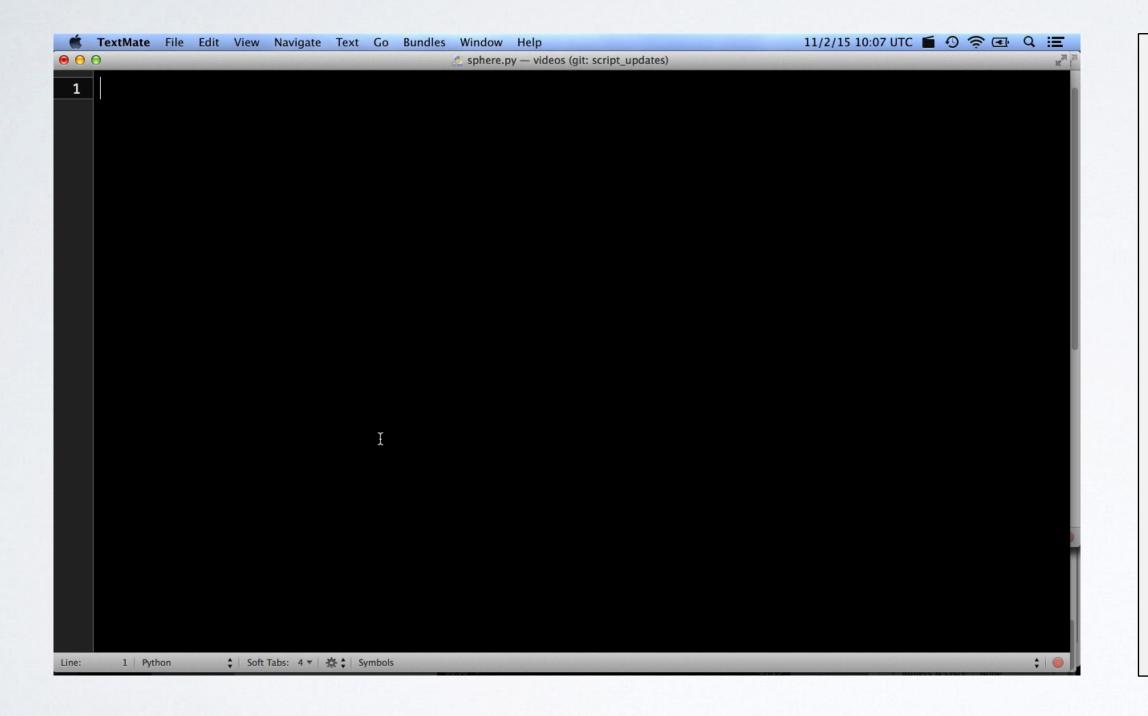


# 30 June 2022

## Direct Manipulation UI



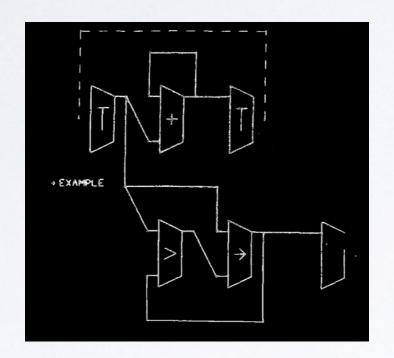
## Why not D.M. for programming?





## D.M. the AST...

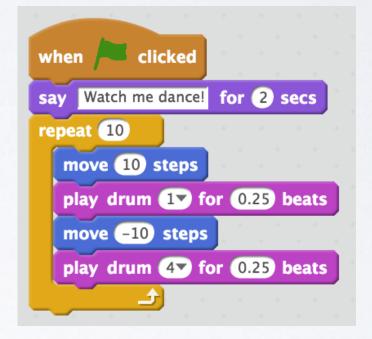
### Nodes-and-wires



The On-line Graphical Specification of Computer Procedures W. Sutherland (1966)

...but those are **expressions** not output values

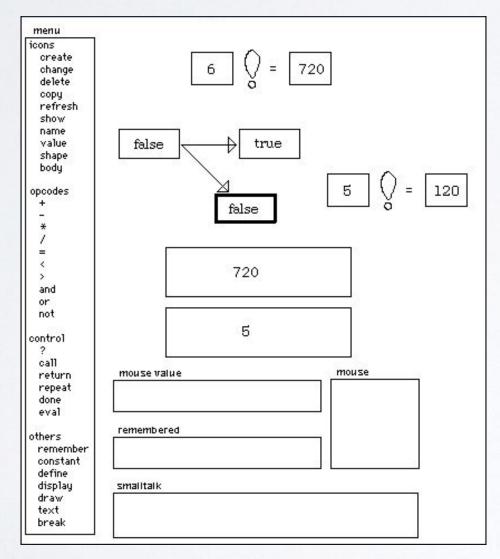
### Blocks



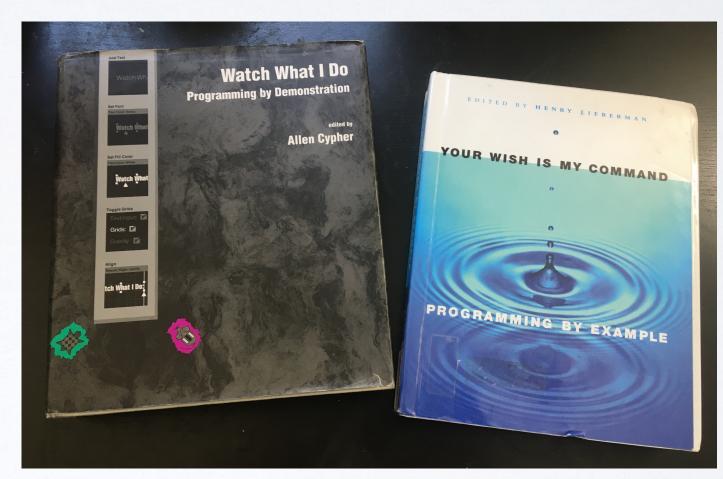
### Scratch Resnick et al. (2009)

## D.M. the values...

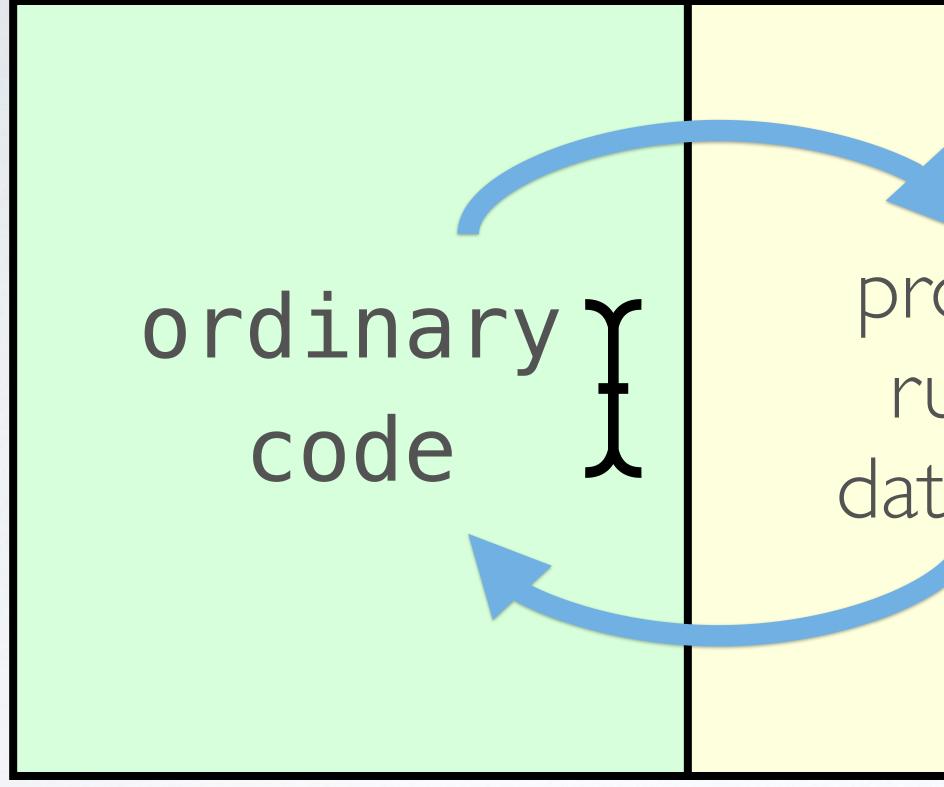
### Programming by Demonstration (PBD) You give a step-by-step demonstration of what you want the computer to do.



Pygmalion Smith (1975)



Have you ever used PBD? - Domain-specific - Rarely textual code



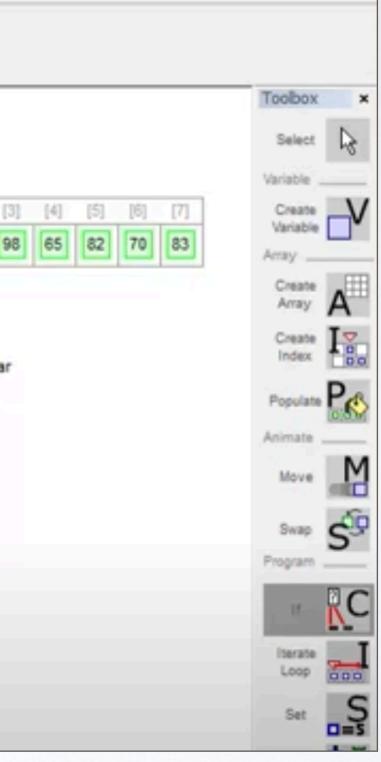
## Bimodal Programming

# program's runtime data values

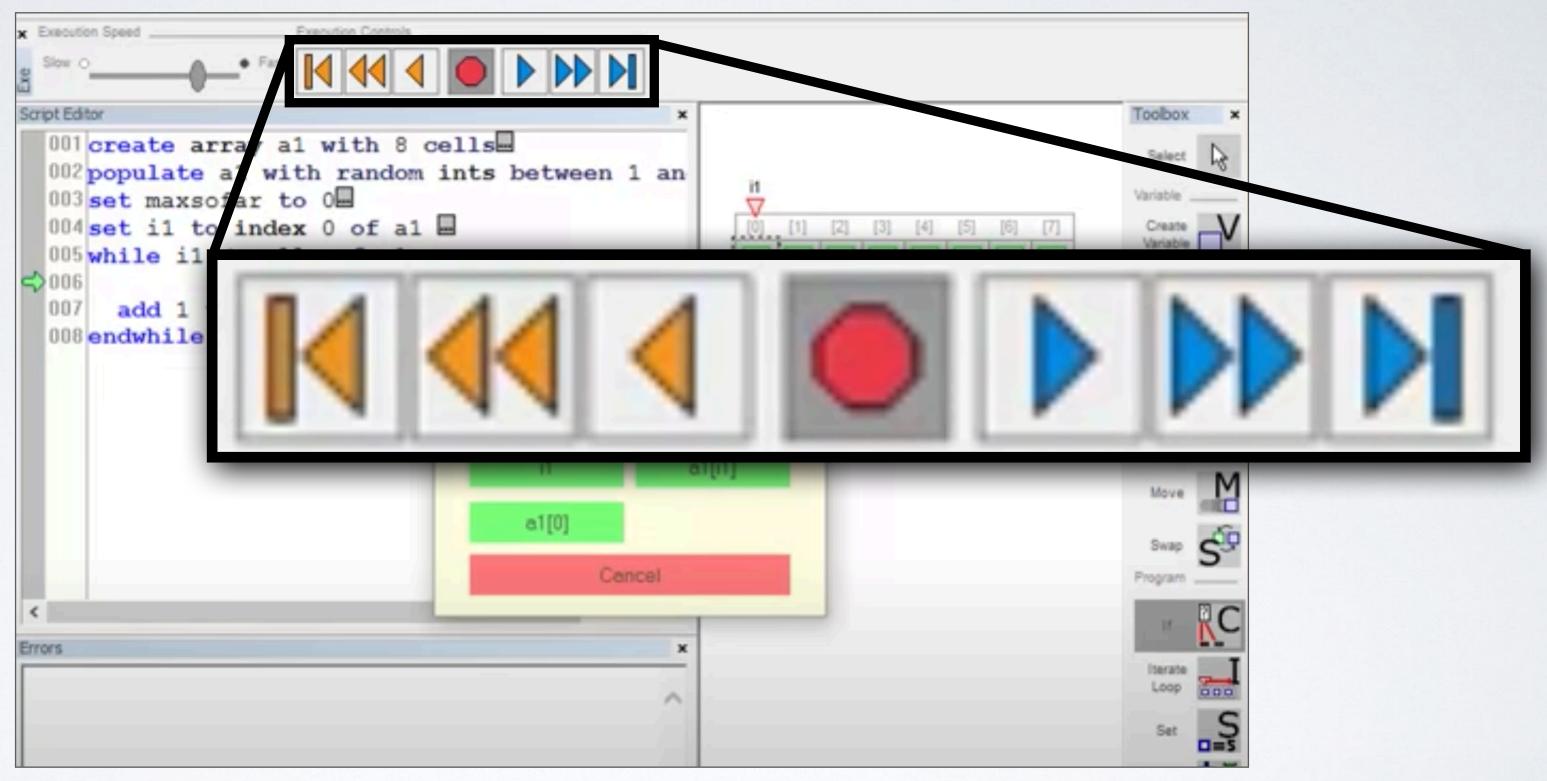
### **ALVIS Live!** Hundhausen & Brown (2007)

Execution Speed Execution Control     Slow O • Fast		
Script Editor 001 create array al with 8 002 populate al with rando 003 set maxsofar to 0 004 set il to index 0 of a 005 while il < cells of al	om ints between 1 an	1 [0] [1] [2] [35] 74 66
007 add 1 to i1 008 endwhile	Array if x ? y Please clarify what x is i1 a1 a1[0] Cancel	(1)
Errors	×	

Array algorithms (for education)



### **ALVIS Live!** Hundhausen & Brown (2007)



Array algorithms (for education) Very linear: have to manage time.

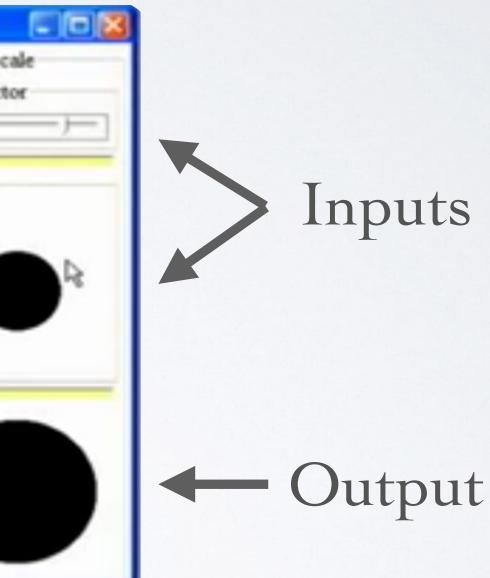
## **Tangible Functional Programming** Conal Elliott (2007)

Parts Tweak Demos TV options Window	Tan
Uniform scale rotation angle	I V uniform sc scale fact
Canvas of tangible values	

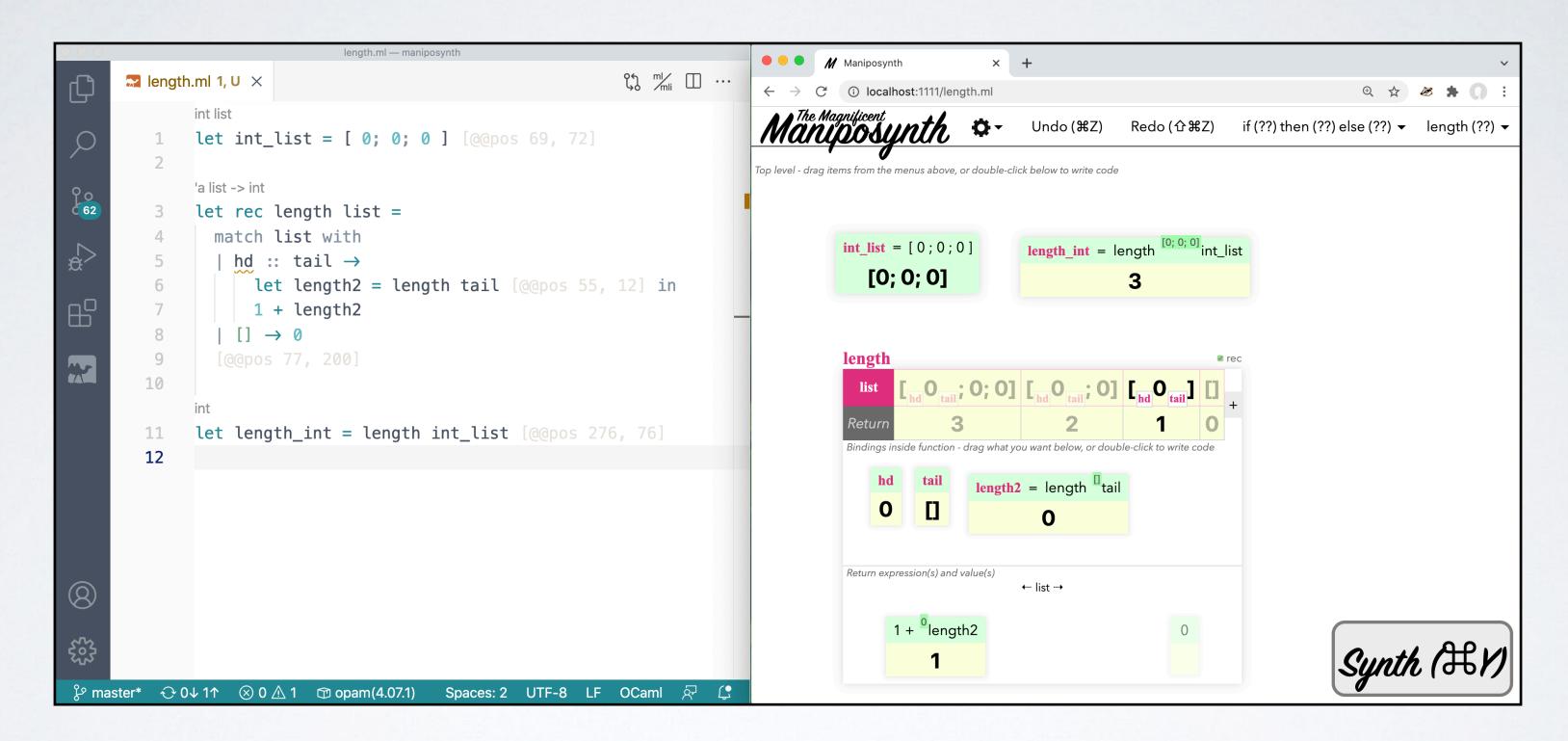
### Non-linear

Pure functional programming (no state) complements **non-linear** editing because, without state, one need not manage **time**.

### ngible Value (TV)



## Goals: Non-linear + Bimodal + Synthesis







### • Goals

### • Demo

- Implementation
- Evaluation
- Future Work & Conclusion



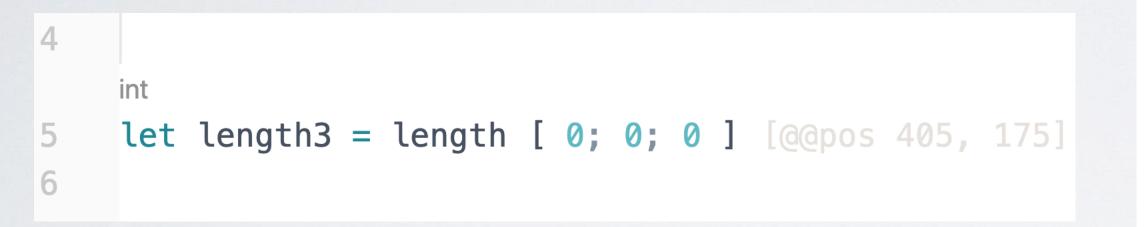
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## Tangible Values in Maniposynth

### 1 let-binding

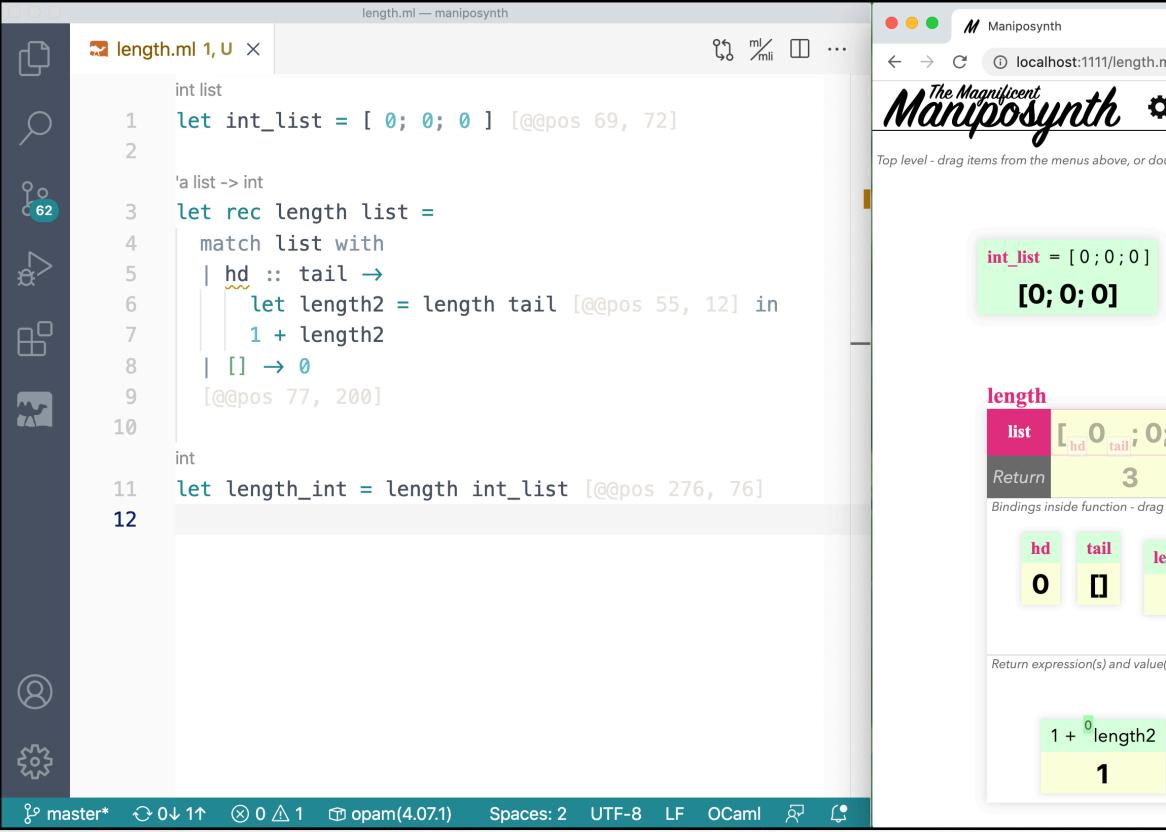


### (Roughly)

### length3 = length[0;0;0]

### Expression Pattern Value

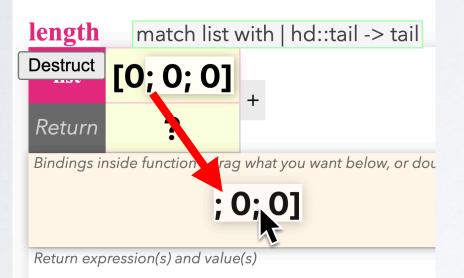
## Demo: List Length



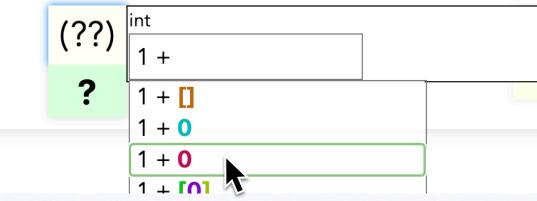
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.ml			Ð	☆ 🖉	<b>* ()</b> :
<b>Ģ</b> -	Undo (೫Z)	Redo( <b></b>	if (??) then (??) else (??	?) <del>-</del> le	ength (??) 👻
ouble-cl	lick below to write code				
	length_int = le	ngth <sup>[0; 0; 0]</sup> int_lis			
	length_int = le	<b>3</b>			
		5			
		e rea			
); 0]	[hd O <sub>tail</sub> ; 0]	[hd tail] [] +			
	2	1 0			
g what y	ou want below, or doubl	e-click to write code			
length	2 = length <sup>[]</sup> tail				
	0				
e(s)	⊷ list ···•				
		0			
			Cui	nth.	/H/I
			Sy	<i>wv</i> (	

## Demo: List Length

### Drag to extract



### Autocomplete to value

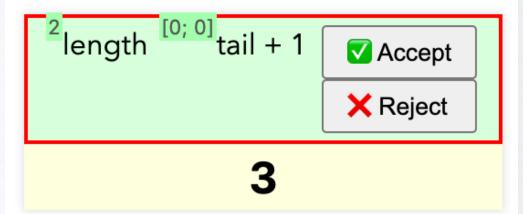


### Autocomplete to extract

(??)	'a
(::)	1 + length
?	1 + length <b>[0; 0; 0]</b>
	1 + length 0
	1 + length ; 0; 0]
	1 + length list

### Assertions $\checkmark$ length [] = 0 $\Rightarrow$ length [0; 0; 0] = 4 **4** 3





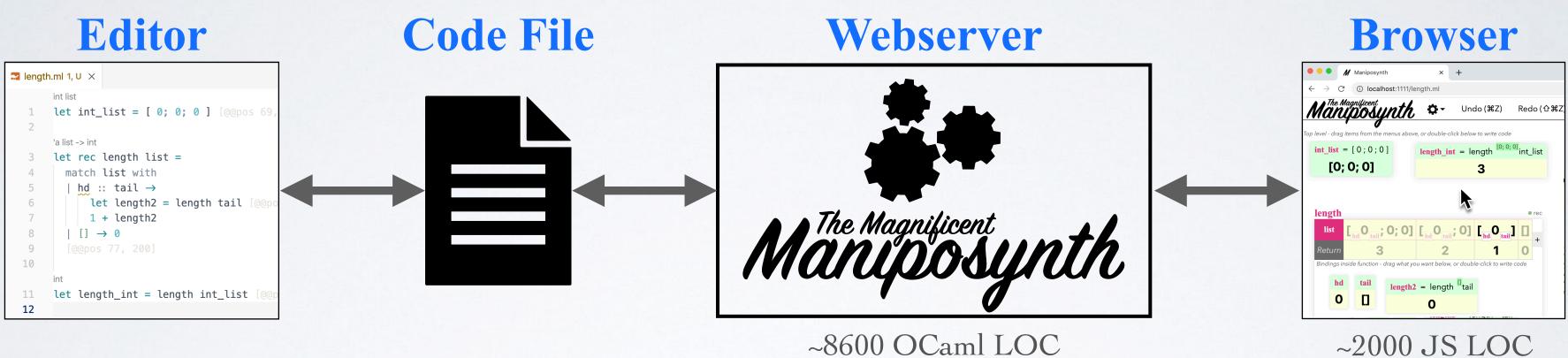


- Goals
- Demo
- Implementation
  - Interpreter
  - Binding reordering
  - Synthesizer
- Evaluation
- Future Work & Conclusion





## Architecture



<sup>~8600</sup> OCaml LOC

Code is "ground truth"

Server runs code and renders HTML

Browser polls for changes or tells server to do an action

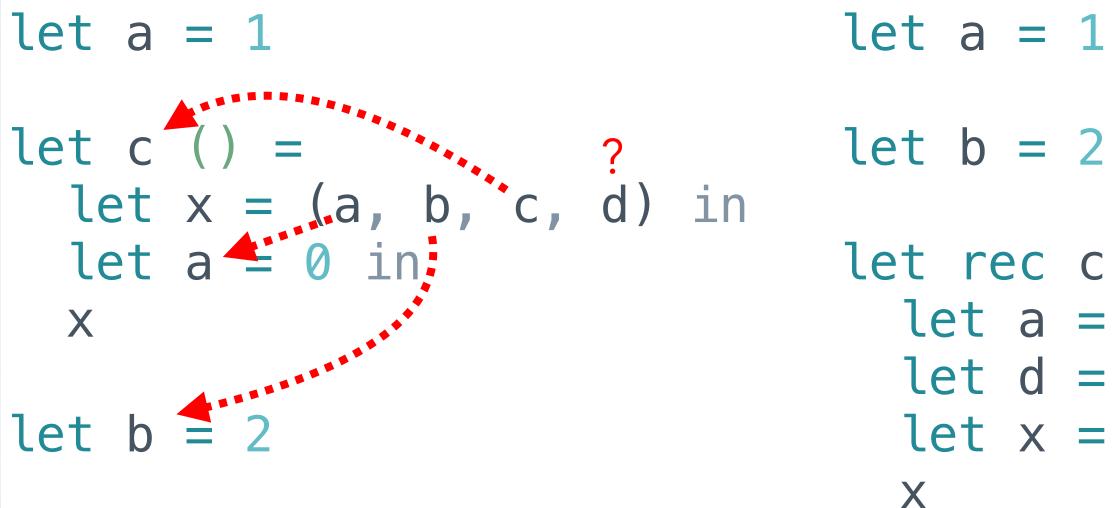
## Interpreter

- Adapted the interpreter from Camlboot [Courant et al. 2020] (Couldn't just modify the standard OCaml tools because the OCaml compiler performs type erasure — can't log the value when expression is at polymorphic type!)
- On each execution step, log:
  - (exp/pat, call frame num, val, env)
- For live display, show value at that exp/pat with the current call frame num

## Binding reordering

2D canvas is unordered, let-bindings in code are automatically reordered to bring items into scope.

Requirement: All names at the same "indentation level" must be unique.



let rec c () = let a = 0 in let d = (??) in let x = (a, b, c, d) in

## Synthesizer

'a -> 'b let length list = (??)

- No big ideas, just want it to work with (a) few examples, (b) no type annotations, and (c) produce quality results even with the Pervasives functions in scope (e.g., addition, subtraction, etc).
  - Type-directed, inspired by Myth (Osera and Zdancewic 2015)
  - With a probabilistic context-free grammar (PCFG) 52% x**Expressions** e::=  $\frac{20\%}{e_1} \overline{e_i}$  $^{10\%}$ fun  $x \to e$  $\frac{8.1\%}{ctor}$ 6.6% c <sup>1.9%</sup> match  $e_1$  with  $\overline{C...} \rightarrow e_i$ <sup>1.3%</sup> if  $e_1$  then  $e_2$  else  $e_3$
  - More in paper and preprint appendix

### let () = assert (length [ 0; 0; 0 ] = 3)

**Names** x ::=  $^{73\%} localName \mid ^{27\%} pervasivesName$ **Local Names** *localName* ::= <sup>31%</sup>*MostRecentlyIntroduced*  $^{20\%}$  2ndMostRecentlyIntroduced <sup>11%</sup> 3rdMostRecentlyIntroduced ...etc...



- Goals
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## **Two Evaluations**

- 1. An expert (me) implemented 38 examples from the first lessons of a functional data structures course (IN2347 Functional Data Structures, Technische Universität München)
- 2. Exploratory user study with two professional OCaml programmers

Goal: qualitative insights. What is or is not working?

## Example Implementation Results

Function	LOC	Asserts	Time	Mouse	Keybd	Un/Re/Del	ТуреЕ
nat_plus	5		0.8	6	5		
nat_minus	8		1.9	6	11		
nat_mult	9		1.4	8	6		
nat_exp	13		2.1	9	6		
nat_factorial	13		1.6	8	4		
nat_map_sumi	10		2.6	11	5		1
count	9		1.9	9	11		
length	4		0.3	1	7	16. NA 19. P	
snoc	8	1	2.4	8	12	2	
reverse	8		1.5	4	9		
nat_list_max	17		4.6	23	21		
nat_list_sum	13		1.1	9	4		
fold	9		3.2	14	6		
shuffles	14		14.5	25	28	2	
contains	9		2.2	10	13	1	
distinct	16		2.4	9	11	2	
foldl	10	1	1.5	10	6		1
foldr	8	1	1.8	10	5		
slice	12	3	9.8	19	22	4	
append	8	1	1.4	7	9		
sort_by	21	3	6.2	17	29		
quickselect	13	1	13.1	19	38	1	1
sort	16	3	5.6	11	32	2	
ltree_inorder	12	1	2.9	7	20	1	1
ltree_fold	13	1	3.1	13	13		
ltree_mirror	11	1	4.4	12	6		1
bst_contains	14	3	6.6	11	32	1	
bst_contains2	17	5	10.4	20	41	2	
btree_join	34	2	61.7	82	64	51	
bst_delete	36	2	14.4	31	24	4	
bstd_valid	29	3	32.2	63	100	4	1
bstd_insert	18	2	8.0	38	23	3	
bstd_count	21	1	7.6	15	32	1	
bst_in_range	31	3	9.3	23	39	3	
btree_enum	29	3	19.2	31	51	6	3
btree_height	15	1	1.9	11	14		
btree_pretty	14	1	3.7	4	21		4
btree_same_shape	19	1	8.1	14	34	7	
Total	566	44	277.6	628	814	97	13

### 4.5 hours, 3 tool crashes, but success!

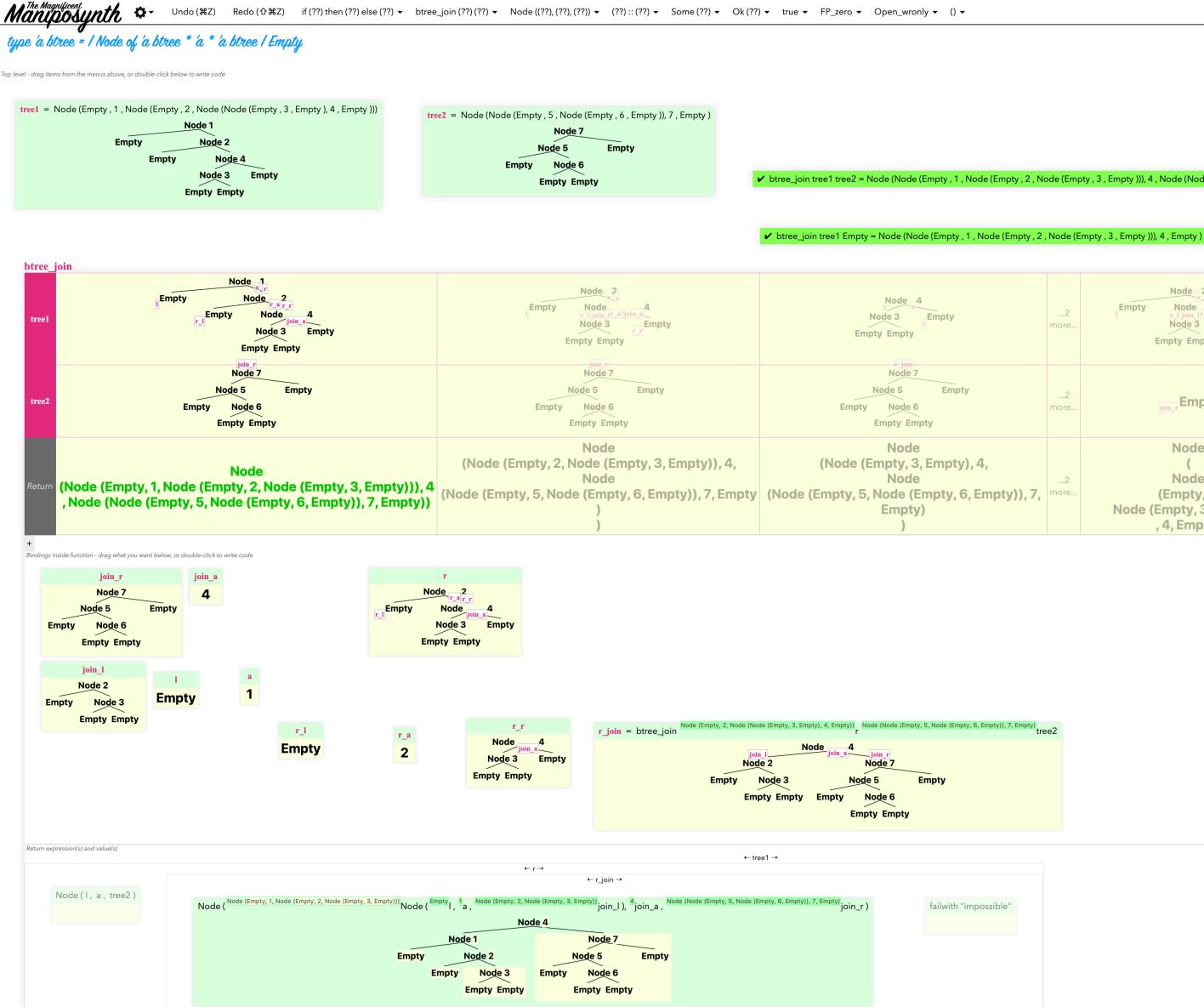
Err Crash

1

3







### btree\_join tree1 tree2 = Node (Node (Empty , 1 , Node (Empty , 2 , Node (Empty , 3 , Empty ))), 4 , Node (Node (Empty , 5 , Node (Empty , 6 , Empty )), 7 , Empty ))

		rec
Node 2 Empty Node 4 r_ljoin r_ajoin_a Node 3 Empty Empty	Node 3 Node 3 Empty Empty	Empty
join_r Empty	r_join <b>Empty</b>	Empty
Node ( Node (Empty, 2, Node (Empty, 3, Empty)) , 4, Empty)	Node ( Node (Empty, 3, Empty), 4, Empty)	Empty
	Empty Node 4 Node 3 Empty Empty ioin_r Empty Node ( Node ( Node ( Empty, 2, Node (Empty, 3, Empty))	Empty       Node       4         Node 3       Empty         Empty Empty       Empty         ioin_rEmpty       Empty         Node 3       Empty         Empty Empty       Empty         ioin_rEmpty       Final         Node       Node         (       Node         (       Node         (Empty, 2,       Node (Empty, 3, Empty))

	tree2	

## Observations

Could hide the code

No trouble with binding order (some trouble with nested match order)

Value-oriented vs. expression-oriented thinking

**length3** = length [0;0;0] Despite trying to place attention on values... ... often thought only about expressions.

## User Study

- 2 participants x 3 sessions x 2 hours each
- 5 and 11 years of professional OCaml experience
- Ran Maniposynth on their own computers alongside Vim
- Participants attempted exercises with varying amounts of guidance from facilitator
- Goal: qualitative insights

## Observations from User Study

- Positive about non-linearity: "fits a lot more with how I like to write code" (P1)
- Too many colors, too few labels
- Even in session three, both participants occasionally still needed guidance from the facilitator
- Writing assertions was not a problem: both wanted to do so, unprompted
- Synthesis only produced useful results 16% of the time, but participants were not bothered when it did not
- (More in paper)

### Expression-oriented vs.

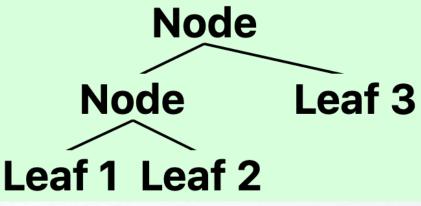
Value-oriented thinking

P2 didn't fully realize they were working with live values until after the first exercise.

P1 & facilitator stuck on a bug that was clear from looking at the live values

P2 was so used to reading

```
Node (Node (Leaf 1, Leaf 2), Leaf 3))
they were subtly repelled by beautified trees
```





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## Future Work

### More self-description in UI (Tooltips?)

tree1 = Node (Empty, 1, Node (Empty, 2, Node (Node (Empty, 3, Empty), 4, Empty))) Node 1 Empty Node 2 Empty Node 4 Empty Node 3 **Empty Empty** 

Shrink large values

Encourage value-oriented thinking

- Display values instead of variable names?

List.mem <sup>2</sup>target <sup>[1; 2; 3]</sup>list

List.mem <sup>target</sup> 2 <sup>list</sup> [1; 2; 3]

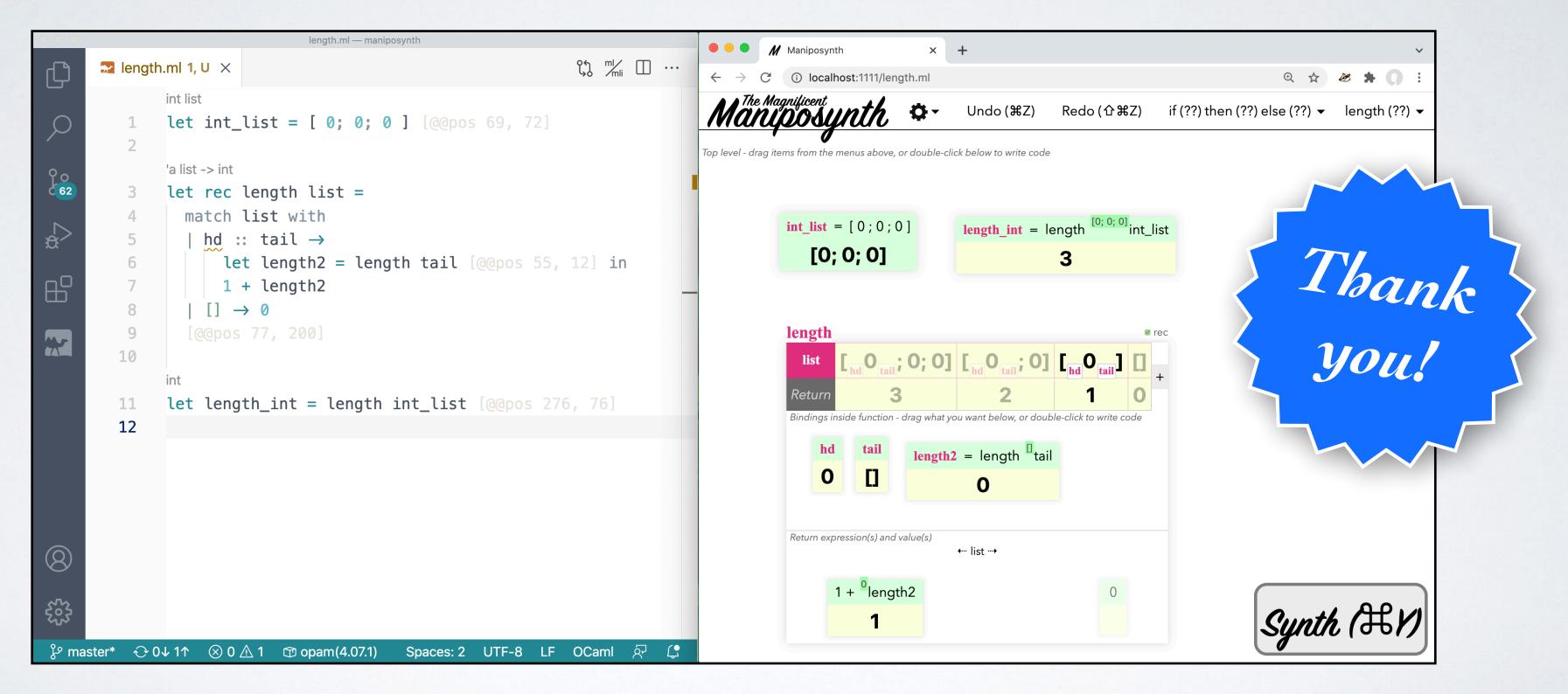
- More actions on values?



## Conclusion

### Yes, you can have a graphical, non-linear interface even when the program is ordinary code.





Visit maniposynth.org for artifact and video