

# NPRG075

## Formal models of programming

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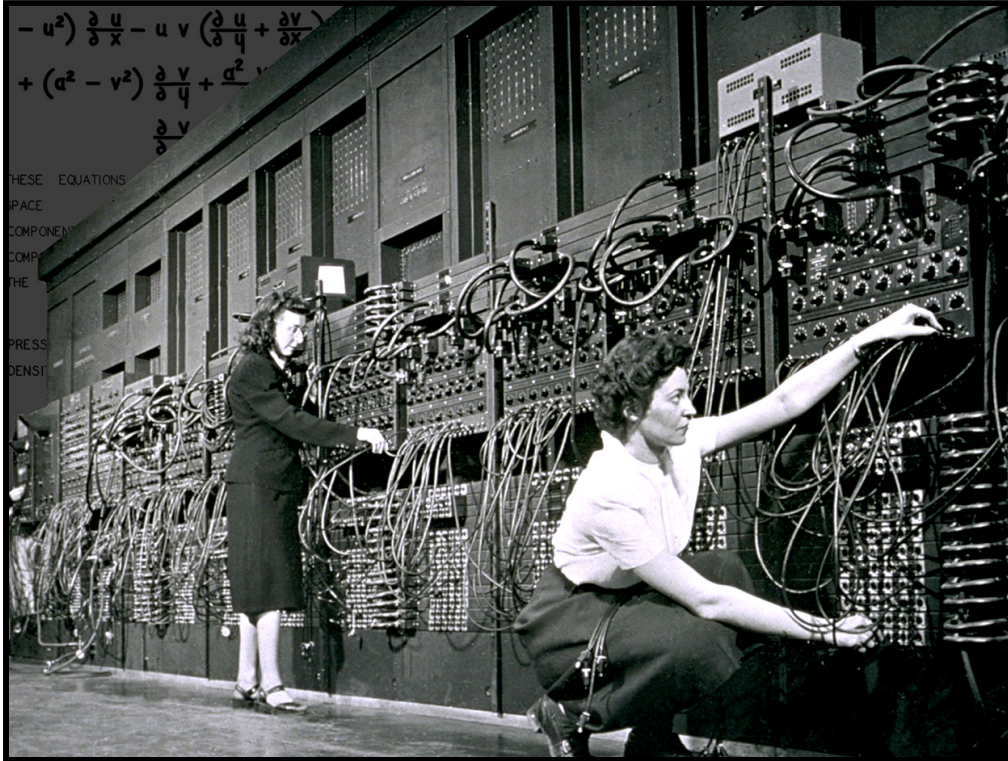
Lectures: Monday 12:20, S7

➔ <https://d3s.mff.cuni.cz/teaching/nprg075>



# History

Programming as mathematics



$$-u^2 \frac{\partial u}{\partial x} - uv \left( \frac{\partial u}{\partial y} + \frac{\partial v}{\partial x} \right) + (v^2 - u^2) \frac{\partial v}{\partial y} + \frac{\partial^2 v}{\partial x^2}$$

THESE EQUATIONS  
SPACE  
COMPONENT  
COMP  
THE  
PRESS  
DENSITY

## Programming in the late 1940s

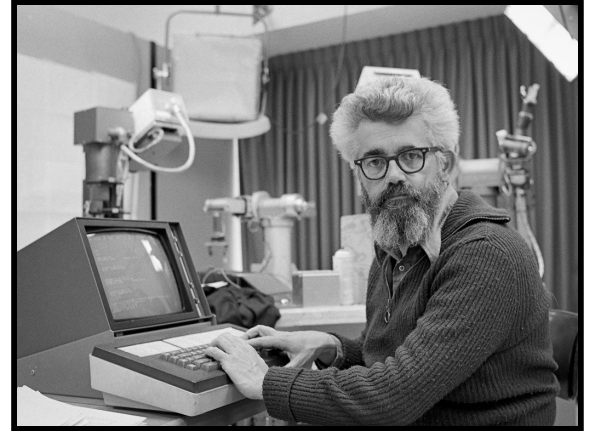
ENIAC programmed by  
plugging wires and  
flipping switches

"The ENIAC was a son-  
of-a-bitch to program" -  
Jean (Jennings) Bartik

# Mathematical science of computation

## John McCarthy (1962)

In a mathematical science, it is possible to deduce from the basic assumptions, the important properties of the entities treated by the science.



## What we want to answer

- Does transformation preserve meaning?
- Does translation procedure correctly translate?
- Do two programs compute the same function?

# Microalgot (1964)

Syntax and semantics  
of trivial Algol subset

$micro(\pi, \xi)$  gives the  
final state of a program  
 $\pi$  run in a state  $\xi$

"Description of the  
state of an Algol  
computation will clarify  
(..) compiler design"

```
value ( $\tau$ ,  $\xi$ ) = if isvar ( $\tau$ ) then c ( $\tau$ ,  $\xi$ )
else if isconst ( $\tau$ ) then val ( $\tau$ )
else if issum ( $\tau$ ) then value (addend ( $\tau$ ),  $\xi$ ) + value (augend ( $\tau$ ),  $\xi$ )
else if isdiff ( $\tau$ ) then value (subtrahend ( $\tau$ ),  $\xi$ ) - value (minuend ( $\tau$ ),  $\xi$ )
else if isprod ( $\tau$ ) then value (multiplier ( $\tau$ ),  $\xi$ ) x value (multiplicand ( $\tau$ ),  $\xi$ )
else if isquotient ( $\tau$ ) then value (numerator ( $\tau$ ),  $\xi$ )/value (denominator( $\tau$ ), $\xi$ )
else if iscond ( $\tau$ ) then (if value (proposition ( $\tau$ ),  $\xi$ ) then
value(antecedent ( $\tau$ ),  $\xi$ ) else value (consequent ( $\tau$ ),  $\xi$ ))
else if isequal ( $\tau$ ) then (value(lefteq ( $\tau$ ),  $\xi$ ) = value (righteq ( $\tau$ ),  $\xi$ ))
else if isless ( $\tau$ ) then (value (leftl ( $\tau$ ),  $\xi$ ) < value (rightl( $\tau$ ),  $\xi$ ))

micro ( $\pi$ ,  $\xi$ ) = ( $\lambda$  n .if end ( $\pi$ , n) then  $\xi$ 
else ( $\lambda$  s . if assignment (s) then
micro( $\pi$ , a(sn, n + 1, a(left(s), value (right(s), $\xi$ ), $\xi$ )))
else if goto (s) then
micro ( $\pi$ , a(sn, if value (proposition (s),  $\xi$ ) then
numb (destination (s), $\pi$ ) else n + 1,  $\xi$ )))
(statement (n, $\pi$ )) (c (sn, $\xi$ ))
```

# Formal models

What are they good for?

⌞ Make sense of tricky language features

</> Prove properties of specific programs

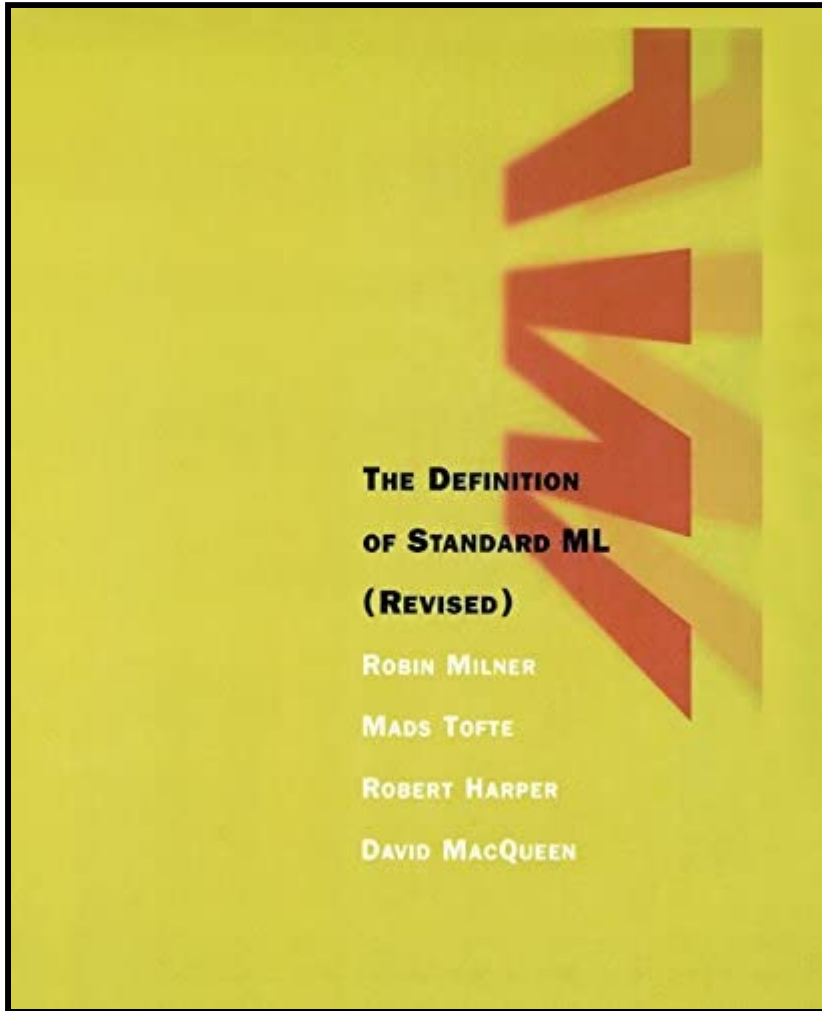
↓<sub>Σ</sub> Prove properties of the language

\*<sub>Σ</sub> Make sure type system actually prevents bugs!

# The definition of Standard ML (1990s)

Operational semantics  
and type system for a  
complete language

Even language this simple  
had murky parts!



```
// Function: 'a -> 'a list
let callLogger =
  // List: 'a list
  let mutable log = []
  fun x ->
    log <- x :: log
    log

// Can we call this with:
callLogger 10
callLogger "hi"
```

## Generalization and value restriction

ML makes top-level definitions polymorphic

Allowing that for values is unsound!



# Soundness

Surely, we know better?

- Are such problems in programming languages used today?
- [tinyurl.com/nprg075-unsound](http://tinyurl.com/nprg075-unsound)

Unexpected interactions!

- Many Java extensions formalized
- Formalizations with soundness proofs!
- This is interaction between multiple features...



# Semantics

Formal language definitions

# Language semantics types

- ☰ Axiomatic semantics  
Define rules satisfied by individual commands
- ▲ Denotational semantics  
Assign mathematical entity to each program
- ↓ Big-step operational semantics  
Describe how terms reduce to values
- Small-step operational semantics  
Evaluation as gradual rewriting of terms

# Language semantics types

denotational

axiomatic

$\llbracket e \rrbracket = ?$

$\{P\} e \{Q\}$

$\llbracket \text{let } x = e_1 \text{ in } e_2 \rrbracket =$   
 $\llbracket e_2 \rrbracket \circ \llbracket e_1 \rrbracket$

$\frac{\{P\} e_1 \{Q\} \quad \{Q\} e_2 \{R\}}{\{P\} e_1 e_2 \{R\}}$

# Language semantics types

operational - big step

$e \downarrow v$

$e \downarrow n \quad n' = n + 1$

$\text{succ}(e) \downarrow n'$

operational - small step

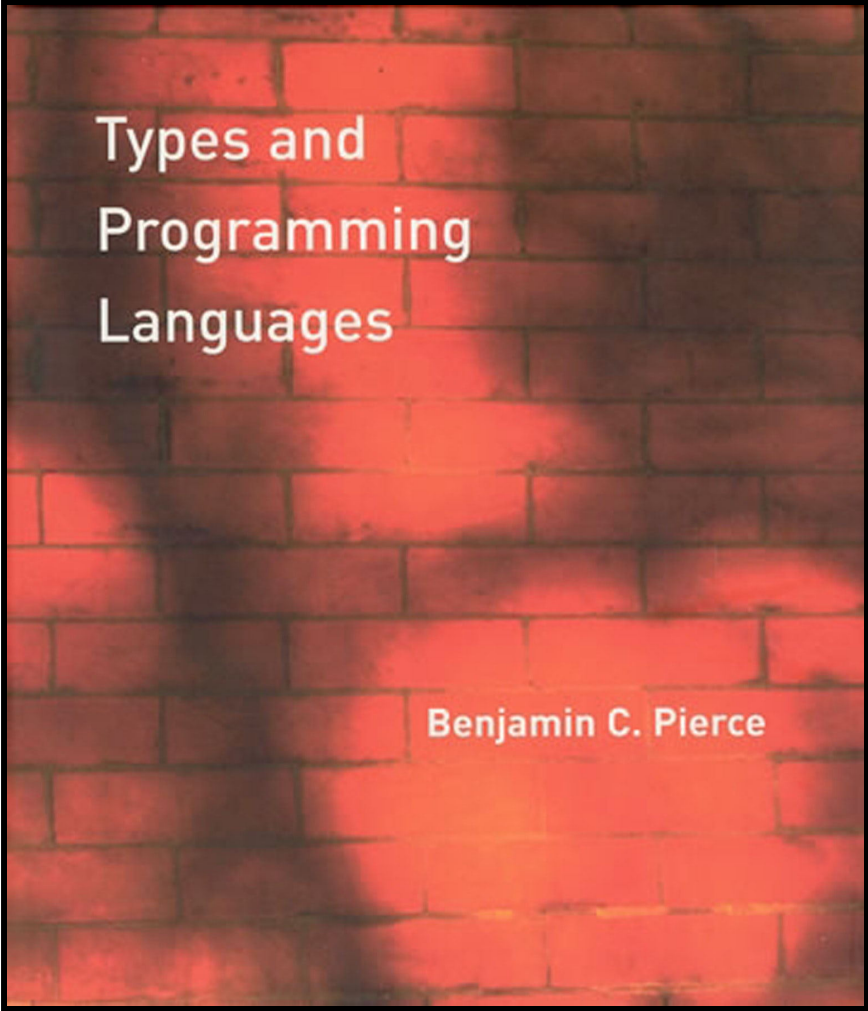
$e \rightarrow e'$

$n' = n + 1$

$\text{succ}(n) \rightarrow n'$

$e \rightarrow e'$

$\text{succ}(e) \rightarrow \text{succ}(e')$



Types and  
Programming  
Languages

Benjamin C. Pierce

## Why small-step?

Easier to write than  
axiomatic or denotational

But harder to use for  
program equivalence

Good textbook and  
popular in PL research  
community

Works for programs that  
do not terminate

# Semantics

Definition of an ML subset

# Demo

Functions and numbers in F#



# Expressions and evaluation

simple syntax

$$v := n \mid \lambda x. e$$
$$e := n \mid e + e \mid \lambda x. e \mid x \mid e e$$

evaluation example

$$(\lambda x. x + 10) (2 + 3)$$
$$\rightarrow (\lambda x. x + 10) 5$$
$$\rightarrow (5 + 10)$$
$$\rightarrow 15$$

# Evaluation rules

evaluation rules

$$\frac{n_3 = n_1 + n_2}{n_1 + n_2 \rightarrow n_3} \text{ (plus)}$$

$$\frac{e_1 \rightarrow e_1'}{e_1 e_2 \rightarrow e_1' e_2} \text{ (app1)}$$

$$\frac{e_1 \rightarrow e_1'}{e_1 + e_2 \rightarrow e_1' + e_2} \text{ (plus1)}$$

$$\frac{e_2 \rightarrow e_2'}{v_1 e_2 \rightarrow v_1 e_2'} \text{ (app2)}$$

$$\frac{e_2 \rightarrow e_2'}{v_1 + e_2 \rightarrow v_1 + e_2'} \text{ (plus2)}$$

$$\frac{}{(\lambda x. e) v \rightarrow e[x/v]} \text{ (app3)}$$

# Functions and numbers

example 1 in detail

$$\frac{5 = 2 + 3}{2 + 3 \rightarrow 5} \quad (\text{plus})$$

---

$$(\lambda x. x + 10) (2 + 3) \rightarrow (\lambda x. x + 10) 5 \quad (\text{app2})$$

---

$$(\lambda x. x + 10) 5 \rightarrow 5 + 10 \quad (\text{app3})$$

$$\frac{15 = 5 + 10}{5 + 10 \rightarrow 15} \quad (\text{plus})$$

# Functions and currying

example 2 in detail

$$\frac{(\lambda x. \lambda y. x + y) 10 \rightarrow (\lambda y. 10 + y)}{(\lambda x. \lambda y. x + y) 10 5 \rightarrow (\lambda y. 10 + y) 5} \begin{array}{l} (\text{app3}) \\ (\text{app1}) \end{array}$$

$$(\lambda y. 10 + y) 5 \xrightarrow{(\text{app3})} 10 + 5 \xrightarrow{(\text{plus})} 15$$

# Simplifying the rules

evaluation contexts

$$v := h \mid \lambda x. e$$
$$e := v \mid x \mid e + e \mid e e$$
$$C[\cdot] := \cdot \mid v + C[\cdot] \mid C[\cdot] + e \mid v C[\cdot] \mid C[\cdot] e$$
$$\frac{e \rightarrow e'}{C[e] \rightarrow C[e']} \quad (c+x)$$

# Conditionals and stuck state

extensions

$e := \dots \mid \text{if } e_1 \text{ then } e_2 \text{ else } e_3$

$C[\cdot] := \dots \mid \text{if } C[\cdot] \text{ then } e_2 \text{ else } e_3$

$n \neq 0$

$\text{if } n \text{ then } e_2 \text{ else } e_3 \rightarrow e_2$

$n = 0$

$\text{if } n \text{ then } e_2 \text{ else } e_3 \rightarrow e_3$

why types?

stuck!

$\text{if } (\lambda x. x) \text{ then } 1 \text{ else } 2 \rightarrow$

# Adding references

references

$e := \dots \mid !l \mid l := e$

$C[\cdot] := \dots \mid l := C[\cdot]$

$l \in \mathbb{L}$

$s \in \mathbb{L} \rightarrow \mathbb{V}$

$v \in \mathbb{V}$

$\langle e, s \rangle \rightarrow \langle e', s' \rangle$

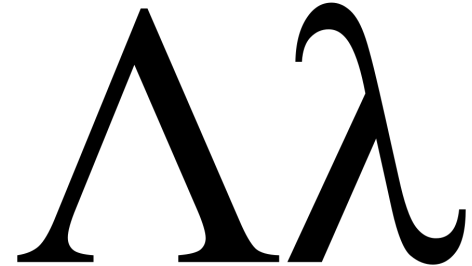
$\frac{s(l) = v}{\langle !l, s \rangle \rightarrow \langle v, s \rangle}$  (get)

$s'(l') = \begin{cases} v & \text{when } l' = l \\ s(l') & \text{otherwise} \end{cases}$   
 $\frac{}{\langle l := v, s \rangle \rightarrow \langle v, s' \rangle}$  (set)

# What did we learn?

## Interesting aspects

- Evaluation order of sub-expressions
- Laziness of conditional expressions
- What needs to be in the state



## Interesting things left out

- Data structures: records, unions, lists
- Language features: recursion, exceptions
- Hard things: Concurrency, input and output



# ReactiveX

Programming with observables

# Functional reactive programming

## Classic functional style

- Functional reactive animations (1990s)
- Composing *behaviours* and *events*
- Revised in the Elm programming style



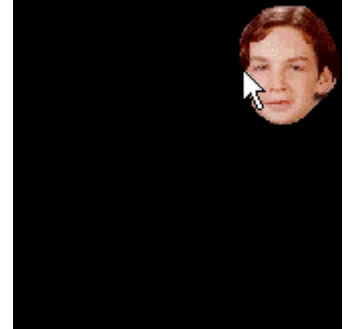
## Observables and events

- Events that occur and produce values
- Mouse moves, server notifications, user inputs, ...
- Transformed using a range of *operators*

# Functional reactive programming

## Reactive animations (Elliott, 1997)

```
followMouseAndDelay u =  
  follow `over` later 1 follow  
  where  
    follow = move (mouseMotion u) jake
```



## How does it work

- **mouseMotion** represents current mouse position
- **later** delays time by X seconds
- **over** overlays multiple animations

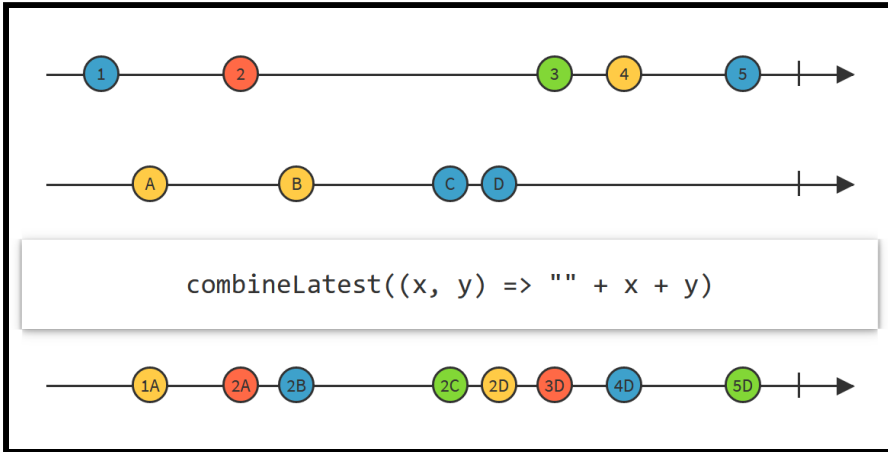
# Reactive eXtensions

Events represented by

**Observable<T>**

Produces values when  
something happen

Operators turn one or more  
observables into a new one



**Demo**

Programming with RxJS

# Semantics

Formalizing observables

# Minimal language with events

syntax

$$e := x \mid n \mid [n_1, \dots, n] \mid e:e \mid \varepsilon!e \mid \varepsilon \leftarrow x.x.e \mid e;e$$
$$v := n \mid [n_1, \dots, n]$$
$$C[\cdot] := C[\cdot]:e \mid v:C[\cdot] \mid \varepsilon!C[\cdot] \mid C[\cdot];e$$

# Demo

Lists and sequencing in F#



# Modelling concurrency

environment

$\langle e_1 | e_2 | \dots | e_n \rangle, \{ \varepsilon_1 \mapsto \lambda v_1. e_1, \dots \}$

# Triggering events

evaluation example

$\langle \lambda \leftarrow (\lambda v. \varepsilon!0:v; \varepsilon!1:v); \varepsilon![] \rangle, \{\} \rightarrow$

$\langle \varepsilon![] \rangle, \{ \lambda \leftarrow (\lambda v. \varepsilon!0:v; \varepsilon!1:v) \} \rightarrow$

$\langle \varepsilon!0:[]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow$

$\langle \varepsilon![]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow$

$\langle [], \varepsilon!1:[] \mid \varepsilon!0:[]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow$

$\langle \varepsilon!1:[] \mid \varepsilon!0:[]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow$

$\langle \varepsilon![] \mid \varepsilon!0:[]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow$

$\langle [] \mid \varepsilon!0:[]; \varepsilon!1:[] \rangle$

$\mid \varepsilon!0:[]; \varepsilon!1:[] \rangle, \{\dots\} \rightarrow (\dots)$

# Lists, sequencing and steps

evaluation rules

$$\frac{}{n: [n_1, \dots, n_k] \rightarrow [n, n_1, \dots, n_k]} \text{ (cons)}$$

$$\frac{}{[]_i e \rightarrow e} \text{ (seq)}$$

$$\frac{e_i \rightarrow e_i'}{\langle e_1 \mid \dots \mid e_n \rangle, H \rightarrow \langle e_i' \mid \dots \mid e_n \rangle, H} \text{ (step)}$$

$$\frac{}{\langle [] \mid e_1 \mid \dots \mid e_n \rangle, H \rightarrow \langle e_1 \mid \dots \mid e_n \rangle, H} \text{ (done)}$$

# Rules for event handlers

evaluating events

$$\frac{\varepsilon \mapsto \lambda x. e \in H}{\langle C[\varepsilon!v] | \bar{e} \rangle, H \rightarrow \langle C[C] | \bar{e} | e[x/v] \rangle, H} \text{ (trigger)}$$

$$\frac{H' = H \cup \{\varepsilon \mapsto \lambda x. e\}}{\langle C[\varepsilon \leftarrow \lambda x. e], \bar{e} \rangle, H \rightarrow \langle C[C], \bar{e} \rangle, H'} \text{ (add)}$$

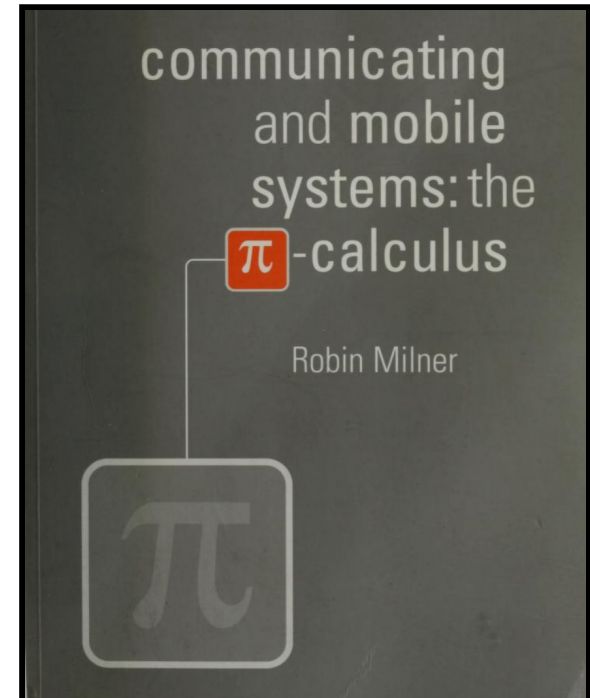
# Events calculus

## Focus on what matters

- Lists, numbers and events only
- No functions or recursion!
- Probably still Turing-complete

## What did we learn

- Sequence of concurrent expressions
- Selection of expression to be run
- Scheduling when event is triggered



# Alternative rules

alternatives

$$\frac{\varepsilon \mapsto \lambda x. e \in H}{\langle C[\varepsilon!v] | \bar{e} \rangle, H \rightarrow \langle C[C] | \bar{e} | e[x/v] \rangle, H} \quad (\text{queue})$$

$$\frac{\varepsilon \mapsto \lambda x. e \in H}{\langle C[\varepsilon!v] | \bar{e} \rangle, H \rightarrow \langle e[x/v] | C[C] | \bar{e} \rangle, H} \quad (\text{immediate})$$

$$\frac{\varepsilon \mapsto \lambda x. e \in H}{\langle \bar{e} | C[\varepsilon!v] | \bar{e}' \rangle, H \rightarrow \langle \bar{e} | C[C] | \bar{e}' | e[x/v] \rangle, H} \quad (\text{nondet})$$

# Conclusions

Formal models

## Formal models

Useful design guide and for making formal claims

Explains core ideas of a system in a succinct way

The danger is producing languages that look well on paper!

### Evaluation

Performance evaluation  
User experiments  
Case studies  
Expert evaluation  
Formalism and proof  
Qualitative user studies



### Requirements and Creation

Interviews  
Corpus studies  
Natural Programming  
Rapid Prototyping

**Figure 1.** A typical design process



# Language semantics types

- ≠ Lambda calculus  
Logic (1930s) but used for PL semantics (1960s+)
- 🔗 Pi calculus, CCS and CSP  
Models of concurrent systems (1980s-90s)
- 📦 Join calculus  
Distributed asynchronous programming (1990s)
- 🔒 Programming language theory  
Memory regions, effects and coeffects, locks, etc.

# Reading

## Null safety in Dart

- Avoiding **null** dereferencing with types
- Available at: <https://dart.dev/null-safety/understanding-null-safety>

## Why read this

- Simple useful type system feature!
- Good discussion on soundness
- More languages have this: Swift, Rust, C#, TypeScript



# Conclusions

## Formal models of programming

- Programming language theory, Part I
- Evaluation over syntactic structures
- Better for small and stateless systems

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