

Functional Programming is Everywhere



Ilya Sergey

ilyasergey.net

YaleNUSCollege



PLMW @ ICFP 2019

About myself

MSc Saint Petersburg State University, 2008

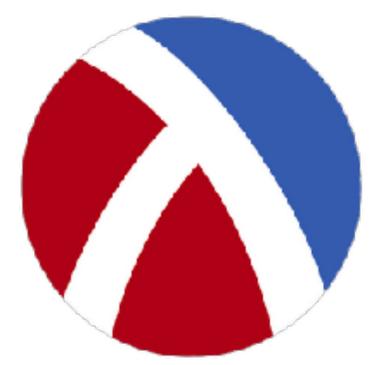
PhD KU Leuven, 2008-2012

Currently Associate Professor (tenure-track) at Yale-NUS College & NUS

Previously Lecturer → Associate Professor at University College London
Postdoc at IMDEA Software Institute
Software Engineer at JetBrains

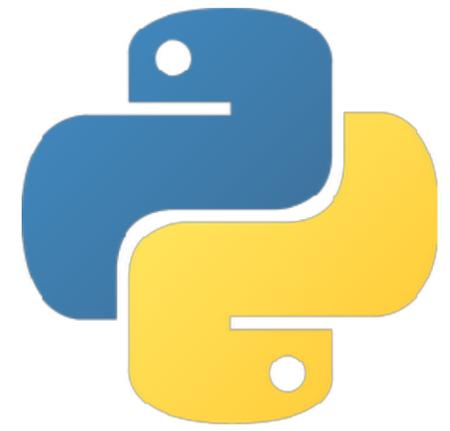
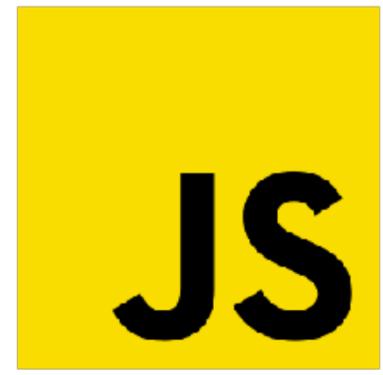
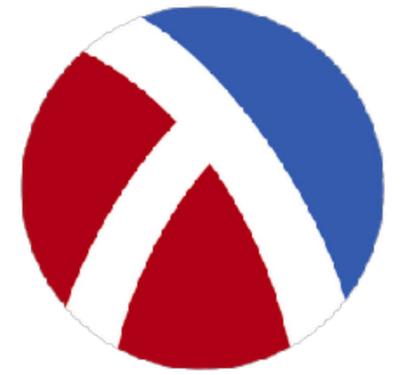
Functional programmer since 2005

Functional programmer since 2005



2005 2006 2007 2008 2010 2011

Functional Languages



The Essence of Functional Languages

- Higher-order functions and closures
- Types and Type Inference
- Polymorphism
- Laziness
- Point-free style
- Combinator Libraries
- Purely functional data structures
- Algebraic Data Types
- Pattern Matching
- Folds
- Continuations and CPS
- Structural Recursion
- Type Classes
- Monads

[Check out this year's ICFP program...](#)

This Talk

Functional Programming

This Talk

Functional Programming

This Talk

Functional Programming Ideas

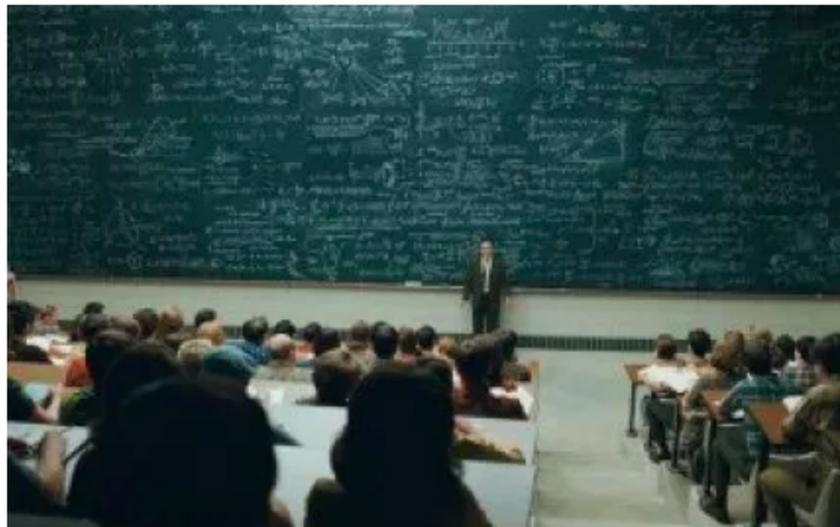


Functional Programming Ideas in...

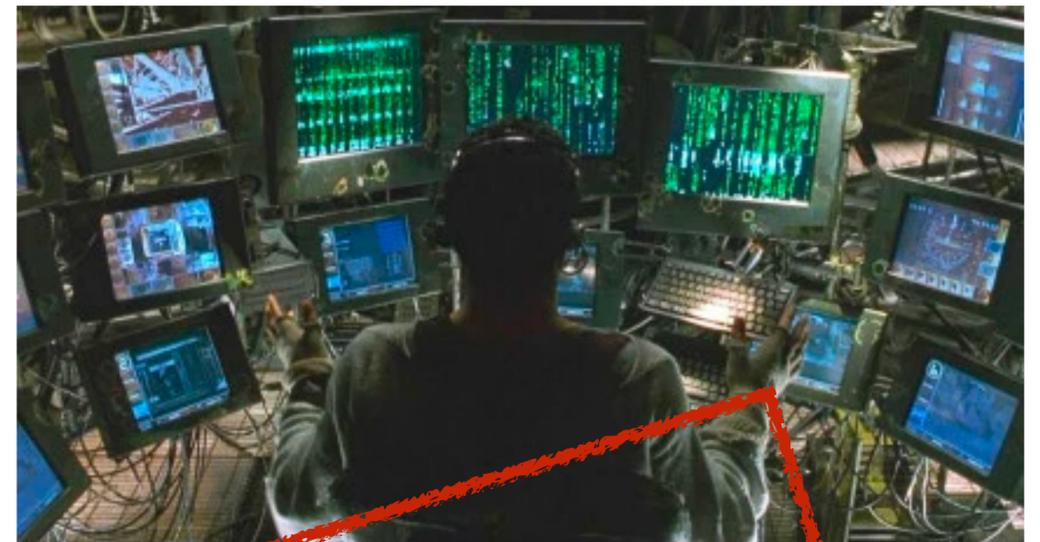
Research



Teaching



Software Engineering



Disclaimer:
personal experience

Functional Programming Ideas in...

Research



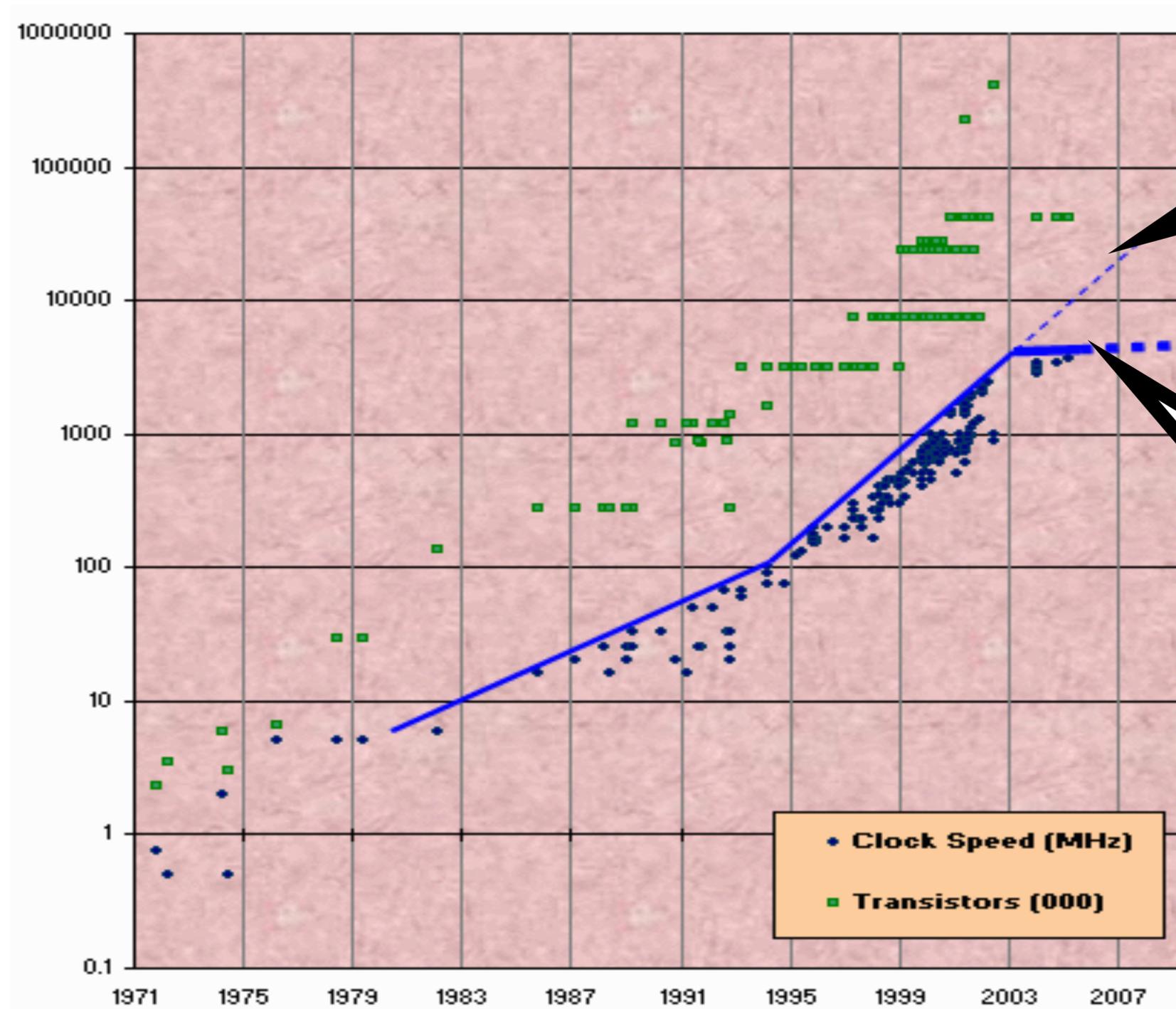
Teaching



Software Engineering



Moore's Law

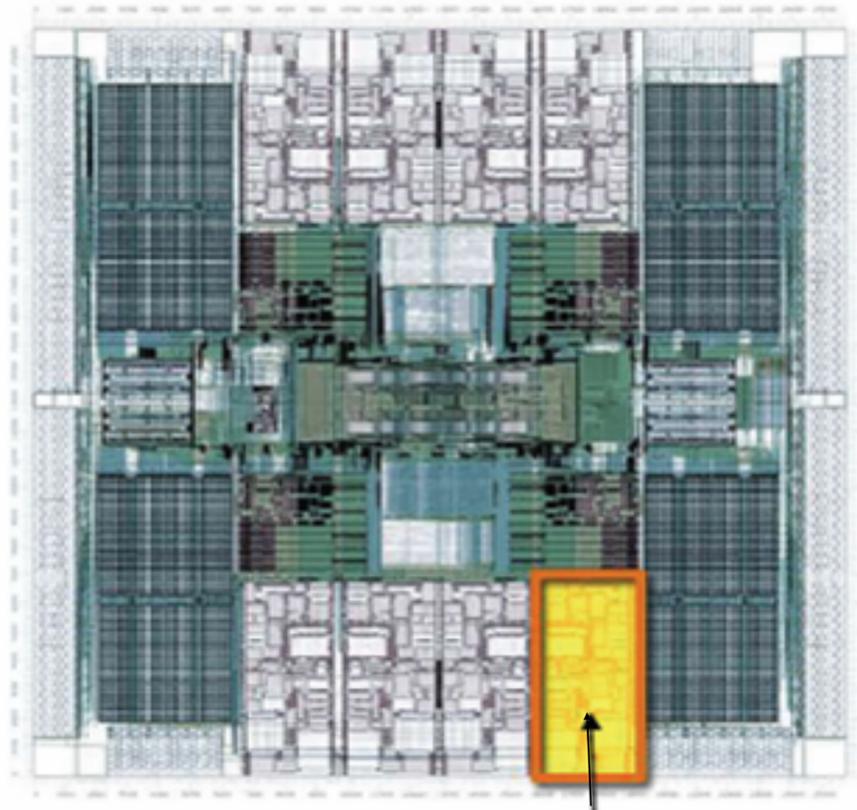


Transistor
count still
rising

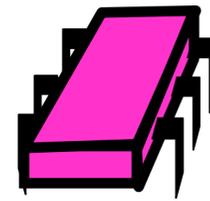
Clock
speed
flattening
sharply

The Multicore Processor

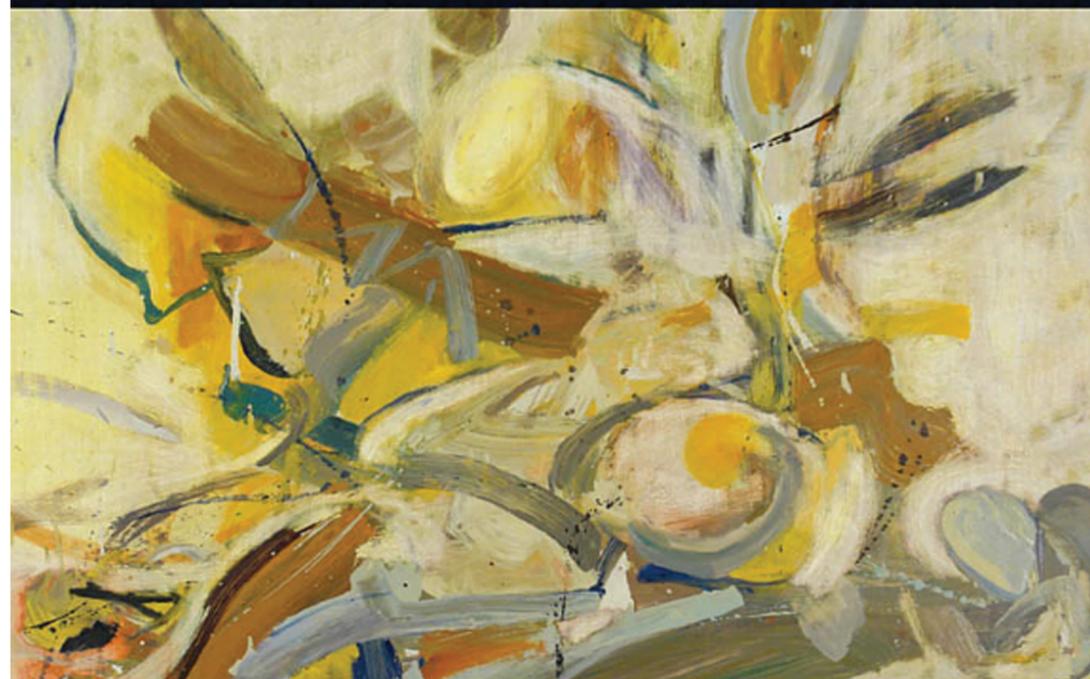
**All on the
same chip**



**Sun
T2000
Niagara**



THE ART
of
MULTIPROCESSOR
PROGRAMMING



Maurice Herlihy & Nir Shavit



Specifications for Concurrent Data Structures

My research agenda since 2014

Reusable Specifications for Concurrent Data Structures

Abstract Specifications of a Stack

$\{ S = xs \}$ **push** **x** $\{ S' = x :: xs \}$

$\{ S = xs \}$ **pop** () $\{$
 $res = \perp \wedge S = Nil$
 $\vee \exists x, xs'. res = x \wedge$
 $xs = x :: xs' \wedge S' = xs' \}$

Breaks composition in the presence of thread interference.

{ S = Nil }

y := pop() ;

{ y = ??? }

$\{ S = \text{Nil} \}$

$y := \text{pop}();$

$\{ y \in \{\perp\} \cup \{1, 2\} \}$

$\text{push } 1;$

$\text{push } 2;$

`y := pop();`

$\{y \in \{\perp\} \cup \{1, 2, 3\}\}$

$\{S = \text{Nil}\}$

`push 1;`

`push 2;`

`push 3;`

No proof reuse
(not thread-modular)

A reusable specification for pop?

{ S = Nil }

y := pop () ;

{ y = ??? }

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The Essence of Functional Languages

- Higher-order functions and closures
- Types and Type Inference
- Polymorphism

• Laziness

• Point-free style

• Combinator Libraries

• Purely functional data structures

• Algebraic Data Types

• Pattern Matching

• Folds

• Continuations and CPS

Enablers for Modular Development

• Type Classes

• Monads

Idea: Interference-*Parameterised* Specifications

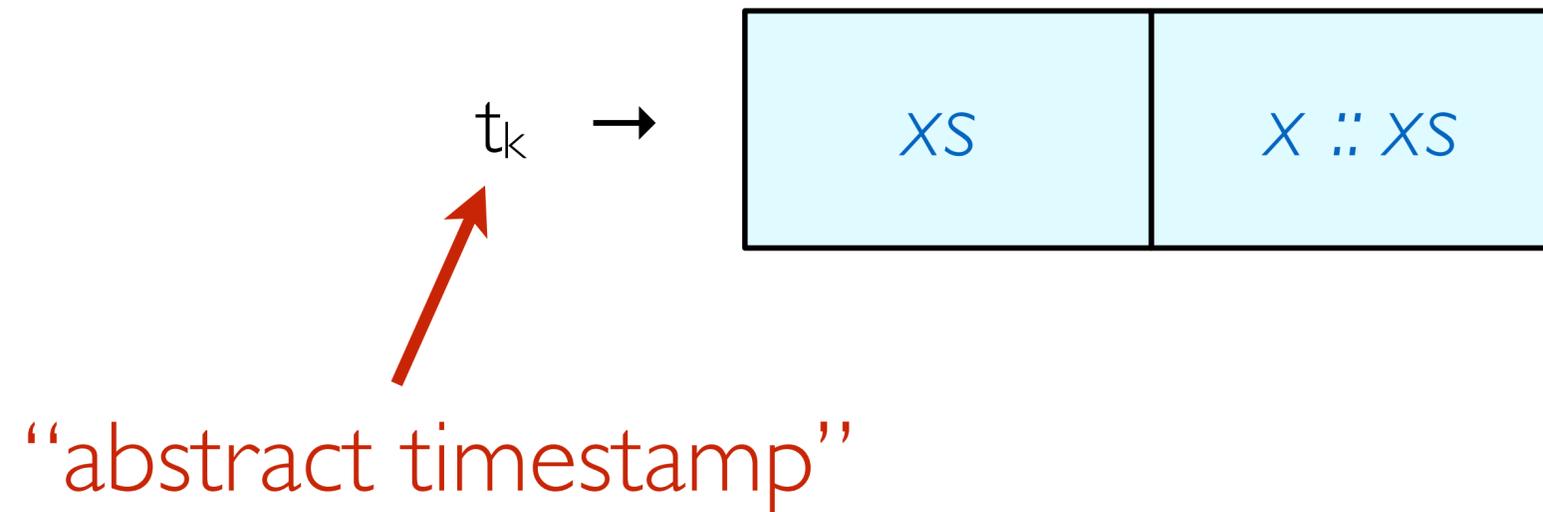
Capture the effect of *self-thread*,
parametrise over the effect of *others*.

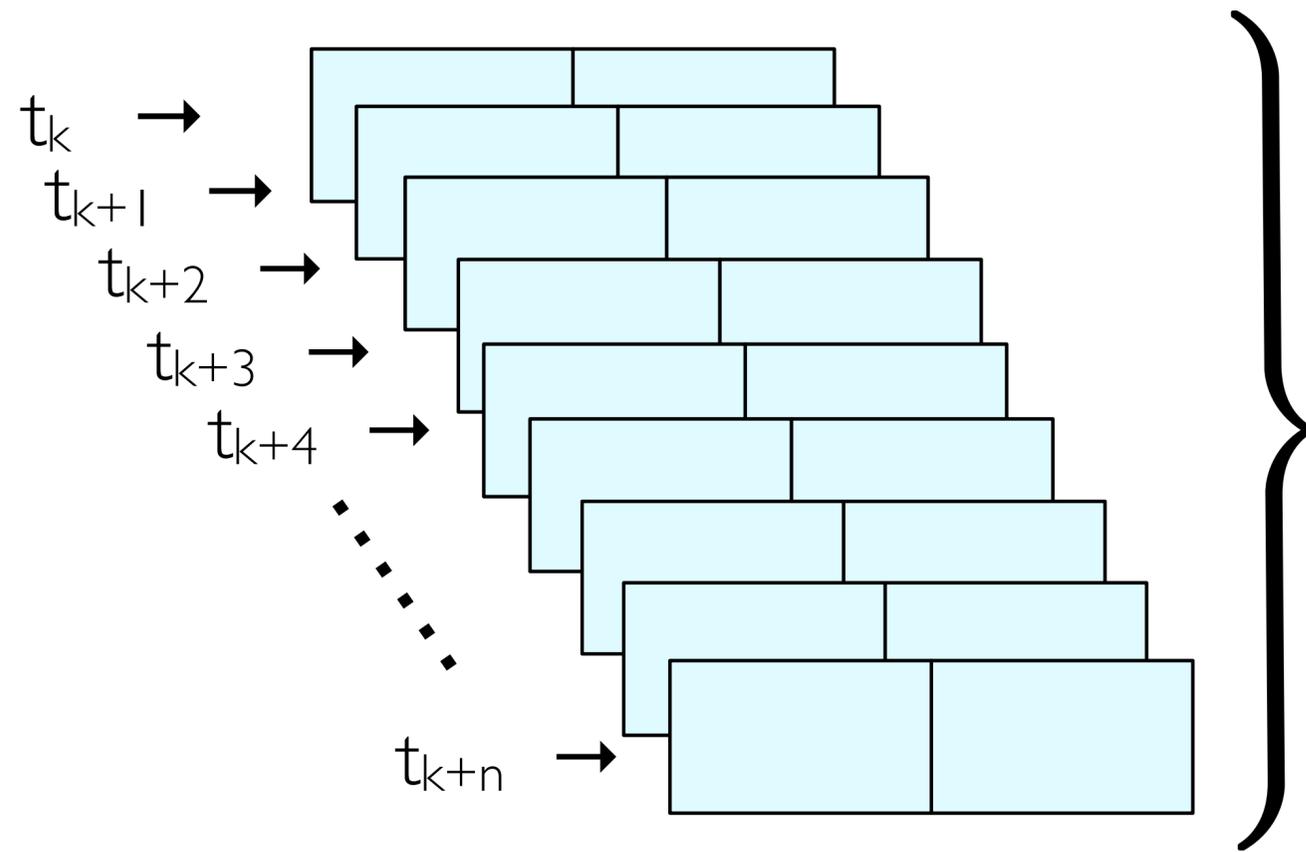
(aka Subjective specifications)

Atomic stack specifications

$\{ S = xs \}$ **push** **x** $\{ S' = x :: xs \}$

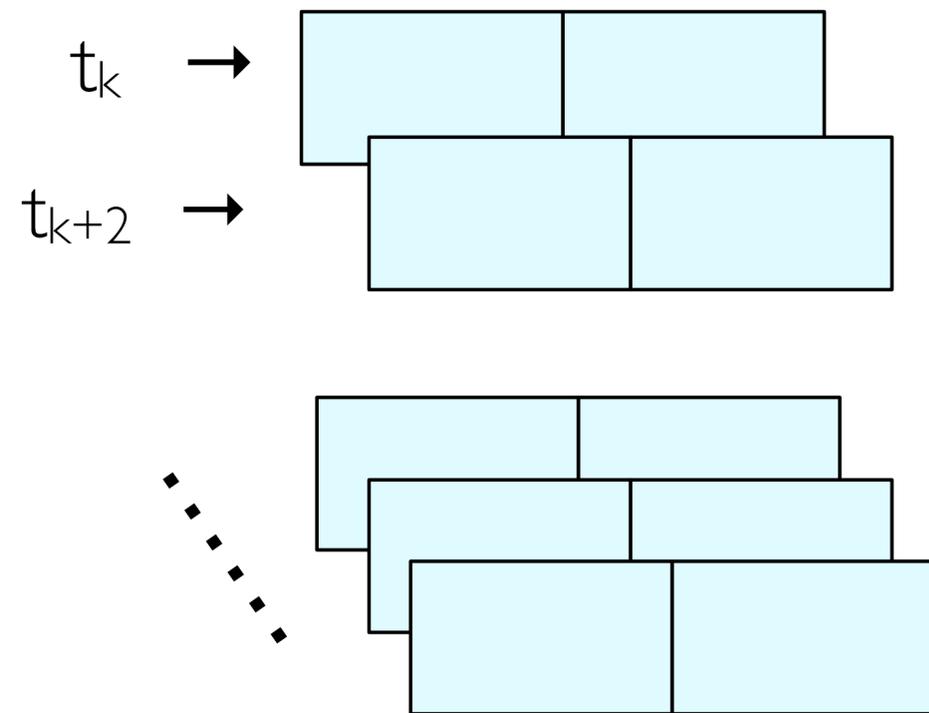
Atomic stack specifications



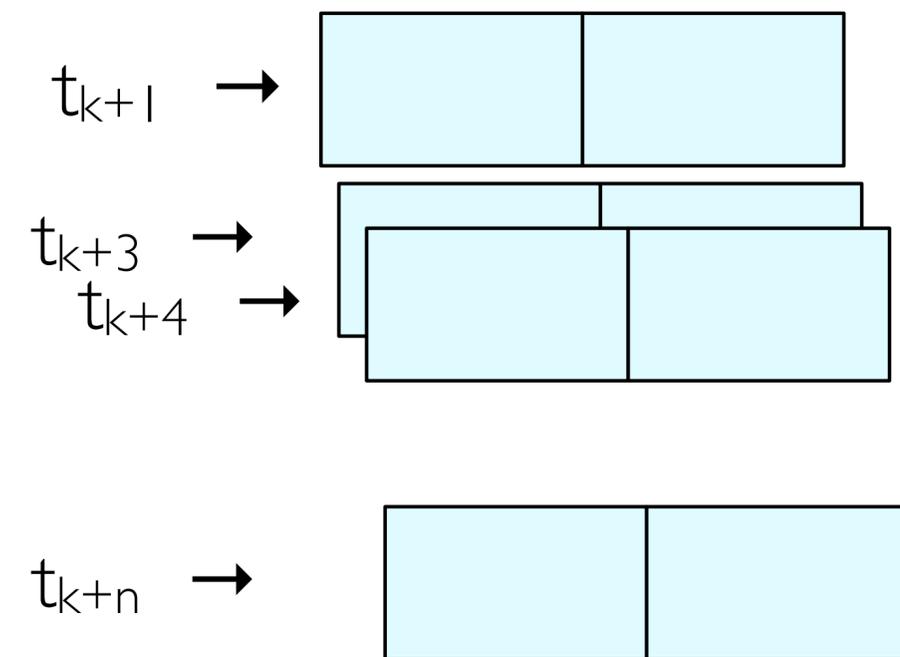


abstract time increases at every concrete push/pop operation

Changes by *this* thread



Changes by *other* threads



Subjective stack specifications

Sergey, Nanevski, Banerjee [ESOP'15]

- H_s — “ghost history” of my **pushes/pops** to the stack
- H_o — “ghost history” of **pushes/pops** by all other threads

$\{ H_s = \emptyset \}$

y := pop();

$\{ y = \perp \vee y = v, \text{ where } v \in \underbrace{\text{pushed}(H_o)} \}$

$\lambda H_o . \text{pick}(\text{pushed}(H_o))$

what I popped depends
on what the others have pushed

{ S = Nil }

y := pop();

push 1;

push 2;

push 3;

$\{ H_s = \emptyset \}$

push 1;

$\{ H_s = t_1 \mapsto (x_s, \mathbf{1}::x_s) \}$

push 2;

$\{ H_s = t_1 \mapsto (x_s, \mathbf{1}::x_s) \oplus t_2 \mapsto (y_s, \mathbf{2}::y_s) \}$

$\{ H_s = \emptyset \}$

push 1;

$\{ H_s = t_1 \mapsto (xs, \mathbf{1}::xs) \}$

push 2;

$\{ H_s = t_1 \mapsto (xs, \mathbf{1}::xs) \oplus t_2 \mapsto (ys, \mathbf{2}::ys) \}$

$\{ H_s = \emptyset \}$

push 1;

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$\{ H_s = t_1 \mapsto (x_s, \mathbf{1}::x_s) \oplus t_2 \mapsto (y_s, \mathbf{2}::y_s) \}$



$\{ H_s = \emptyset \}$

push 3;

$\{ H_s = t_3 \mapsto (z_s, \mathbf{3}::z_s) \}$

$\{ H_s = \emptyset \}$
 $y := \text{pop}();$
 $\{ y \in \{\perp\} \cup \text{pushed}(H_o) \}$

$\{ H_s = \emptyset \}$
 $\text{push } 1;$
 $\text{push } 2;$
 $\{ H_s = t_1 \mapsto (x_s, \mathbf{1}::x_s) \oplus$
 $t_2 \mapsto (y_s, \mathbf{2}::y_s) \}$

$\{ H_s = \emptyset \}$
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 $\{ H_s = t_3 \mapsto (z_s, \underline{3}::z_s) \}$

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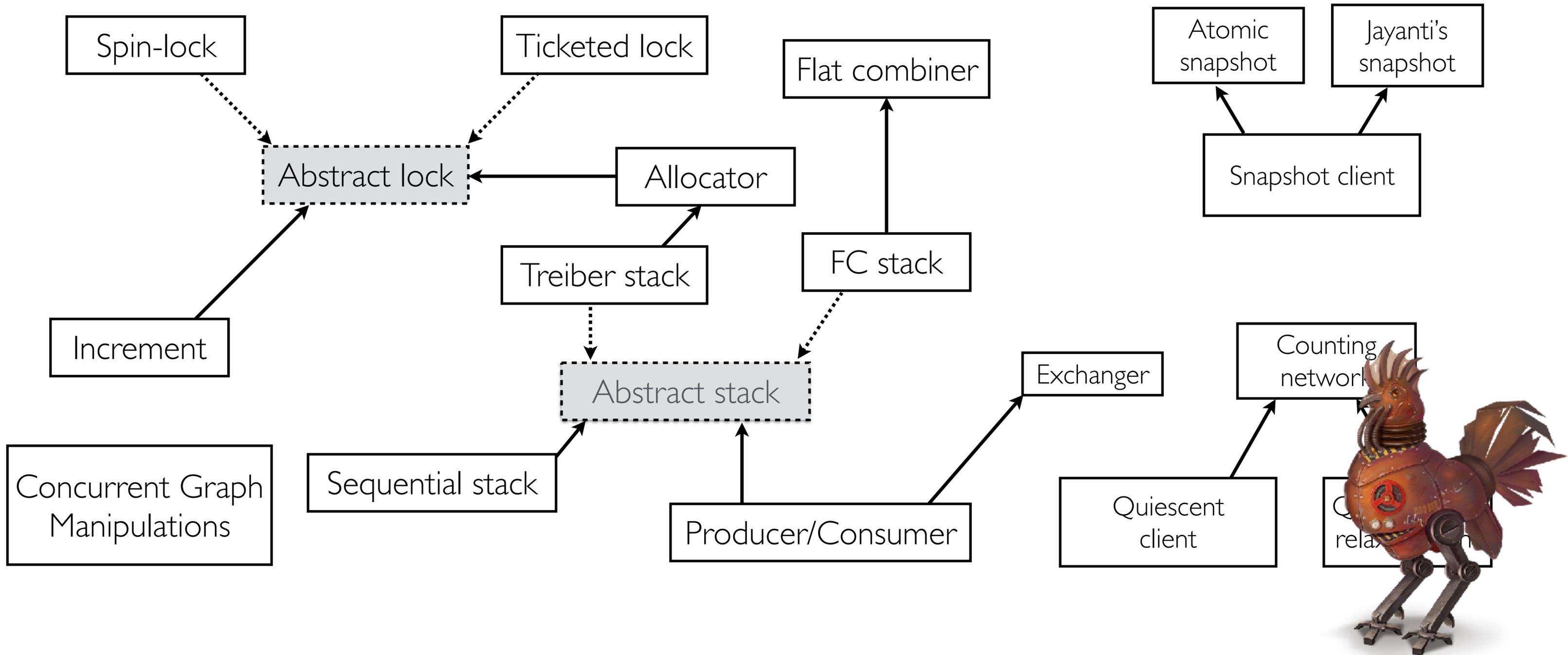
$\{ H_s = \emptyset \}$

push 3;

$\{ H_s = t_3 \mapsto (z_s, \mathbf{3}::z_s) \}$

Payoff: Verified Concurrent Libraries

Sergey et al. [PLDI'15]



Functional Programming Ideas in...

Research



Teaching



Software Engineering



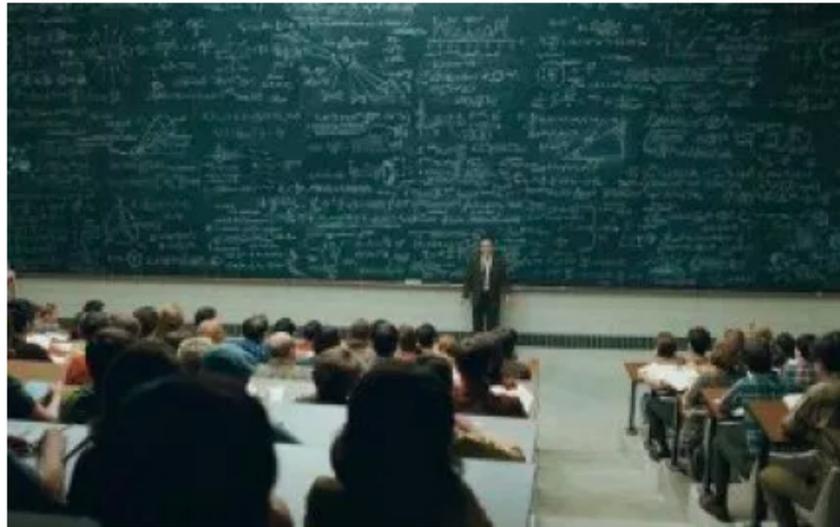
... for modularity and proof reuse

Functional Programming Ideas in...

Research



Teaching



Software Engineering



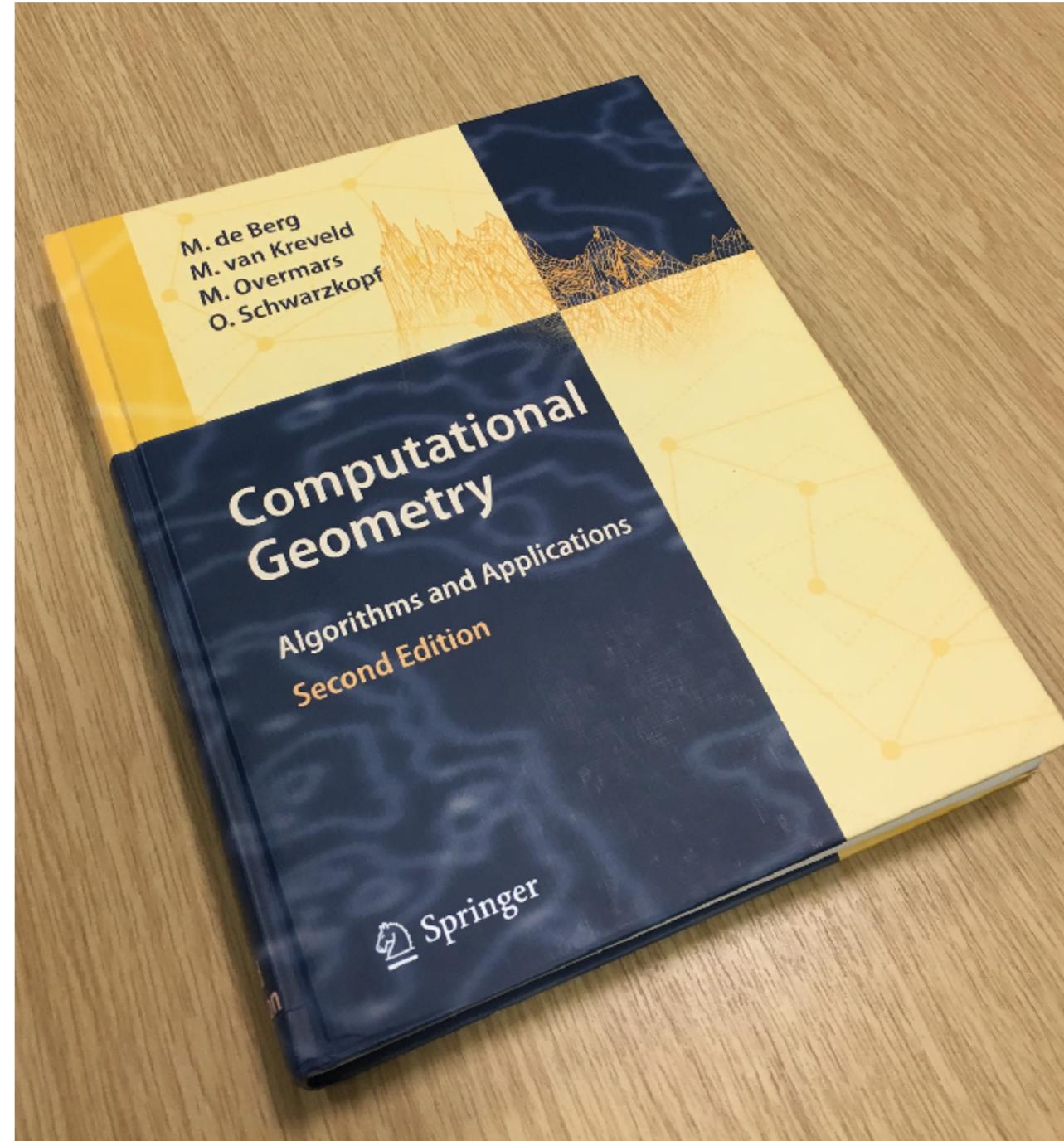
... for Modularity and Proof Reuse

Algorithmic Competitions at UCL (2016-2018)

- Targeting *2nd year* undergrads, team work
- One week-long
- Should involve *math* and *programming*
- *Challenging* for students, but *easy to assess*



Algorithmic Competitions at UCL (2016-2018)



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Introduction	
1.1 An Example: Convex Hulls	
1.2 Degeneracies and Robustness	
1.3 Application Domains	
1.4 Notes and Comments	
1.5 Exercises	
2 Line Segment Intersection	
Thematic Map Overlay	
2.1 Line Segment Intersection	
2.2 The Doubly-Connected Edge List	
2.3 Computing the Overlay of Two Subdivisions	
2.4 Boolean Operations	
2.5 Notes and Comments	
2.6 Exercises	
3 Polygon Triangulation	
Guarding an Art Gallery	
3.1 Guarding and Triangulations	
3.2 Partitioning a Polygon into Monotone Pieces	
3.3 Triangulating a Monotone Polygon	
3.4 Notes and Comments	
3.5 Exercises	
4 Linear Programming	
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The Competitions

- 2016: Art Gallery Competition
- 2017: Move-and-Tag Competition
- 2018: Room Furnishing

Art Gallery Competition

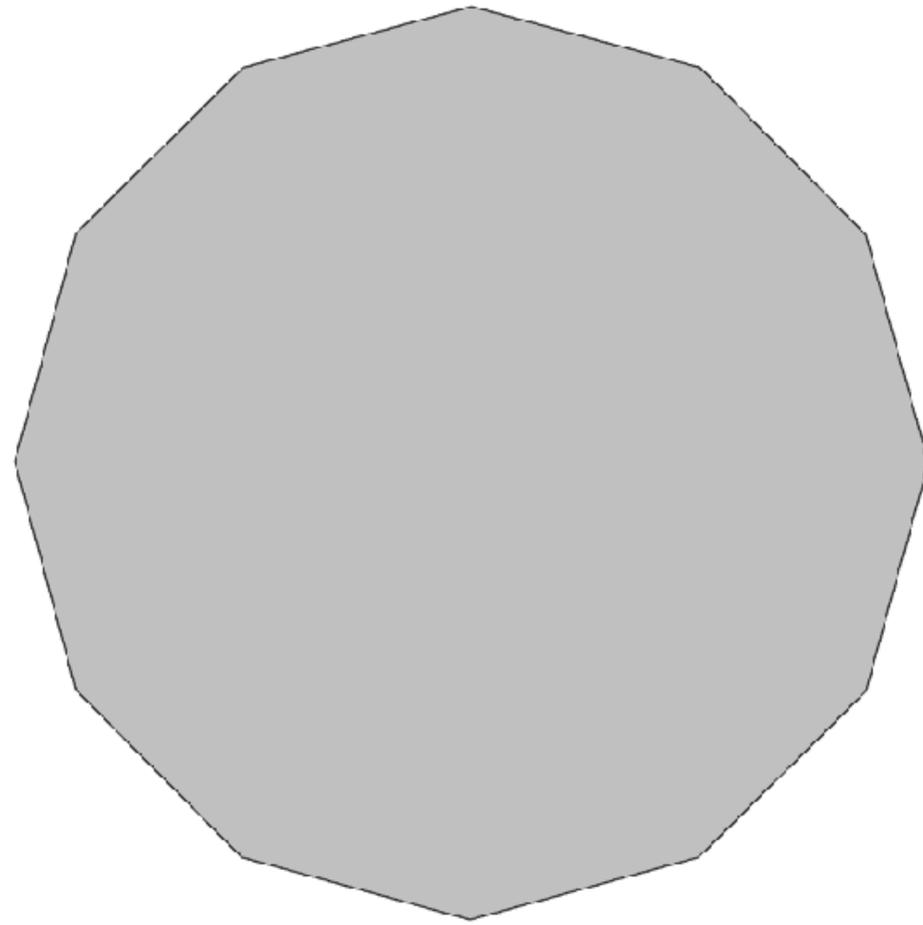
based on:

Chvátal's *Art Gallery Problem* (1975)



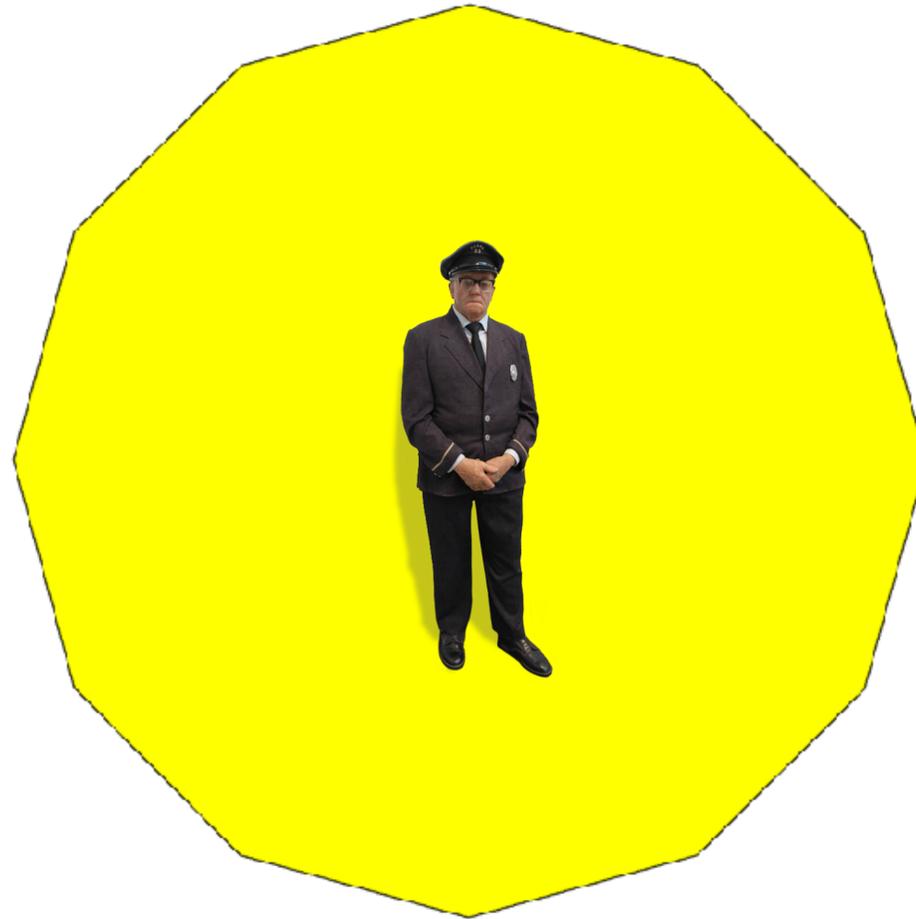
How many guards do we really need?

The answer depends on the shape of the gallery.

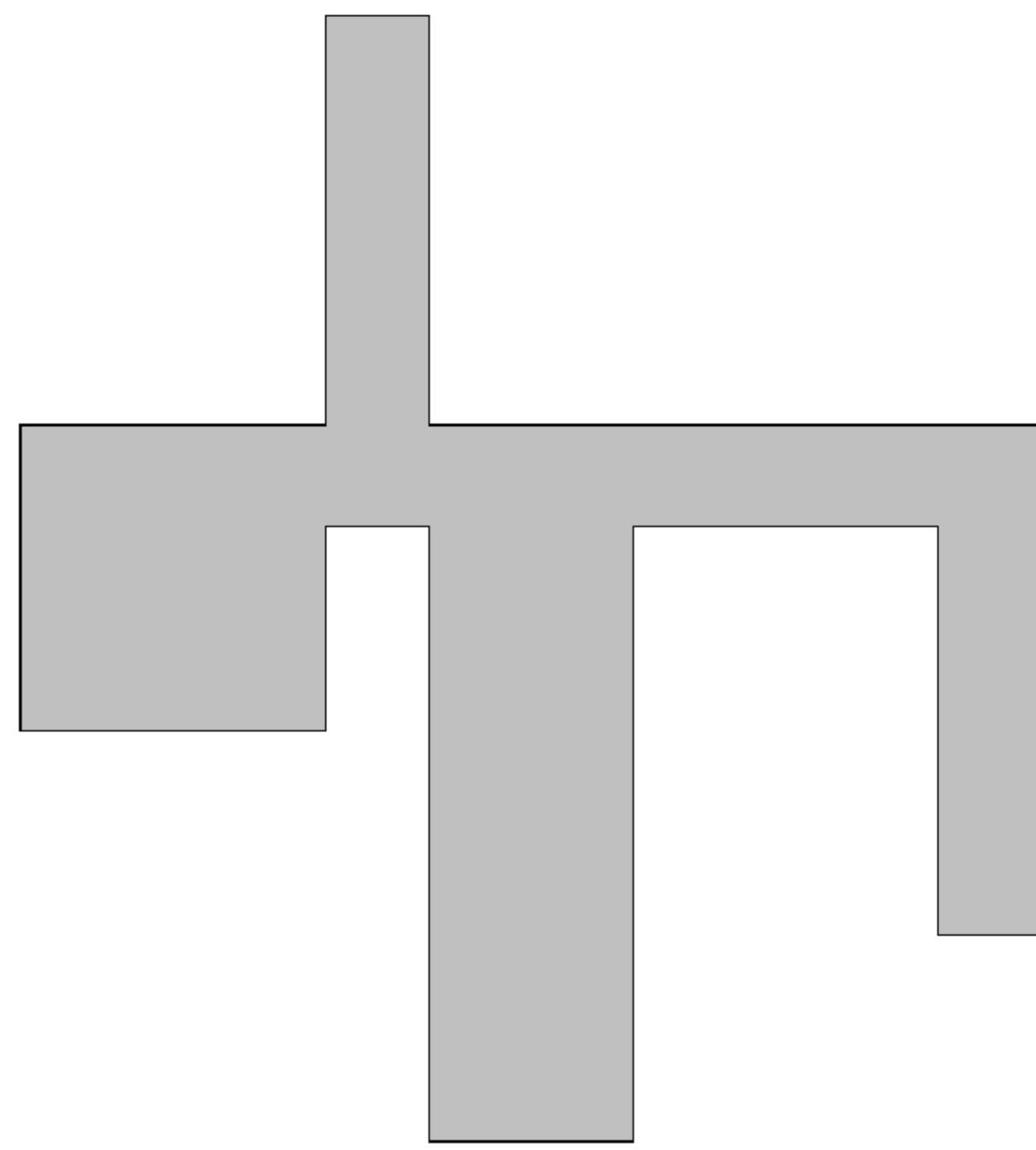


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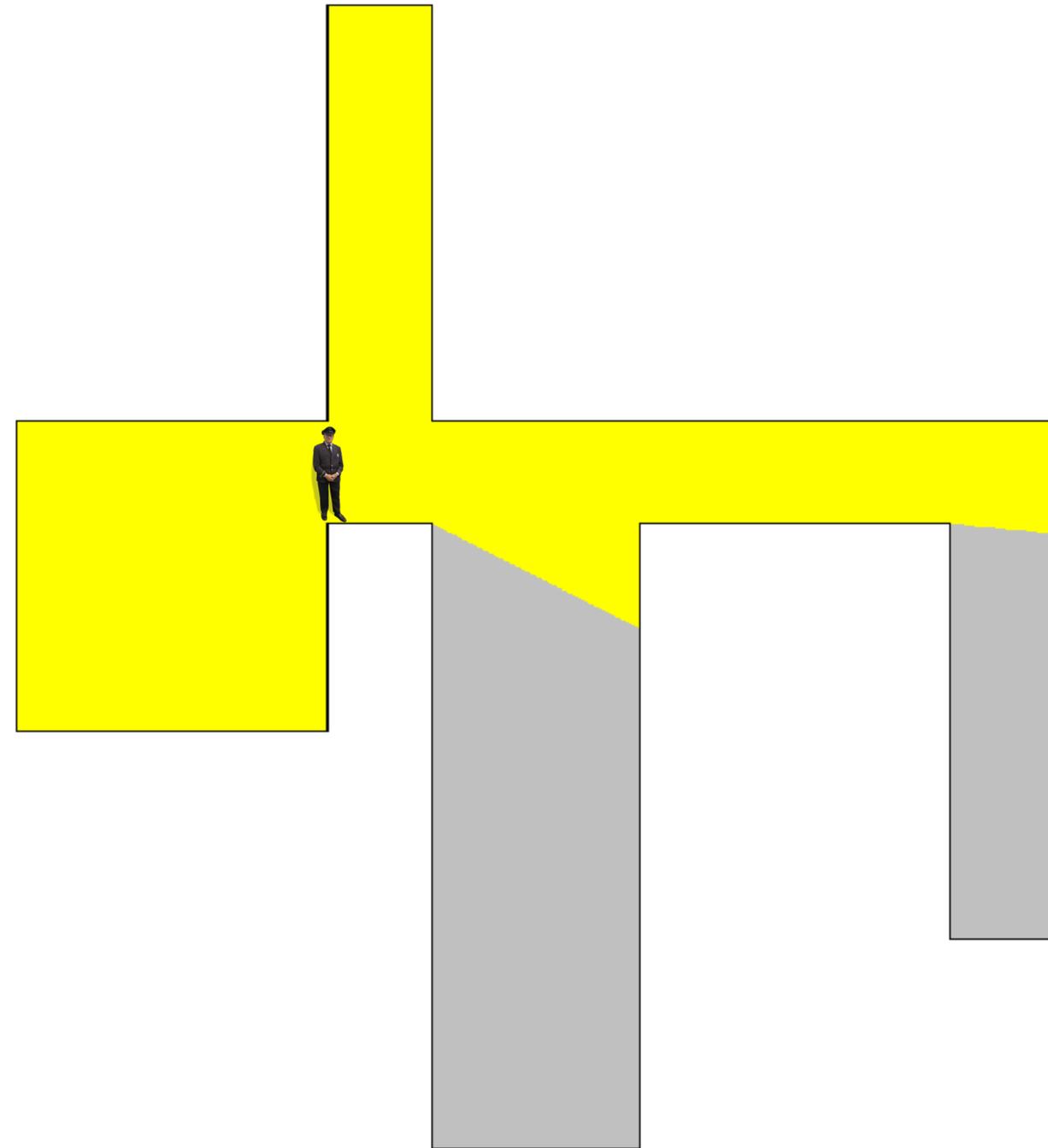
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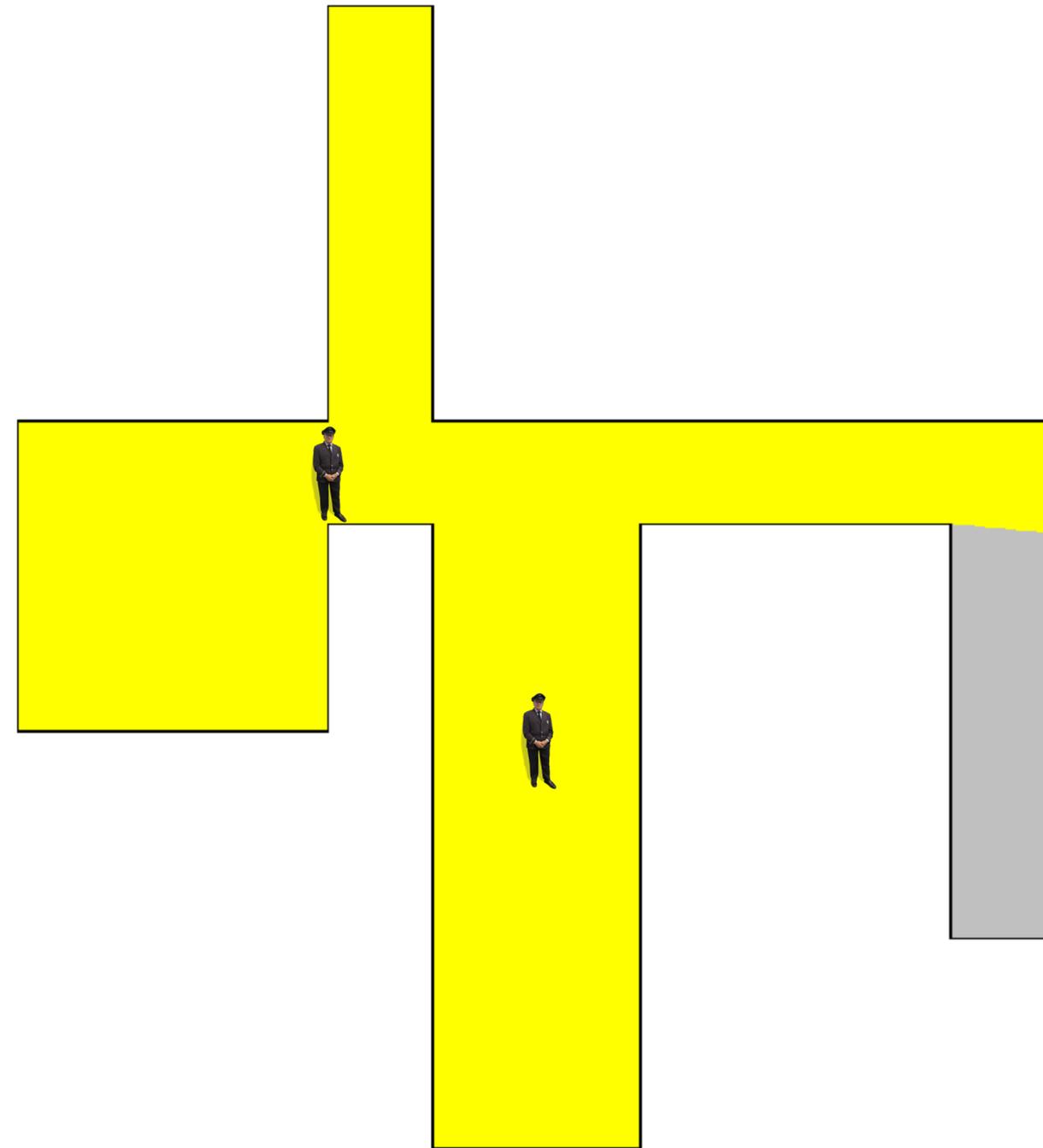
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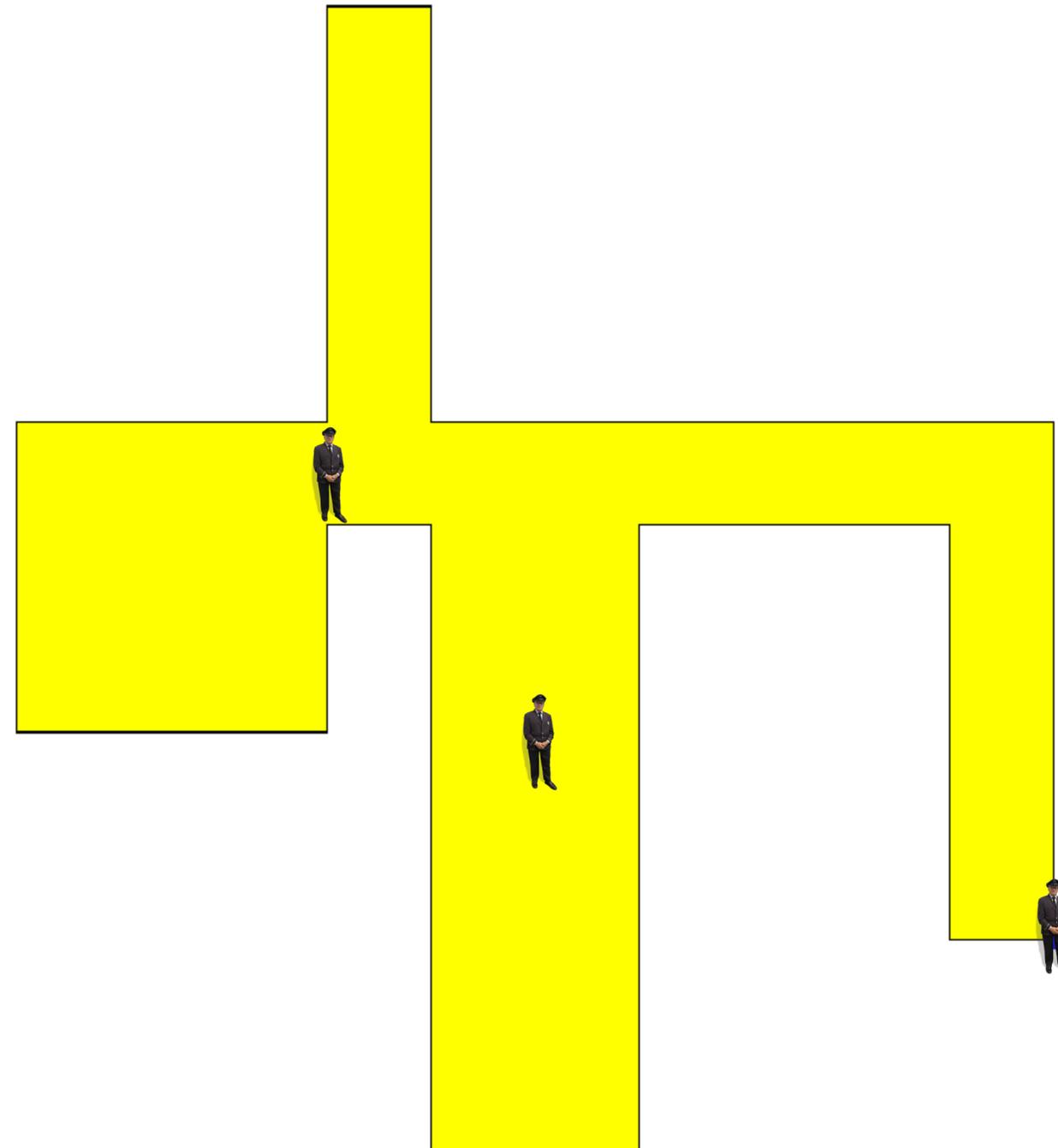
How many guards do we really need?



How many guards do we really need?



How many guards do we really need?

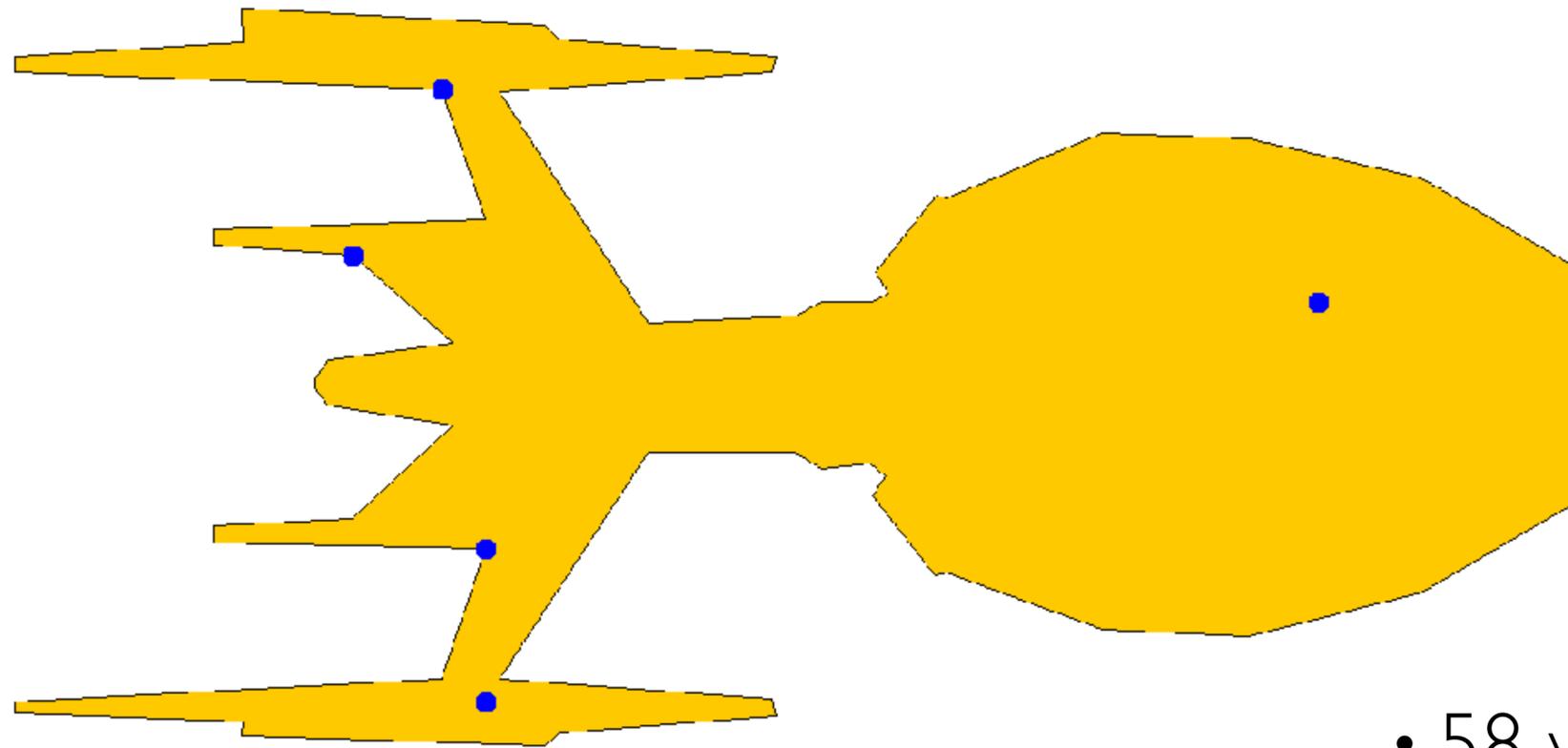


Art Gallery Problem

For a given gallery (polygon),
find the *minimal* set of guards' positions,
so together the guards can “see” the *whole* interior.

Project: *Art Gallery Competition*

Find the *best* solutions for a collection of *large* polygons.



- 58 vertices
- 5 guards

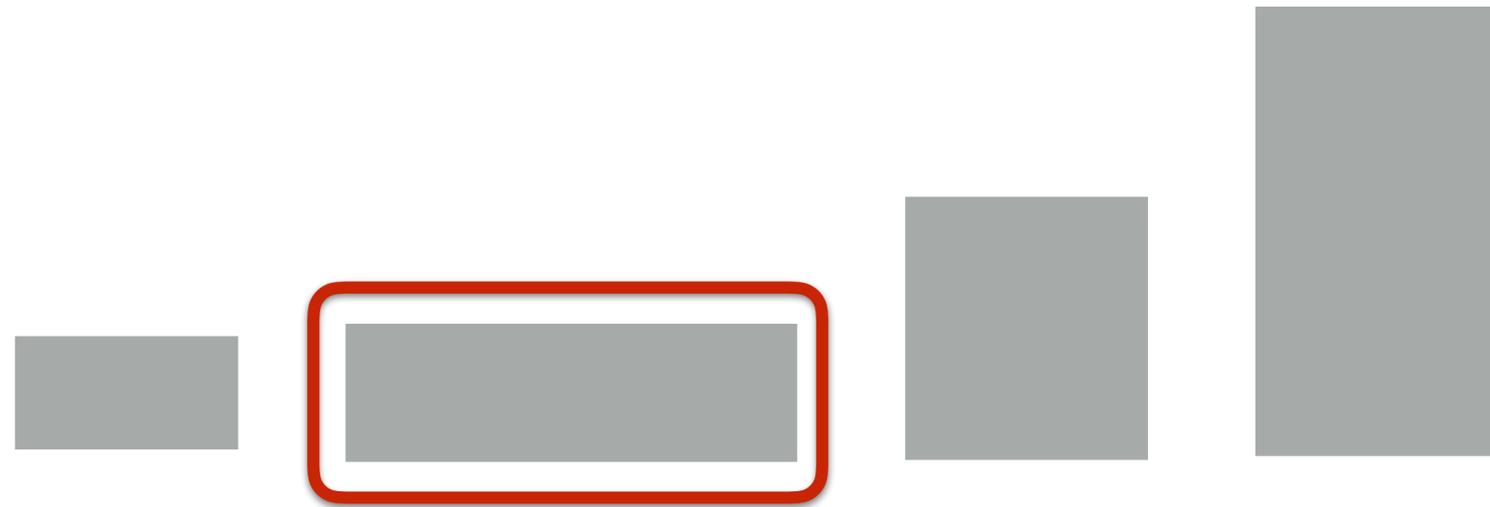
Making it Fun

- Problem generator;
 - ▶ Polygons with different “*features*” (convex, rectangular, etc.)
- Solution checker with online feedback
 - ▶ geometric machinery (triangulation, visibility, ...)
 - ▶ web-server
- Make sure that it all works.

Making it Fun

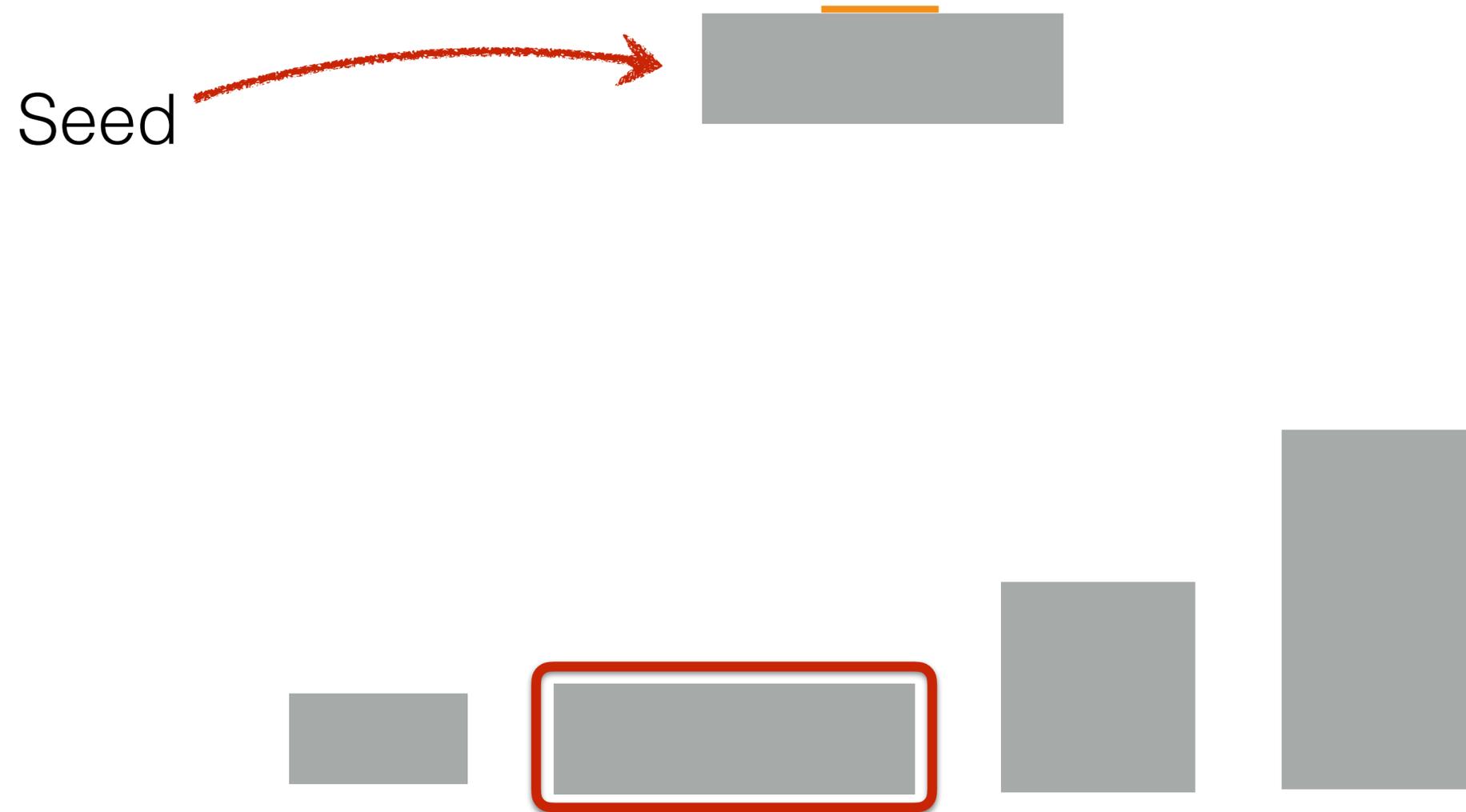
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Growing polygons

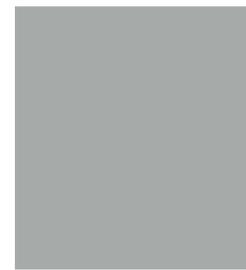
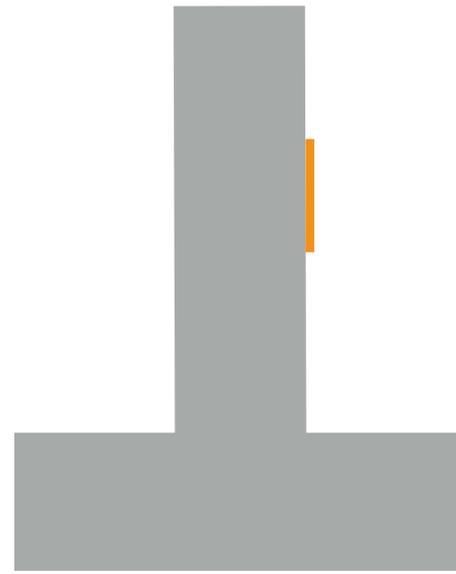


Primitive polygons with specific “features”

Growing polygons



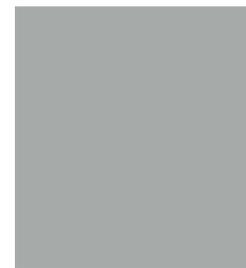
Growing polygons



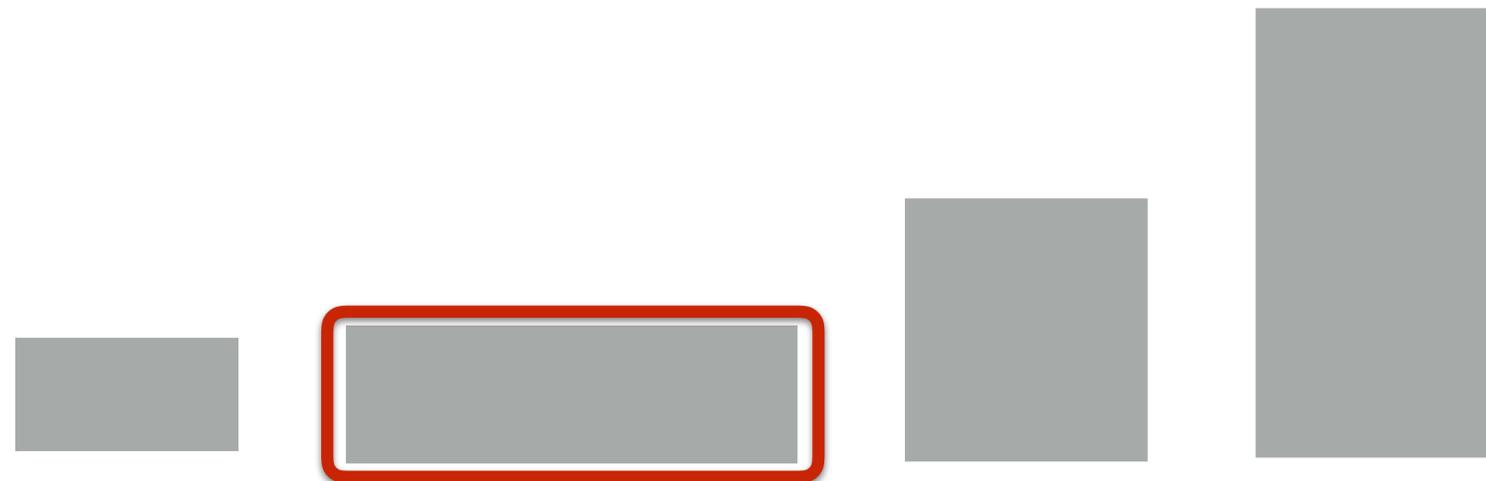
Growing polygons



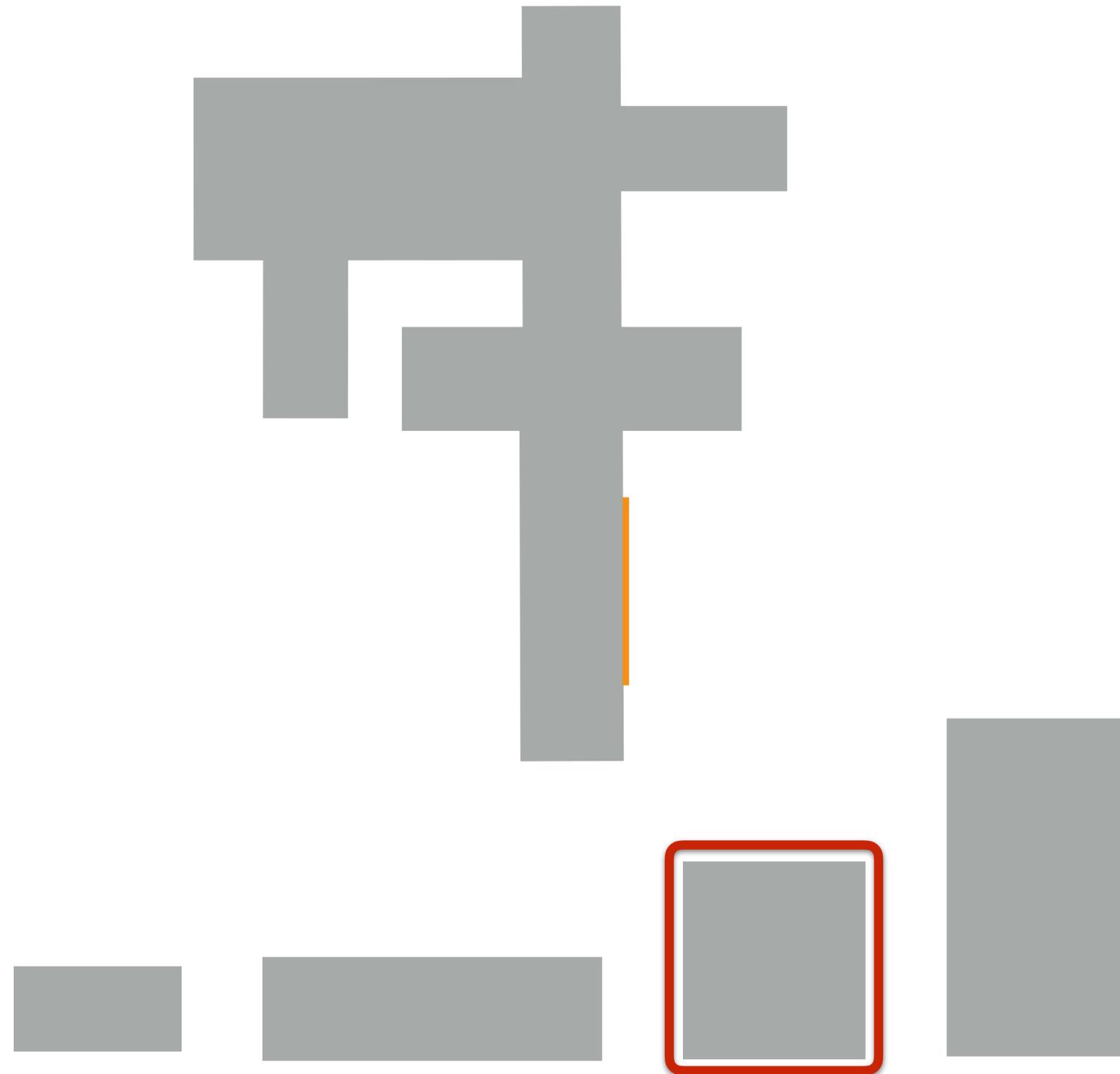
Growing polygons



Growing polygons



Growing polygons



Growing polygons



Can we *enumerate* “primitive” polygons
and plug *arbitrary shapes generators*?

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- Enumeration and Extensibility
- Combinator Libraries
 - Algebraic Data Types

QuickCheck

Automatic Specification- Based Testing

[Koen Claessen](#) and [John Hughes](#)

QuickCheck is a tool for testing Haskell programs automatically. The programmer provides a *specification* of the program, in the form of properties which functions should satisfy, and QuickCheck then tests that the properties hold in a large number of randomly generated cases. Specifications are expressed in Haskell, using combinators defined in the QuickCheck library.

QuickCheck provides combinators to define properties, observe the distribution of test data, and define test data generators.

Resources

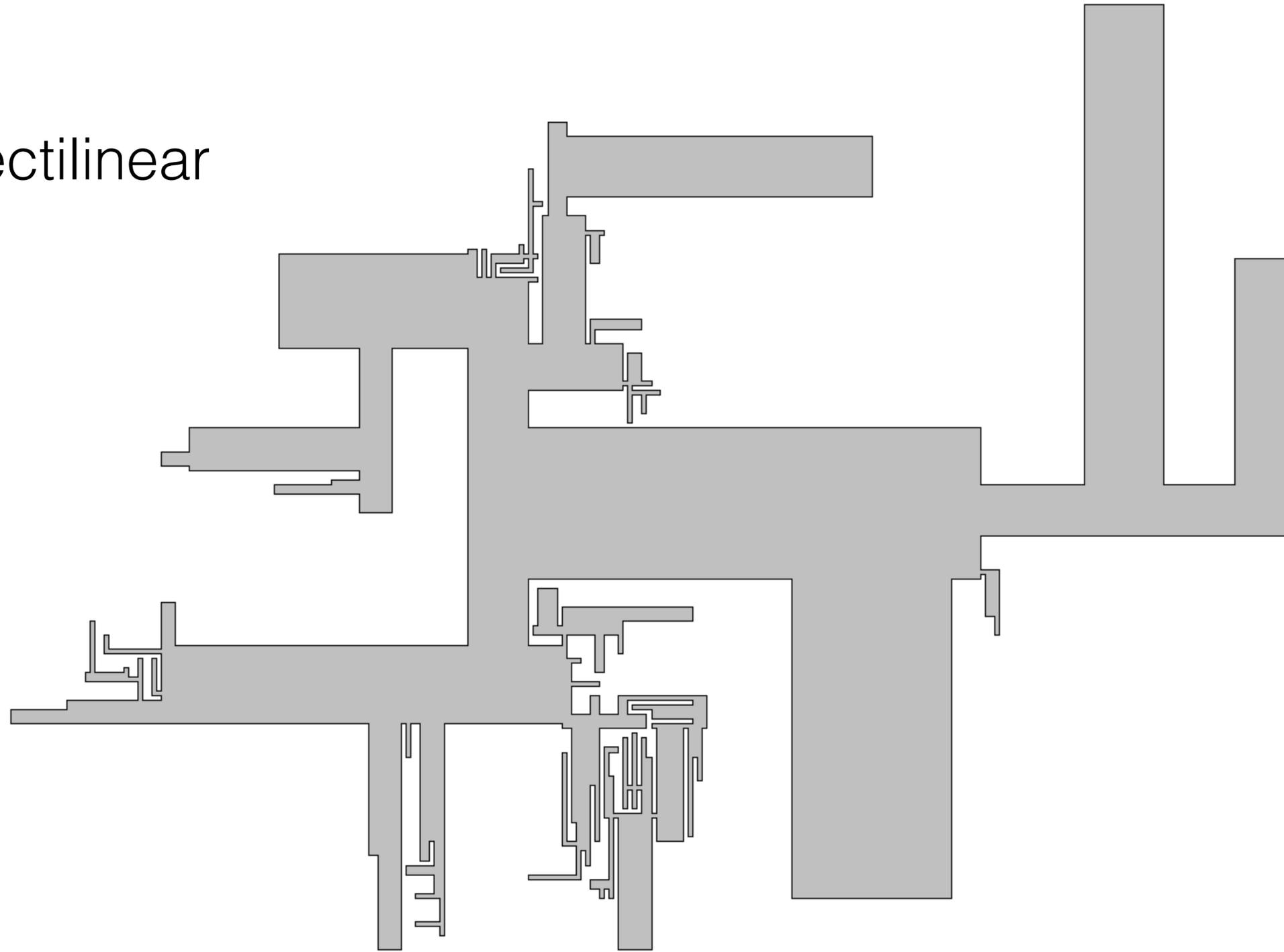
- Our [paper](#) from ICFP 2000.
- A [new paper](#) (presented at the Haskell Workshop 2002) on testing monadic programs, especially in the ST monad.

“Polygon Combinator”

```
trait PolygonGenerator extends GeneratorPrimitives {  
  
  val seeds          : List[Polygon]  
  val primitives     : List[(Int) => Polygon]  
  val locate        : Double => Option[(Double, Double)]  
  
  val seedFreqs     : List[Int]  
  val primFreqs     : List[Int]  
  
  val generations  : Int  
  
  ...  
}
```

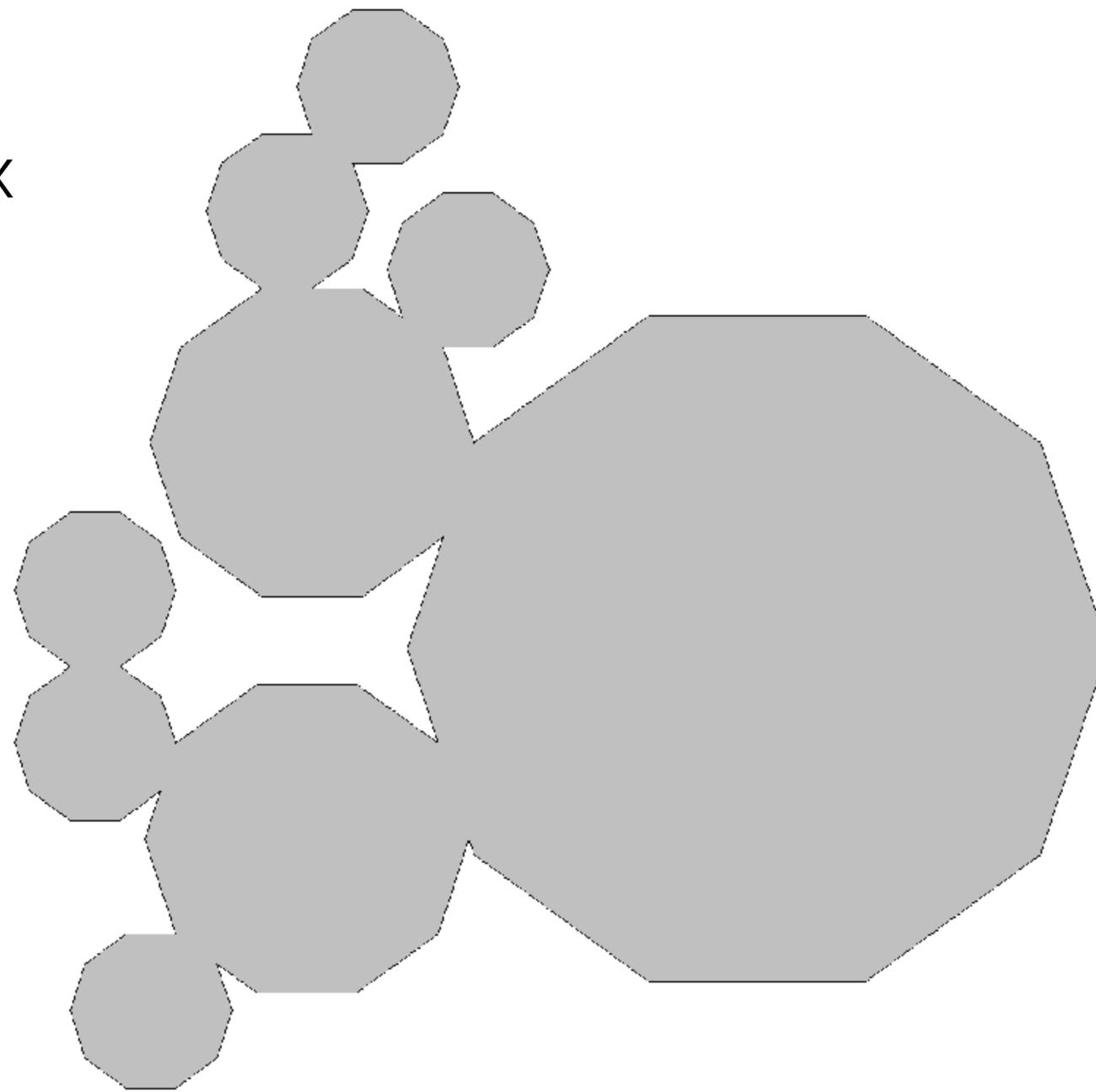
Generating random polygons

Rectilinear



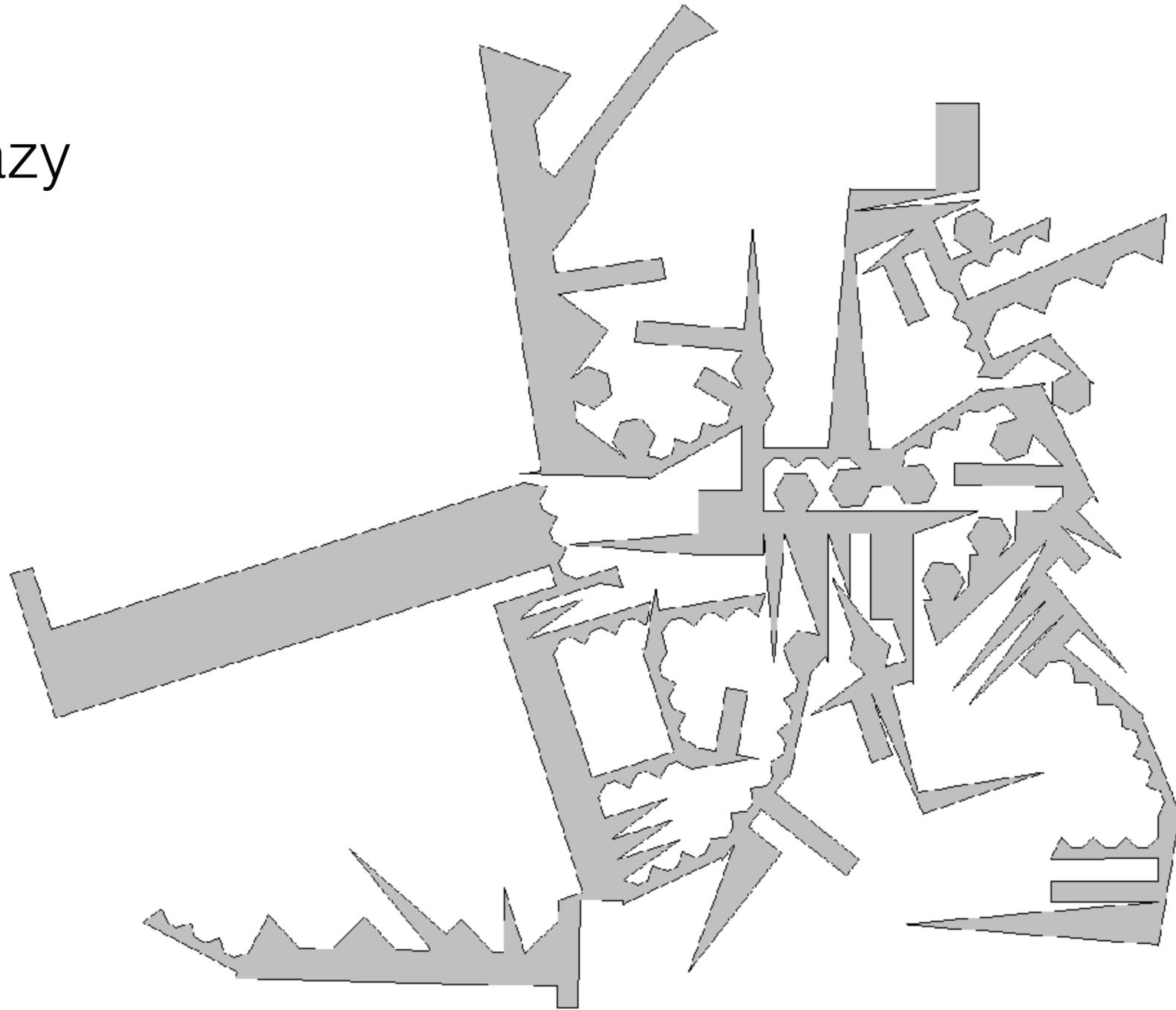
Generating random polygons

Quasi-convex



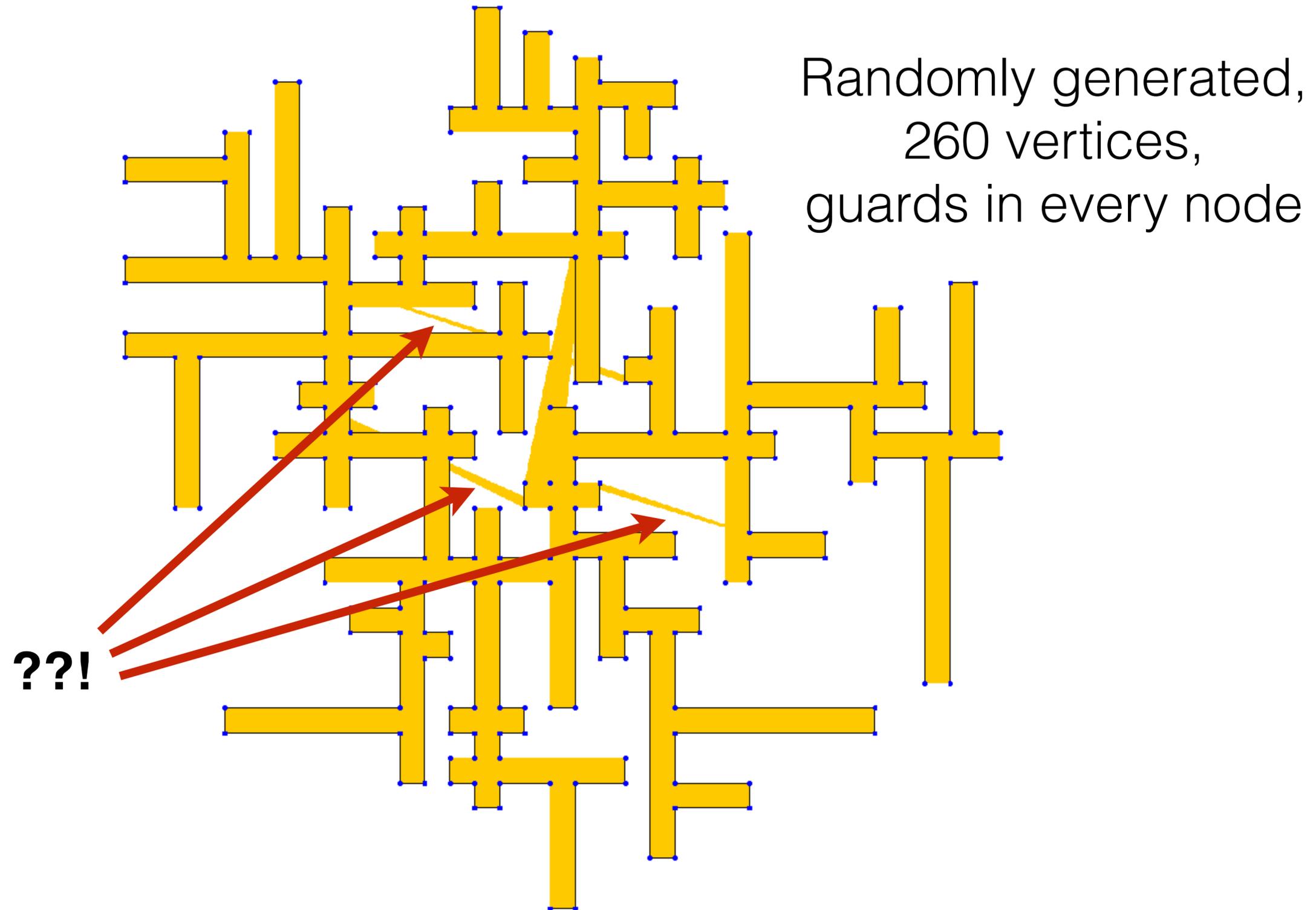
Generating random polygons

Crazy

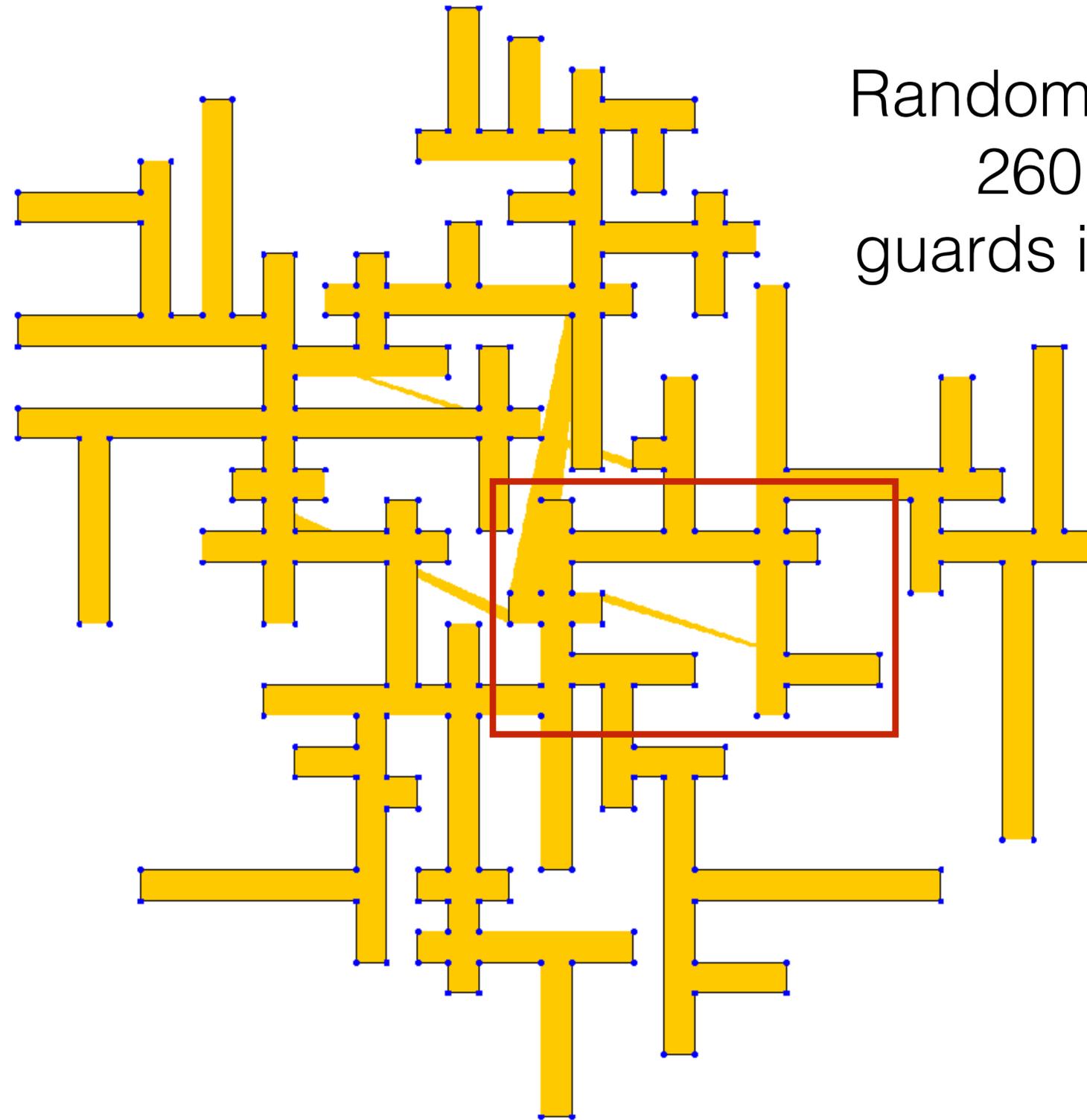


Can we *Quick-Check*
geometric algorithms?

Bug in textbook visibility algorithm



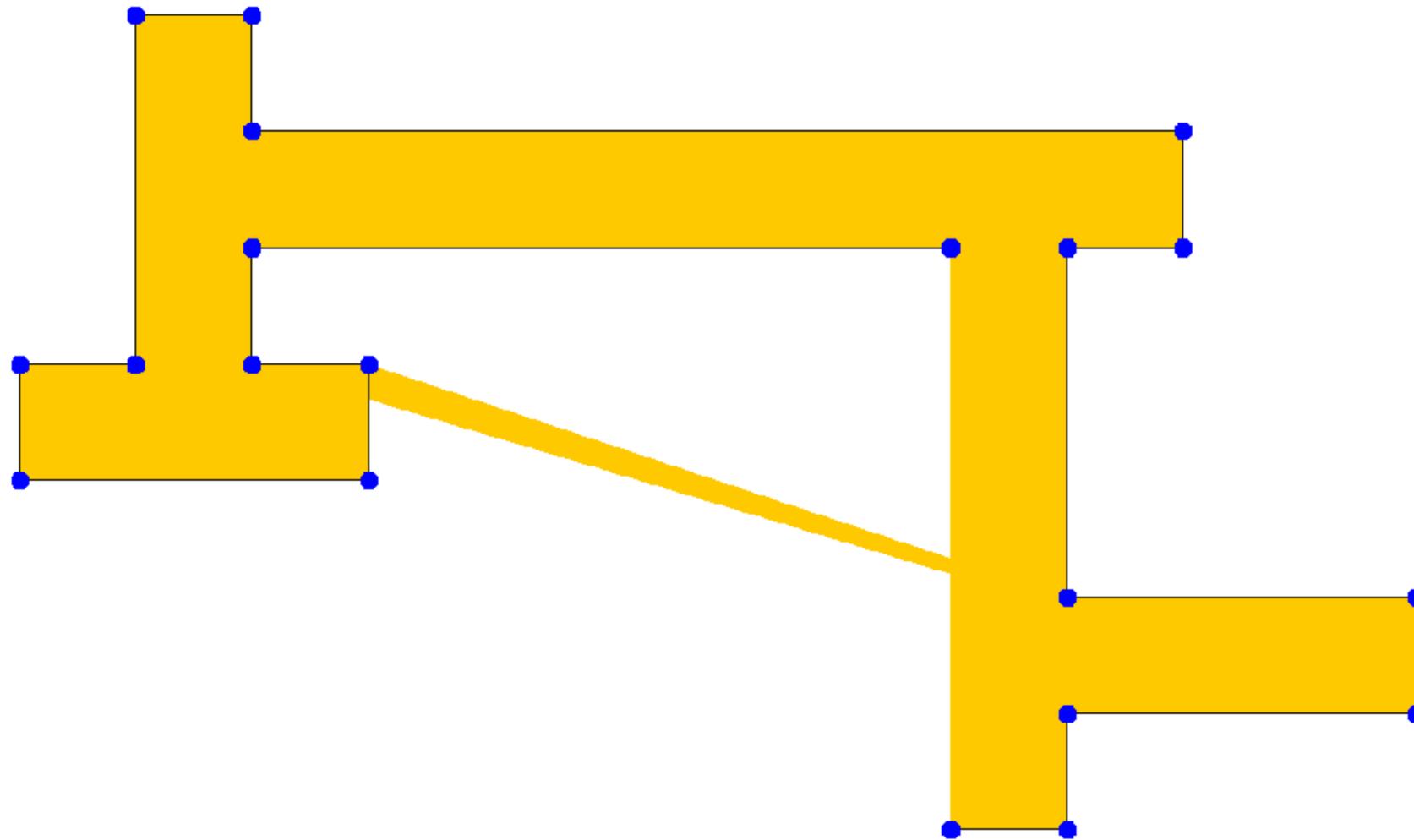
Bug in textbook visibility algorithm



Randomly generated,
260 vertices,
guards in every node

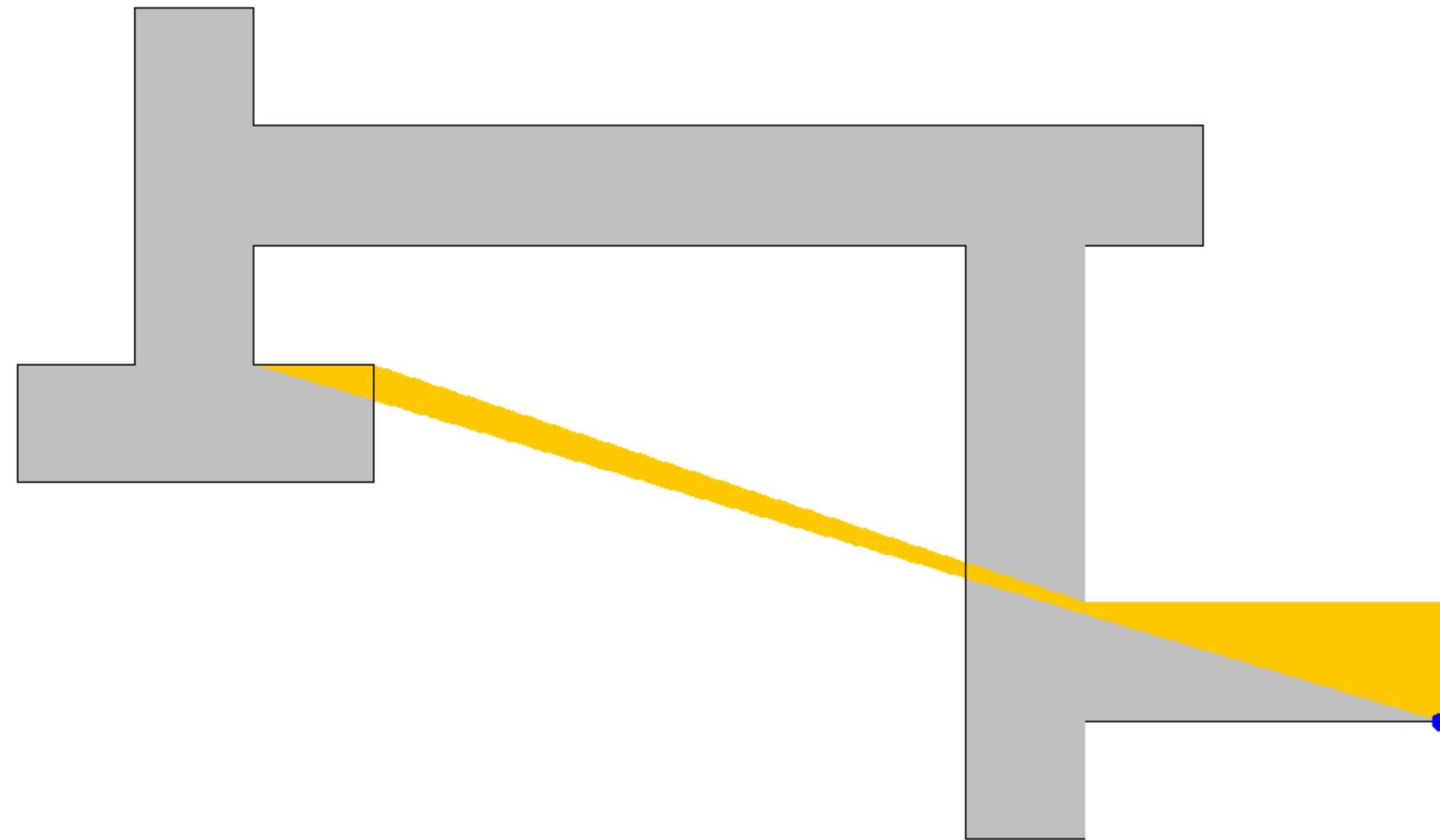
Bug in textbook visibility algorithm

After shrinking:
20 vertices



Bug in textbook visibility algorithm

Removed irrelevant
light sources



Bug in textbook visibility algorithm

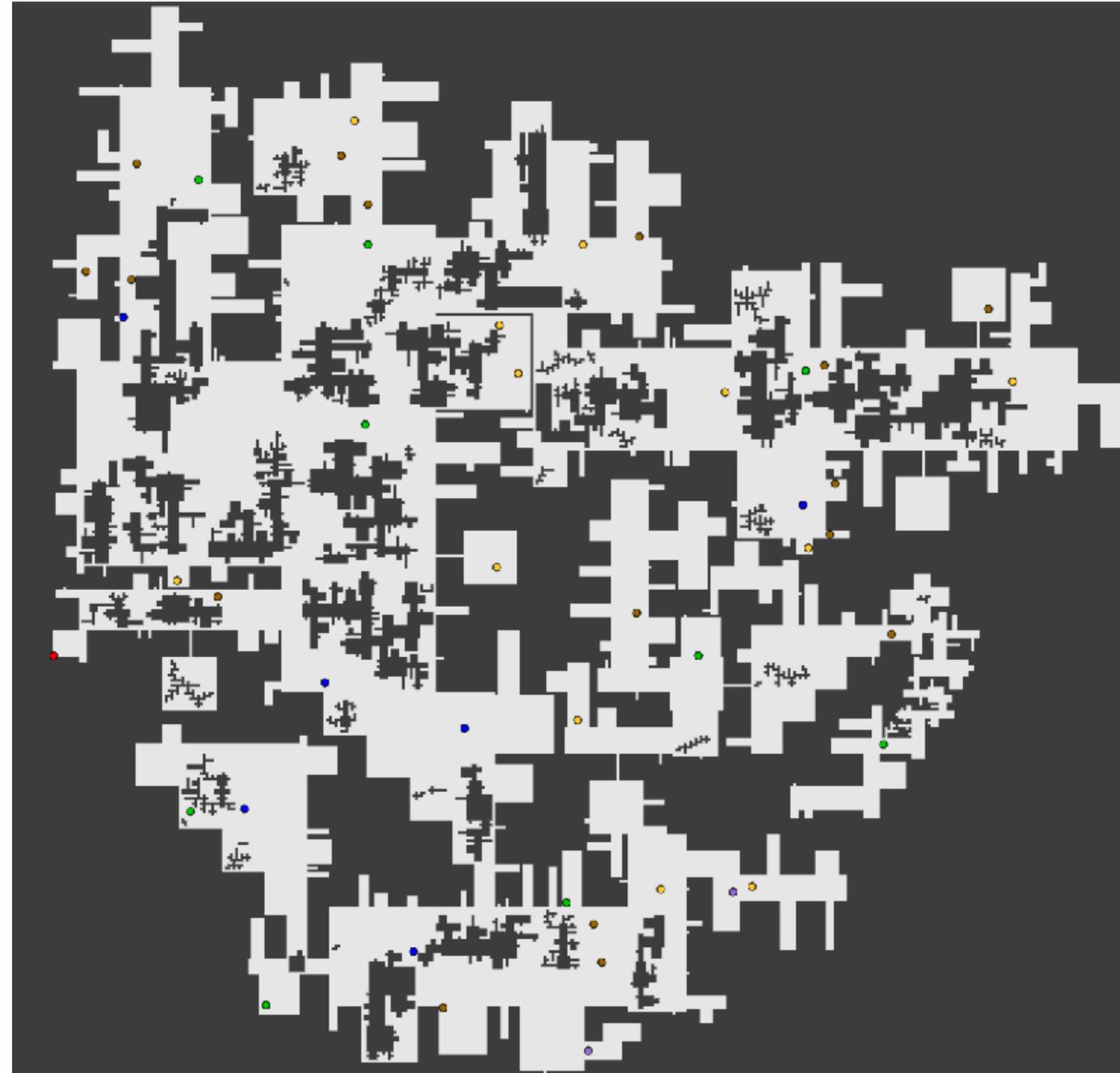
Removed irrelevant
light sources

**Experience Report: Growing and Shrinking Polygons
for Random Testing of Computational Geometry Algorithms**

Ilya Sergey
University College London, UK
i.sergey@ucl.ac.uk

ICFP 2016

Beyond Classroom: ICFP Programming Contest 2019



Contest Report
on Tuesday, 17:45

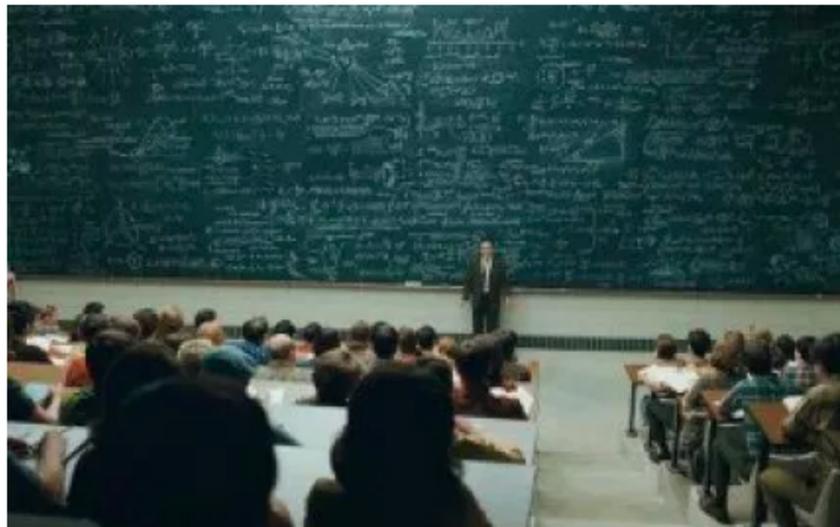
Functional Programming Ideas in...

Research



... for modularity and proof reuse

Teaching



... for creating fun assignments

Software Engineering



Functional Programming Ideas in...

Research



... for modularity and proof reuse

Teaching



... for creating fun assignments

Software Engineering



SCILLA

Safe-By-Design Smart Contract Language

[Documentation](#)[Try it!](#)[GitHub](#)

About

Scilla, short for Smart Contract Intermediate-Level Language, is an intermediate-level smart contract language being developed for [Zilliqa](#). Scilla has been designed as a principled language with smart contract safety in mind.

SCILLA

Safe-By-Design Smart Contract Language

Documentation

Try

About

Scilla, short for Smart Contract Intermediate-Level language being developed for Zilliqa. Scilla has been designed with contract safety in mind.

Zilliqa / **scilla** Unwatch 27 Star 133 Fork 35

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Scilla - A Smart Contract Intermediate Level Language <https://scilla-lang.org> Edit

smart-contracts blockchain verification zilliqa scilla ocaml Manage topics

956 commits 11 branches 8 releases 18 contributors GPL-3.0

OCaml 88.7% C++ 7.6% Emacs Lisp 1.6% C 0.7% Shell 0.6% Makefile 0.3% Other 0.5%

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vaivaswatha testsuite: input state json must contain all fields (#630) Latest commit 1ad43d3 2 days ago

.github	Tweak CODEOWNERS file (#534)	4 months ago
docs	moved readthedocs to a new repo	last year
imgs	Added Scilla logos	last year
misc/emacs-mode	Remove vim-plugin in misc, update README, fix typos (#607)	24 days ago
scripts	build: allow compilation with OCaml 4.07 (#548)	3 months ago
src	Fix minor bug in EvalUtil.ml : map_get (#629)	2 days ago

Smart Contracts

- *Stateful mutable* objects replicated via a *consensus protocol*
- Use *valuable resource (gas)* to prevent “expensive” computations
- Yet, should be able to *handle arbitrarily large* data
- Can fail at any moment and roll-back (*transactional behaviour*)

Smart Contracts

- *Stateful mutable* objects replicated via a consensus protocol
- Use *valuable resource (gas)* to prevent “expensive” computations
- Yet, should be able to *handle arbitrarily large* data
- Can fail at any moment and roll-back (*transactional behaviour*)

Can we have *an interpreter* supporting all of these, while keeping the “core” semantics **simple** and **easy to maintain**?

The Essence of Functional Languages

- Higher-order functions and closures
- Types and Type Inference
- Polymorphism
- Laziness
- Point-free style
- Combinator Libraries
- Algebraic Data Types
- Purely functional data structures
- Pattern Matching
- Folds
- Structural Recursion
- Continuations and CPS
- Type Classes
- Monads

The Essence of Functional Languages

Representing Monads*

Andrzej Filinski

School of
Carnegie
Pittsbu
andr

Monad Transformers and Modular Interpreters*

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We show how a *set of building blocks* can be used to construct programming language interpreters, and present implementations of such building blocks capable of supporting many *commonly known features, including simple expressions, three different function call mechanisms [...], references and assignment, nondeterminism, first-class continuations, and program tracing.*

Expressing any Effects
&
Modular Interpreters

• Structural Recursion

- Continuations and CPS
- Type Classes
- Monads

```

77  (*****)
78  (* A monadic big-step evaluator for Scilla expressions *)
79  (*****)
80
81  (* [Evaluation in CPS]
82
83     The following evaluator is implemented in a monadic style, with the
84     monad, at the moment to be CPS, with the specialised return result
85     type as described in [Specialising the Return Type of Closures].
86  *)
87
88  let rec exp_eval erep env =
89    let (e, loc) = erep in
90    match e with
91    | Literal l ->
92      pure (l, env)
93    | Var i ->
94      let%bind v = Env.lookup env i in
95      pure @@ (v, env)
96    | Let (i, _, lhs, rhs) ->
97      let%bind (lval, _) = exp_eval_wrapper lhs env in
98      let env' = Env.bind env (get_id i) lval in
99      exp_eval_wrapper rhs env'
100   | Message bs ->

```

- About 200 LOC of OCaml
- *Hasn't been affected* by multiple modifications in the back-end protocol
- Changes in gas accounting *have not affected* the core interpreter
- Lots of performance bottlenecks fixed *without ever touching* the evaluator

Powered by Monads

Functional Programming Ideas in...

Research



... for modularity and proof reuse

Teaching



... for creating fun assignments

Software Engineering



... for robust and maintainable artefacts

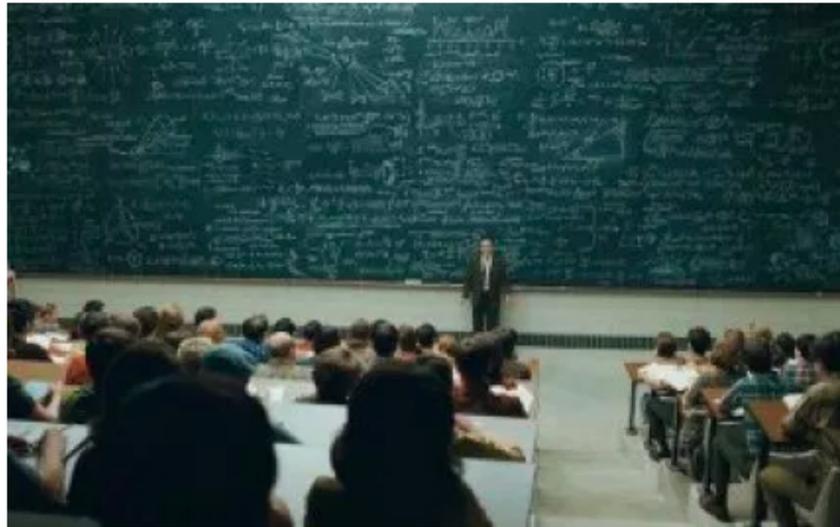
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To Take Away

- FP insights *spread far beyond programming* in OCaml, Haskell, Racket, *etc.*
- FP keeps evolving: *new powerful ideas* are constantly emerging: *effect handlers, staging, automatic differentiation, security type systems...*
- Those ideas can be *your tools*, too!



Thanks!