

# The Isabelle Refinement Framework

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- This talk: towards faster verified algorithms at manageable effort

# Introduction

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**procedure** AUGMENT( $g, f, p$ )

$c_p \leftarrow \min\{g_f(u, v) \mid (u, v) \in p\}$

**for all**  $(u, v) \in p$  **do**

**if**  $(u, v) \in g$  **then**  $f(u, v) \leftarrow f(u, v) + c_p$

**else**  $f(v, u) \leftarrow f(v, u) - c_p$

**return**  $f$

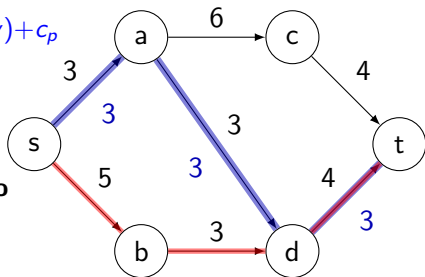
**procedure** EDMONDS-KARP( $g, s, t$ )

$f \leftarrow \lambda(u, v). 0$

**while** exists augmenting path in  $g_f$  **do**

$p \leftarrow$  shortest augmenting path

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$g$ : flow network

$s, t$ : source, target

$g_f$ : residual network

## Correctness

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## Theorem (Ford-Fulkerson)

For a flow network  $g$  and flow  $f$ , the following 3 statements are equivalent

- 1  $f$  is a maximum flow
- 2 the residual network  $g_f$  contains no augmenting path
- 3  $|f|$  is the capacity of a (minimal) cut of  $g$

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using basic concepts such as numbers, sets, and graphs.





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When augmenting with a shortest path,

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using lemmas about graphs and shortest paths.



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    flow += new_flow;  
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- Implementations used for different parts must fit together!

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bfs-1

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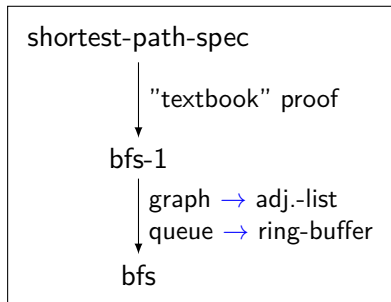


graph → adj.-list

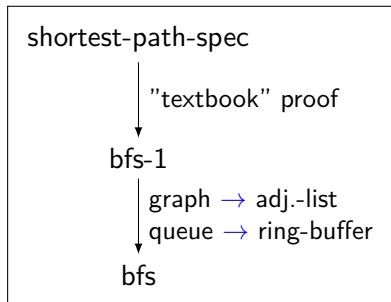
queue → ring-buffer

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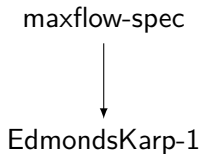
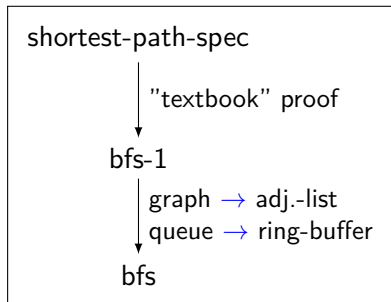


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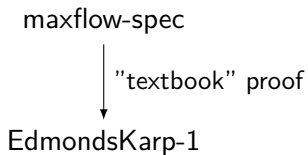
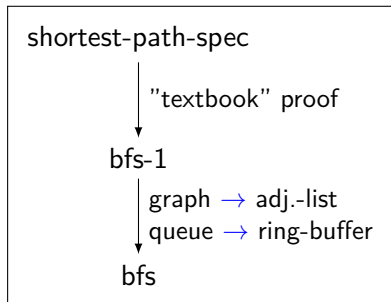


maxflow-spec

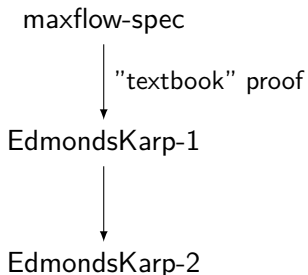
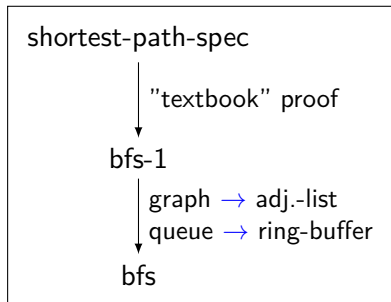
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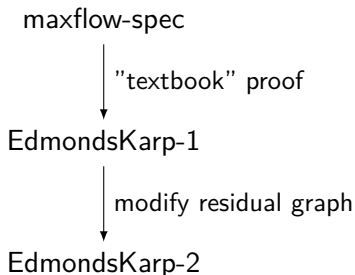
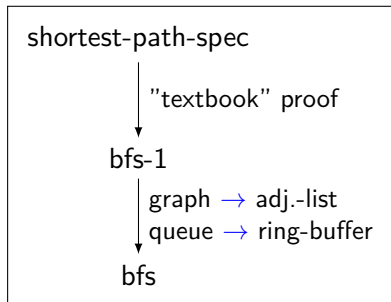
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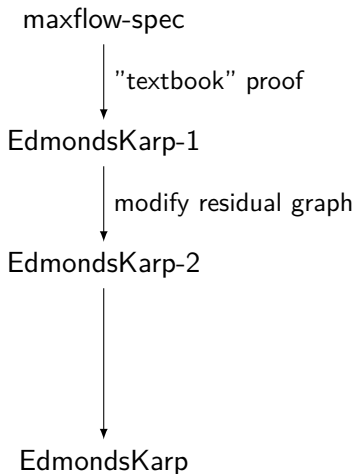
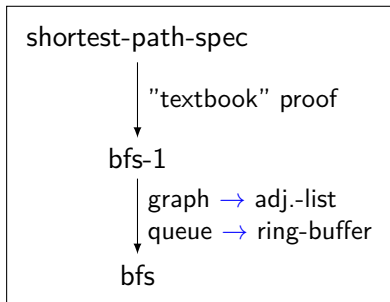


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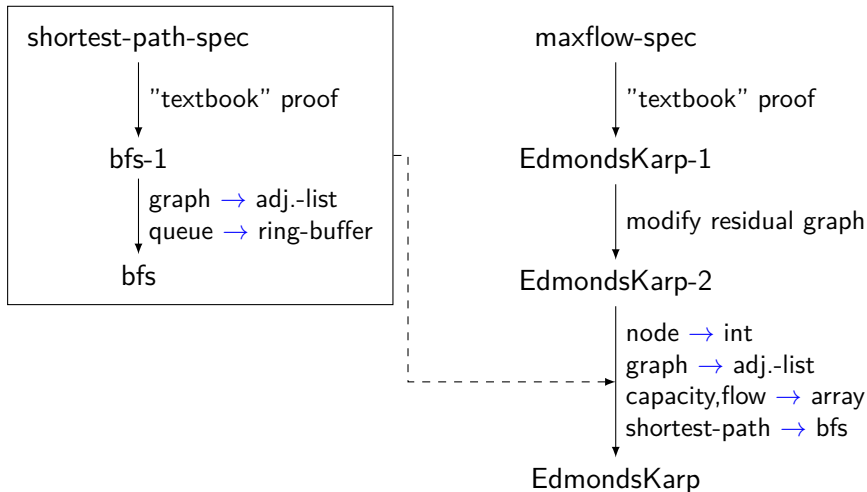




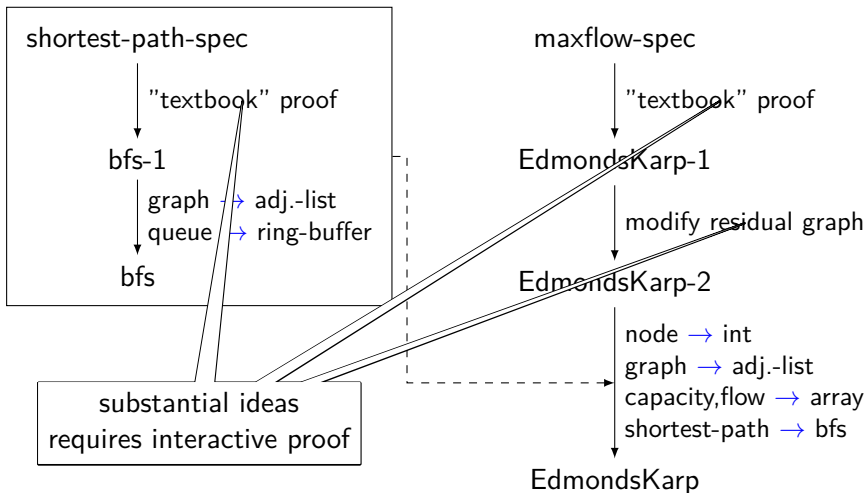
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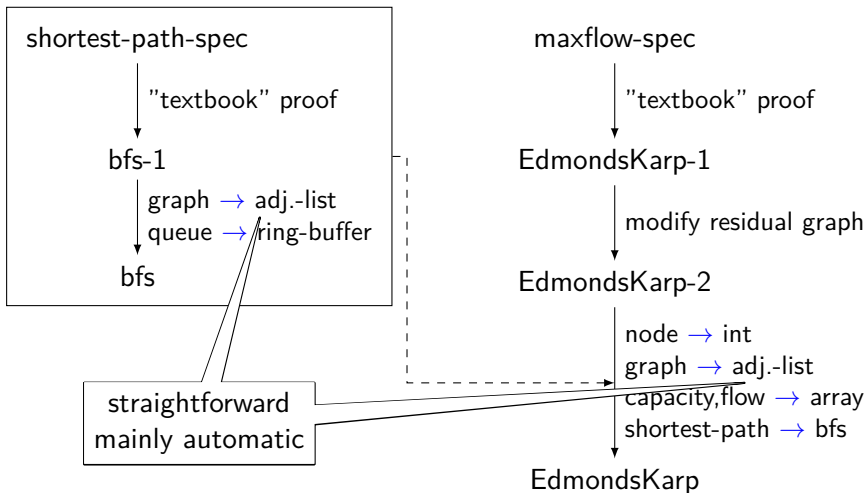
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# The Isabelle Refinement Framework

- Formalization of Refinement in Isabelle/HOL
- Batteries included
  - Verification Condition Generator
  - Collection Framework
  - (Semi)automatic data refinement
- Some highlights
  - GRAT UNSAT certification toolchain
    - formally verified
    - faster than (verified and unverified) competitors
  - Introsort (on par with `libstd++ std::sort`)
  - Timed Automata model checker
  - CAVA LTL model checker
  - Network flow (Push-Relabel and Edmonds Karp)

# Formalizing Refinement

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  - Require: nondeterminism, pointers/heap, (data) refinement
  - VCG, also for refinements
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  - ② HEAP: deterministic heap-error monad
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  - ② HEAP: deterministic heap-error monad
    - separation logic based VCG
- Automated transition from NRES to HEAP
  - automatic data refinement (e.g. integer by int64)
  - automatic placement on heap (e.g. list by array)
  - some in-bound proof obligations left to user

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Translate HEAP to compilable code

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## ① Imperative-HOL:

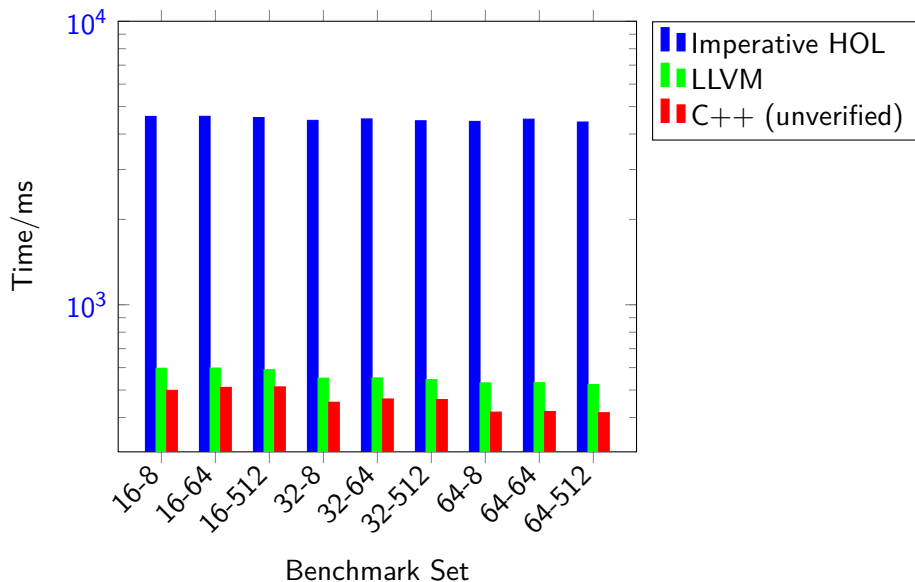
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## ② NEW!: Isabelle-LLVM

- shallow embedding of fragment of LLVM-IR
- pretty-print to actual LLVM IR text
- then use LLVM optimizer and compiler
- faster programs
- thinner (unverified) compilation layer

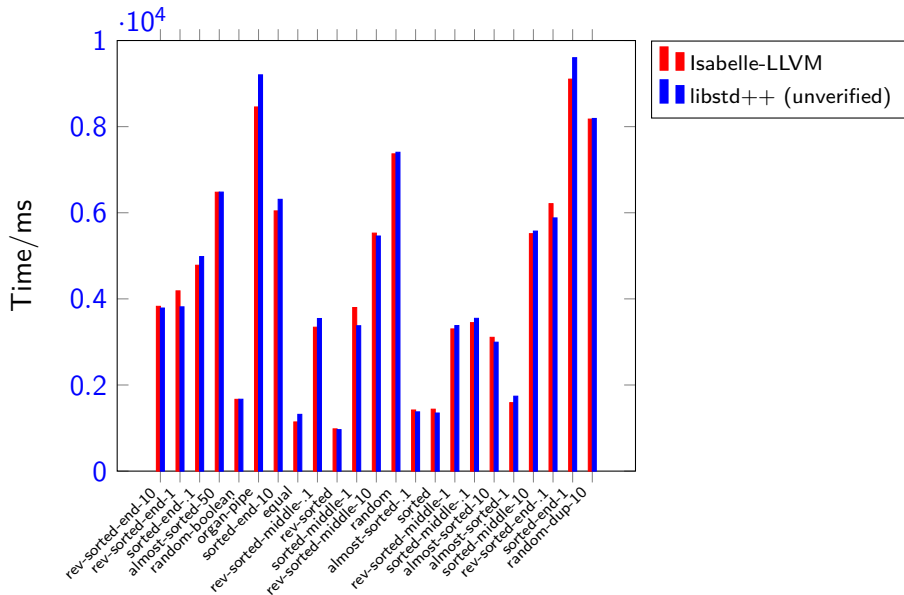


# Knuth Morris Pratt

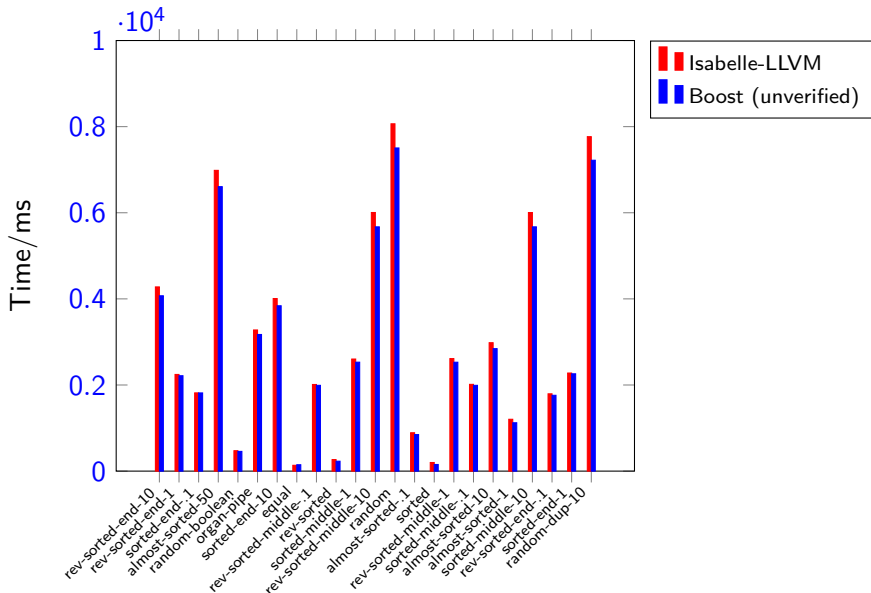


Execute *a-l* benchmark set from StringBench. Stop at first match.

# Verified Sorting Algorithms: Introsort



# Verified Sorting Algorithms: Pdqsort





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f (l :: int list) {  
  (int)set S = {}  
  int c=0  
  for (int i=0; i<|l|; ++i) {  
    t1 = l[i]  
    if (t1 ∉ S) {  
      *: assert (c<|l|)  
      ++c  
      S={t1} ∪ S  
    } } }  
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  hashmap S' = hm_empty()
  int64 c'=0
  for (int64 i'=0; i'<|l'|; ++i') {
    t'1 = l'[i']
    if (¬hm_member t'1 S') {
      *:
      ++c'
      S'=hm_insert t'1 S'
    } } free S' }
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```

At \*: array i64 l l' \* hm i64 S S' \* ...

# Nested Containers

Hoare-Rule for array-index:

$\{ \text{array } A \mid l' * i64 \ i \ i' * i < |l| \} \ r' = l[i] \ \{ \text{array } A \mid l' * i64 \ i \ i' * A \ (l[i]) \ r' \}$

**where**

$\text{array } A \mid p = \exists \ l'. \ p+0 \mapsto l[0] * \dots * p+n \mapsto l[n]$   
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Problem: Does not work for *array (array i64)*! (result is shared)

- current approach: abstract data type:  $\alpha$  *option list*
  - None: element not in array
  - Manual ownership management
- future:
  - read-only sharing (fractional sep-logic?)
  - automation (as far as possible)
  - maybe inspiration from Rust.

# Conclusions

## Isabelle Refinement Framework

powerful interactive theorem prover

- + stepwise refinement
- + libraries for standard DS and algorithms
- + lot's of automation
- + efficient backend (LLVM)
- = verified and efficient algorithms, at manageable effort

[https://github.com/lammich/isabelle\\_llvm](https://github.com/lammich/isabelle_llvm)