

Refinement of Parallel Algorithms down to LLVM

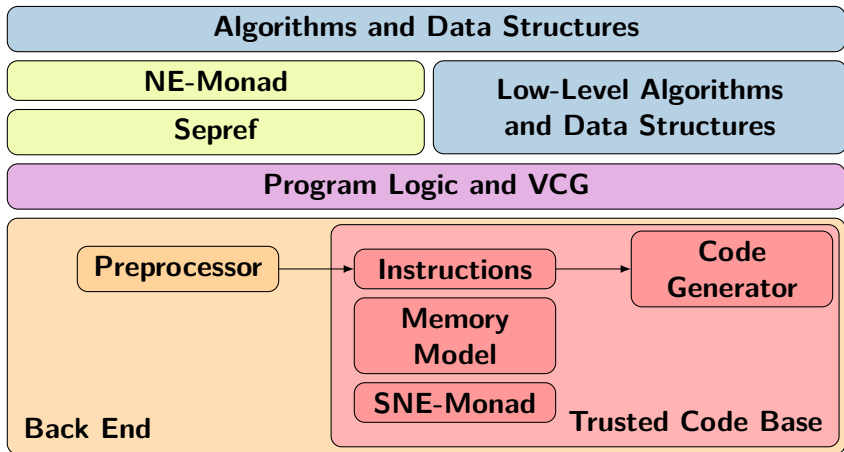
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The Isabelle Refinement Framework

Stepwise Refinement approach to verified algorithms in Isabelle/HOL



Some Highlights

- Isa-SAT: verified SAT Solver
- (Sequential) sorting algorithm: on par with Boost pdqsort / GNU's `std::sort`
- GRAT-toolchain: verified UNSAT verifier (faster than drat-trim)

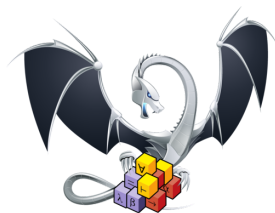
Isabelle LLVM Backend

- Shallowly embedded LLVM semantics (fragment just big enough)
- Structured control flow (compiled by code generator)
- Features: int+float, recursive struct, C header file generation, ...

fib:: 64 word \Rightarrow 64 word ILM

```
fib n = do {  
  t  $\leftarrow$  ll_icmp_ule n 1;  
  llc_if t  
    (return n)  
  (do {  
    n1  $\leftarrow$  ll_sub n 1;  
    a  $\leftarrow$  fib n1;  
    n2  $\leftarrow$  ll_sub n 2;  
    b  $\leftarrow$  fib n2;  
    c  $\leftarrow$  ll_add a b;  
    return c  
  }) }  
}) }
```

```
export_llvm  
fib is uint64_t fib(uint64_t)
```



Code Generation

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Code Generation

compiling control flow + pretty printing

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```

```
  }) }
```

```
define i64 @fib(i64 %n) {  
  start:  
    %t = icmp u1e i64 %n, 1  
    br i1 %t, label %then, label %else  
  then:  
    br label %ctd_if  
  else:  
    %n_1 = sub i64 %n, 1  
    %a = call i64 @fib (i64 %n_1)  
    %n_2 = sub i64 %n, 2  
    %b = call i64 @fib (i64 %n_2)  
    %c = add i64 %a, %b  
    br label %ctd_if  
  ctd_if:  
    %x1a = phi i64 [%n,%then], [%c,%else]  
    ret i64 %x1a }
```

This Talk

How to verify parallel programs with Isabelle LLVM?

- Simple idea gives simple parallel combinator
- How far can we drive this idea?
- What features are required for verified ATPs?



Isabelle LLVM Back End

- Shallow embedding into monad

$\alpha M =$

Isabelle LLVM Back End

- Shallow embedding into error-monad
 $\alpha M = \alpha \text{ option}$

None — undefined behaviour, nontermination

Isabelle LLVM Back End

- Shallow embedding into `ndet-error-monad`

α $M = \alpha$ set option

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α set — set of possible results

Isabelle LLVM Back End

- Shallow embedding into state-ndet-error-monad

α $M = \mu \rightarrow (\alpha \times \mu)$ set option

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μ — memory

Isabelle LLVM Back End

- Shallow embedding into state-ndet-error-monad with access reports
 $\alpha M = \mu \rightarrow (\alpha \times \rho \times \mu)$ set option

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Basic block: $x_1 \leftarrow op_1; \dots; return \dots$

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if-then-else, while — structured control flow (compiled by code-gen)

Parallel Combinator

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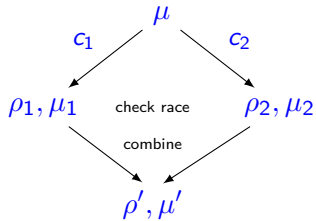
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$(c_1 \parallel c_2) \mu \equiv$

$(r_1, \rho_1, \mu_1) \leftarrow c_1 \mu$

— execute first strand

$(r_2, \rho_2, \mu_2) \leftarrow c_2 \mu$

— execute second strand

$\text{assume } \rho_1.\text{alloc} \cap \rho_2.\text{alloc} = \emptyset$

— ignore infeasible combinations

$\text{assert no_race } \rho_1 \rho_2$

— fail on data race

$(\rho', \mu') = \text{combine } \rho_1 \mu_1 \quad \rho_2 \mu_2$

— combine states

$\text{return } ((r_1, r_2), \rho', \mu')$

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Sanity checks: prove (as type invariant):

- access reports match actually modified addresses
- there is at least one execution.

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- Code-gen: external function + some glue code

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```
void parallel(void (*f1)(void*), void (*f2)(void*), void *x1, void *x2) {  
    tbb::parallel_invoke([=]{f1(x1);}, [=]{f2(x2);});  
}
```

Separation Logic

$\{P\} c \{Q\}$ iff

$\forall \mu a \text{ af. } \alpha \mu = a + \text{af} \wedge P a$ — for all memories that satisfy precondition
 $\implies \exists S. c \mu = \text{Some } S$ — program does not fail
 $\wedge \forall (r, \rho, \mu') \in S.$ — and all possible results
 $\exists a'. \alpha \mu' = a' + \text{af} \wedge Q r a'$ — satisfy postcond
 $\wedge \text{disjoint } \rho \text{ af}$ — and accessed memory not in frame

α : abstracts memory into separation algebra

Baked-in frame rule

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Baked-in frame rule

We prove the standard Hoare-rules, e.g. dj-conc rule:

$\{P_1\} c_1 \{Q_1\} \wedge \{P_2\} c_2 \{Q_2\}$
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VCG helps with proof automation

- Semi-automatic data refinement.
 - from purely functional nres-error monad
 - to (shallowly embedded) LLVM semantics
 - place pure data on heap (eg. lists \rightarrow arrays)

Refinement Relation

$\text{hnr } \Gamma \ c_{\dagger} \ \Gamma' \ R \ CP \ c$

iff

$c = \text{Some } S \implies \{\Gamma\} \ c_{\dagger} \ \{\lambda r_{\dagger}. \exists r. R \ r \ r_{\dagger} * \Gamma' * r \in S * CP \ r_{\dagger}\}$

c_{\dagger}/c concrete/abstract programs

Γ/Γ' refinements for variables in c_{\dagger} and c , before/after execution

R refinement for result

CP concrete (pointer) equalities

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Seepref: syntactically guided heuristics

synthesize c_{\dagger} , Γ' , R , CP from Γ and c + annotations

Example

hnr

(arr xs p * idx n i) — argument refinements
(store x (p+i); return p) — concrete program: store, return pointer
(idx n i) — original refinement for array is gone
(arr) — result refinement
(λr. r=p) — concrete result is same as argument *p*
(return xs[n:=x]) — abstract program: functional list update

arr refines list to array

idx refines nat to size_t

Refinement Building Blocks

- Patterns and strategies for refinement

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- Sequential: e.g., `nat` \rightarrow `size_t`, `list` \rightarrow `array`, `fold` \rightarrow `loop`
- Here: parallelization and array-splitting

Parallelization

- Refine sequential (independent) execution to parallel execution

$$\begin{aligned} & \text{hnr } \Gamma_1 \ c_{\dagger 1} \ \Gamma'_1 \ R_1 \ CP_1 \ c_1 \ \wedge \ \text{hnr } \Gamma_2 \ c_{\dagger 2} \ \Gamma'_2 \ R_2 \ CP_2 \ c_2 \\ & \implies \\ & \text{hnr } (\Gamma_1 * \Gamma_2) \ (c_{\dagger 1} \parallel c_{\dagger 2}) \ (\Gamma'_1 * \Gamma'_2) \ (R_1 \times R_2) \ (CP_1 \wedge CP_2) \ (\text{fpar } c_1 \ c_2) \end{aligned}$$

where $\text{fpar } c_1 \ c_2 \equiv r_1 \leftarrow c_1; r_2 \leftarrow c_2; \text{return } (r_1, r_2)$
 fpar is annotation for Sepref to request parallelization

Array Splitting

- Work on two separate parts of same array (e.g. in parallel)
- Functionally:

```
with_split n xs f =  
  assert n ≤ |xs|  
  (xs1,xs2) ← f (take n xs) (drop n xs)  
  return xs1 @ xs2
```

- Imperative with arrays

```
with_split_arr i p f† =  
  p2 ← ofs_ptr p i  
  f† p p2  
  return p
```

Array Splitting

Refinement rule uses CP -predicates to ensure that f_{\dagger} is in-place

$$\begin{aligned} & \text{hnr (arr xs}_1 \text{ p}_1 * \text{arr xs}_2 \text{ p}_2) (f_{\dagger} \text{ p}_1 \text{ p}_2) \square \\ & \quad (\text{arr } \times \text{ arr}) (\lambda(p'_1, p'_2). p'_1 = p_1 \wedge p'_2 = p_2) \\ & \quad (f \text{ xs}_1 \text{ xs}_2) \\ & \implies \\ & \text{hnr (arr xs p * idx i i}_{\dagger}) (\text{with_split_arr i}_{\dagger} \text{ p } f_{\dagger}) \\ & \quad (\text{idx i i}_{\dagger}) \text{arr } (\lambda p'. p' = p) \\ & \quad (\text{with_split i xs f}) \end{aligned}$$

Parallel Quicksort

(Simplified) functional algorithm:

```
qsort xs ≡  
  if |xs| < 1 then return xs  
  else  
    (xs,m) ← partition xs  
    with_split m xs (λxs1 xs2.  
      fpar (qsort xs1) (qsort xs2)  
    )
```

Correctness statement:

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qsort xs ≤ spec xs'. sorted xs'  
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we have actually verified some 'extras':

- use sequential sorting for small, unbalanced, or deep partitions
- partitioning uses $c=64$ equidistant samples
- sequential sorting: using verified pdq-sort (competitive with `std::sort`)

Correctness theorem and TCB

Sepref generates $qsort_{\dagger}$ and theorem

$hnr (arr\ xs\ p * idx\ |xs|\ n) (qsort_{\dagger}\ p\ n) (idx\ |xs|\ n) arr (=p) (qsort\ xs)$

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Combination with correctness theorem of $qsort$ yields

$\{arr\ xs\ p * idx\ |xs|\ n\}$

$qsort_{\dagger}\ p\ n$

$\{\lambda r. \exists xs'. r=p * arr\ xs'\ p * sorted\ xs' * mset\ xs' = mset\ xs\}$

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`export_llvm qsort_{\dagger} is uint64* qsort_uint64(uint64*, size_t)`

(and, similar but more complicated for strings, ...)

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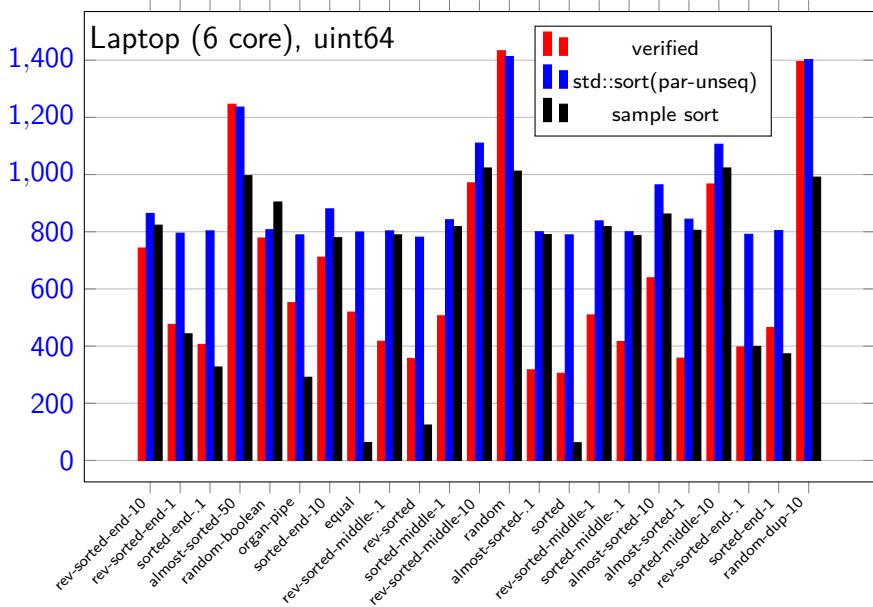
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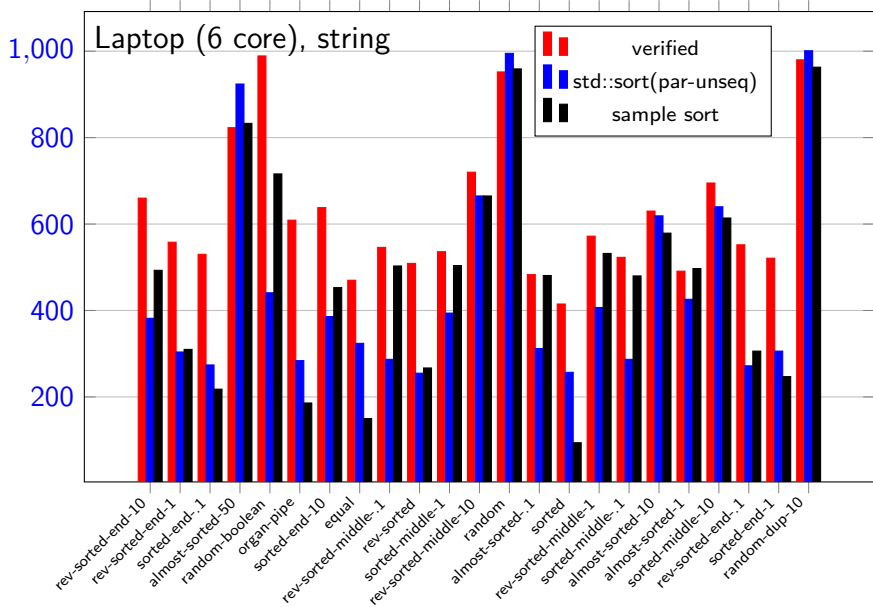
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This can be compiled and linked against, e.g., benchmark suite

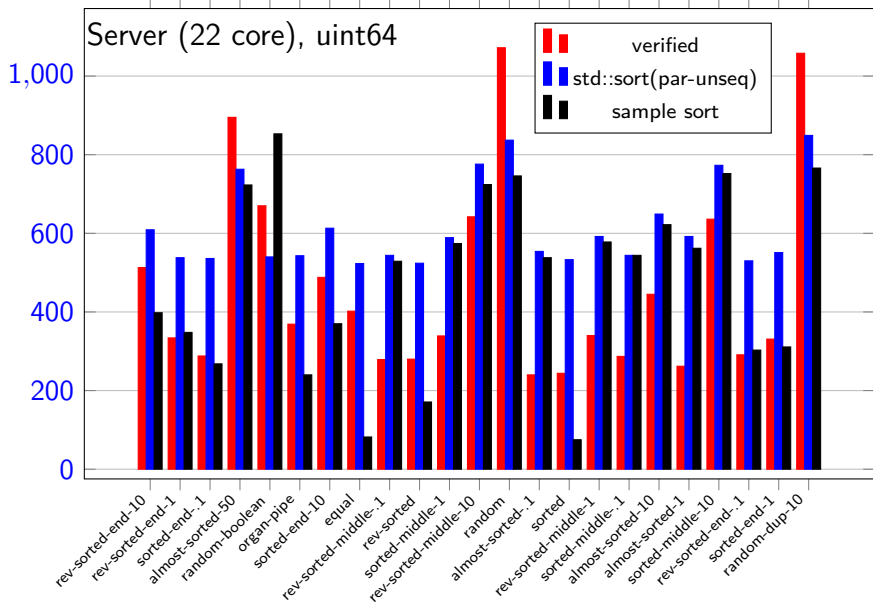
Benchmarks



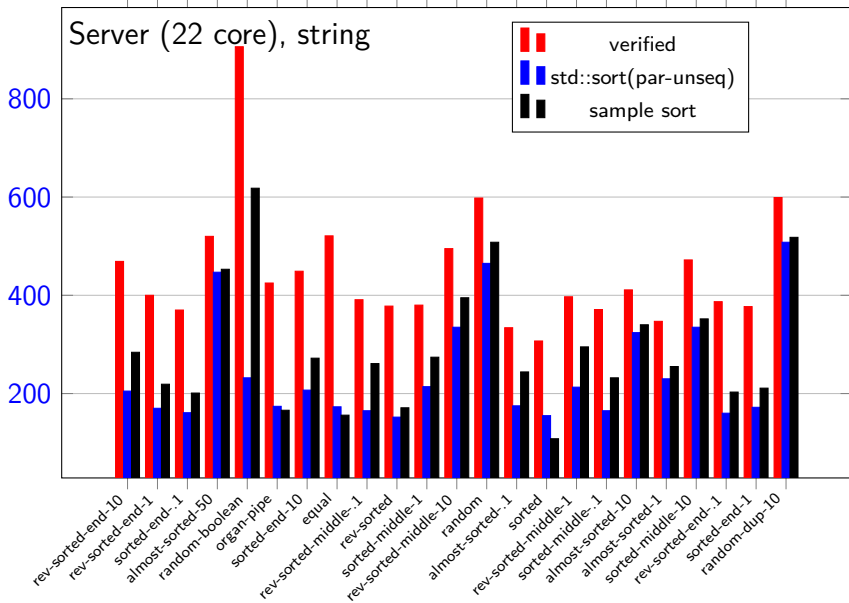
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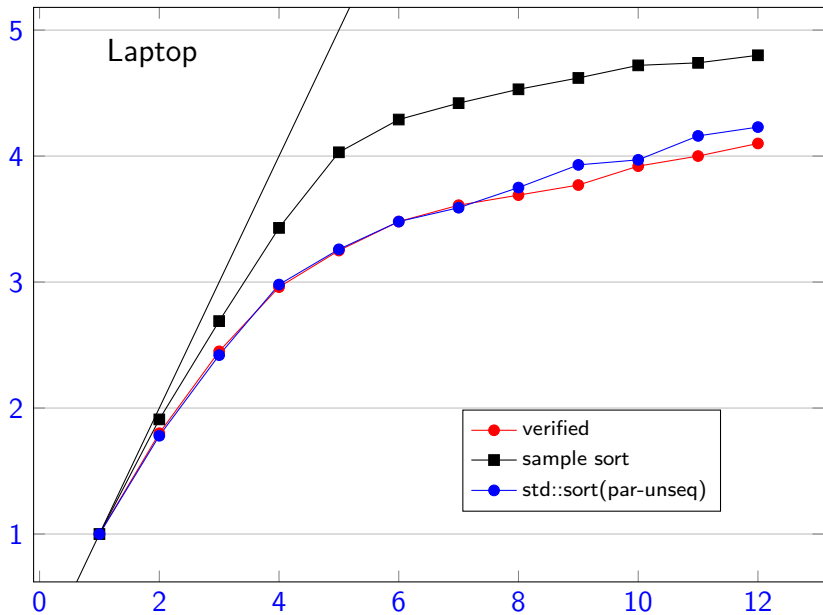
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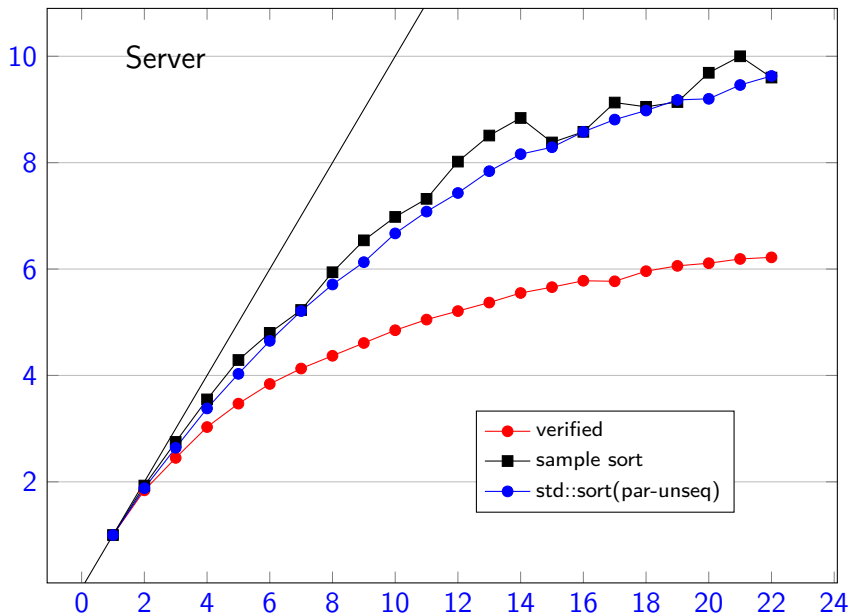
Benchmarks



Speedup



Speedup



Benchmark Interpretation

- our algorithm is competitive for integers
- still some problems for strings
- could scale better to larger number of cores

Where to now?

- More synchronization
- GPUs

Exceptions or Defined Abort

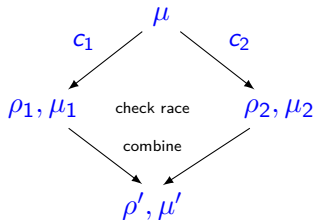
- Example: parallel proof checker
 - if one thread encounters wrong proof, other threads terminate
- Exception Monad.

$$\mu \rightarrow (\alpha \text{ option} \times \rho \times \mu) \text{ set option}$$

- How to handle *nonterm* || *throw*?
 - There still might be a data race (and we should fail).
 - Still sound: *nonterm* || ... = *fail*.

Synchronization

- Recall: parallel operator using access reports



- Access report: set of read/written/allocated/freed addresses
- How far does this idea extend?

Locks/Atomic blocks

- Access report: $A ::= SYNC L A^* \mid (\{R, W, A, F\} addr)^*$
- After parallel execution:
 - fail on deadlock/data race
 - combine using all possible interleavings.
- Reasoning: Separation logic with invariants?
- Patterns for Refinement: ???
- Semantics (\sqsubseteq TCB) gets more complicated
 - are there sweet spots wrt./ expressiveness + simplicity?

GPUs

- Mostly unrestricted parallelism. Barriers for synchronization.
- How powerful are barriers? Can we even simulate them by sequence of `||`?
- LLVM infrastructure available for GPUs.
- How many technical problems to expect?

Conclusion

- Verification of parallel programs
 - stepwise refinement to tackle complexity
 - down to LLVM, small TCB
 - fast verified programs
- Idea: shallow embedding, using access reports
 - backwards compatible with sequential IRF
- Future work
 - GPUs, synchronization, ...
 - What features are required for parallel provers/certificate checkers?

https://www21.in.tum.de/~lammich/isabelle_llvm_par/
https://github.com/lammich/isabelle_llvm/tree/2021-1