Target-aware vectorization for irregular loops or instruction patterns

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SIMD & Vectorization

- **Parallelism** – key to CPU performance in post-Moore's Law era
  - ✓ Thread-level Parallel. (TLP) – multi-core and multi-threading
  - ✓ Instruction-level Parallel. (ILP) – OOO and superscalar
  - ✓ Data-level Parallel. (DLP) – **Single-Instruction Multi-Data (SIMD)**
- **SIMD operations, or ISA**
  - ✓ Intel: MMX, SSE, AVX2, AVX512, AVX10, …
  - ✓ PPC: VMX128, VSX, Altivec, …
  - ✓ ARM: Neon, SVE, SVE2, …
- **SIMD generation**
  - ✓ **Assembly manually/compiler intrinsics**: requires expert experience or developers familiar with hardware ISA
  - ✓ **Compiler automatic vectorization:** loop vectorization, SLP(superword level parallelism)

    Two assumptions: 1) SIMD instruction performs isomorphic operations across all lanes.

    2) SIMD instruction applies the operations elementwise without cross-lane operation.
- **Irregular/complicated SIMD(non-SIMD)** – violate above two assumptions, like operations cross-lane reassociated
  - ✓ COMPLEX, COMPACT, DOT-PRODUCT, HISTCNT, MINMAX… …
  - ✓ Vector library function

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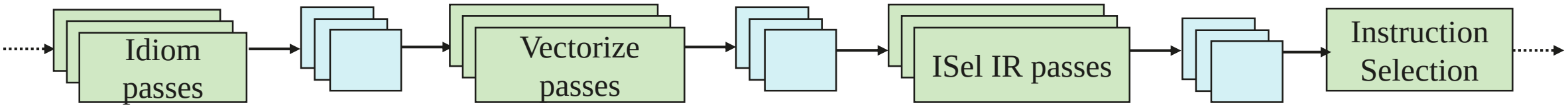
SIMD Passes Pipeline



LoopIdiom	LoopVectorize	(target) IRPasses	SelectionDAG
AArch64Idiom	SLPVectorizer	CodeGenPrepare	GlobalISel
HexagonIdiom	VectorCombine	(target) PreISel	FastISel
…	…	…	…

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“Target Aware” Implementation?

Loop idiom recognition：

[RFC] Vector math function loop idiom recognition - IR & Optimizations / Loop Optimizations - LLVM Discussion Forums

[RFC] CRC Recognition in LoopIdiomRecognizer - IR & Optimizations / Loop Optimizations - LLVM Discussion Forums

[AArch64] Add an AArch64 pass for loop idiom transformations (#72273) · llvm/llvm-project@c714846 · GitHub

VPlan：

[RFC] Vectorization support for histogram count operations - IR & Optimizations / Loop Optimizations - LLVM Discussion Forums

⚙ D158836 [LoopVectorize] Vectorize the compact pattern (llvm.org)

Isel IR Passes：

[AArch64] Generate DOT instructions from matching IR by huntergr-arm · Pull Request #69583 · llvm/llvm-project · GitHub

⚙ D114174 [ARM][CodeGen] Add support for complex deinterleaving (llvm.org)

⚙ D129066 [AArch64][CodeGen] Add AArch64 support for complex deinterleaving (llvm.org)

Instruction selection：

⚙ D49636 [X86] Add matching for another pattern of PMADDWD. (llvm.org)

⚙ D49829 [X86] Add pattern matching for PMADDUBSW (llvm.org)

[AArch64] Lower mathlib call ldexp into fscale when sve is enabled by huhu233 · Pull Request #67552 · llvm/llvm-project · GitHub

Loop Idiom Recognition, Pros and Cons

- **LoopIdiomRecognize pass:** transforms simple loops into a non-loop form

✓ countable loop: MemCpy，MemSet

✓ non-countable loop: Popcnt(Aarch64, PPC,X86, AMDGPU, RISCV with zbb… …)， CTLZ/CTTZ…

- **Target-specific loop idiom recognition:**

✓ HexagonLoopIdiomRecognition: memcpy, memmove, polynomial multiply(pmpyw)

✓ AArch64LoopIdiomTransform: memcmp like pattern(first-faulting loads)

- **Pros:**

✓ **Early enough** in the pipeline, not affected by later optimizations

✓ Target specific or target independent idioms, flexible and easy to implement

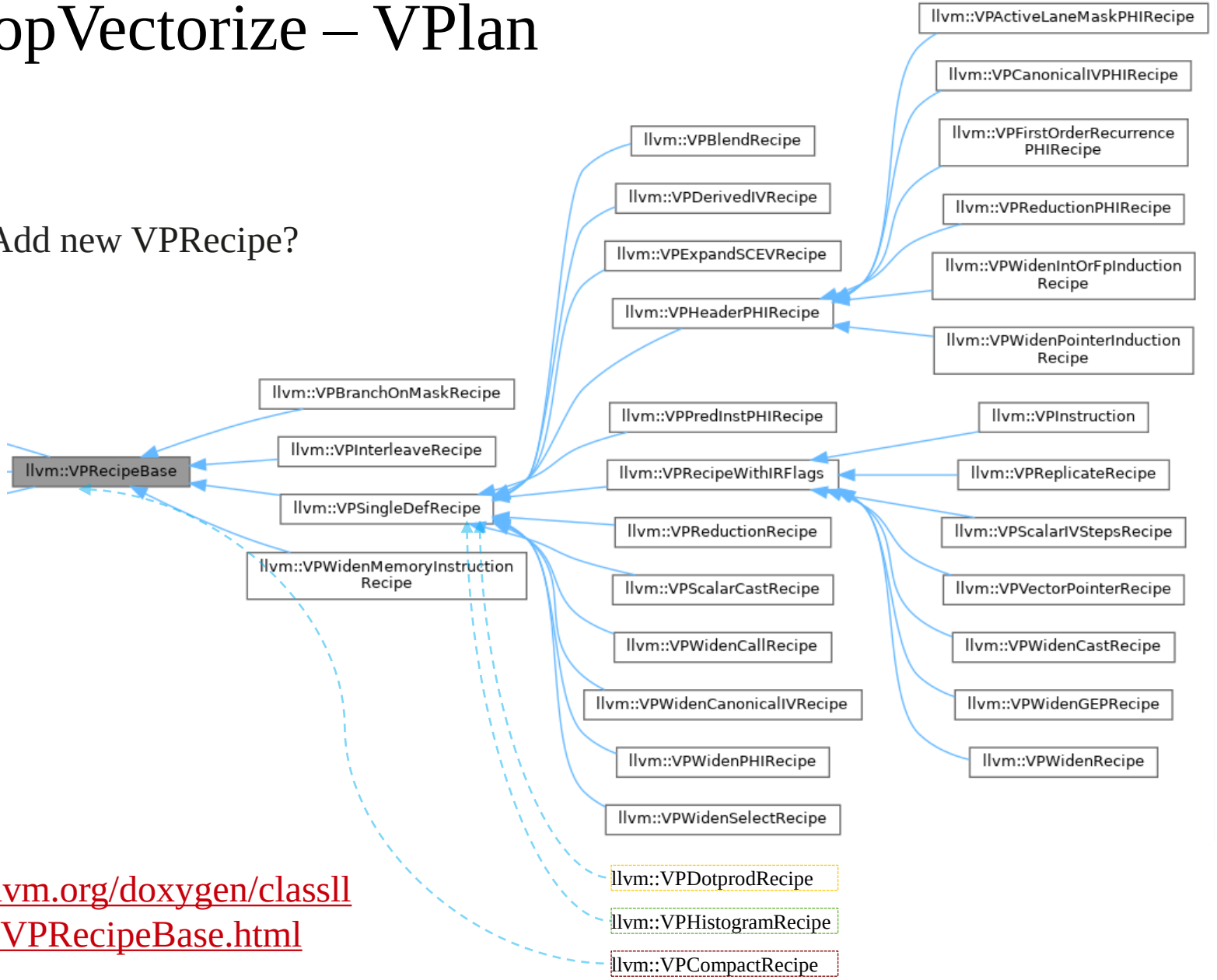
- **Cons:**

✓ Matching the idiom code was hard and pretty fragile, the actual IR was changing (by instcombine, or other passes)

✓ **Too early** in the pipeline, may lose many opportunities for subsequent loop optimization

LoopVectorize – VPlan

- Add new VPRecipe?



Dotprod:

```
(sum: int; a, b: char*)
for (int i = 0; i < N; i++) {
    sum += a[i] * b[i];
}
```

Histogram:

```
for (int i = 0; i < N; ++i) {
    buckets[indices[i]]++;
}
```

Compact:

```
for(i=0; i<N; i++) {
    if(x[i]<a) ref[n++]=B[i];
}
```

https://llvm.org/doxygen/classllvm_1_1VPRecipeBase.html

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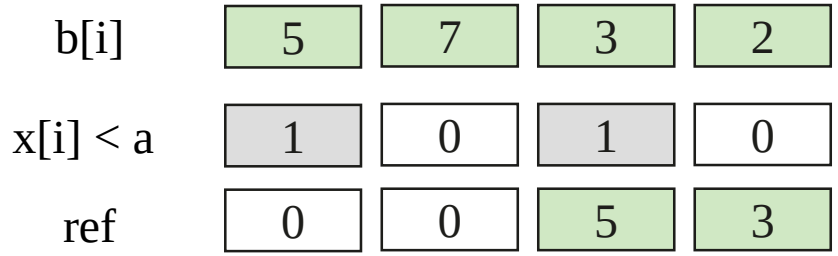
SVE COMPACT

COMPACT <Zd>.<T>, <Pg>, <Zn>.<T>
Shuffle active elements of vector to the right and fill with zero

```
for(i=0; i<N; i++)
  if(x[i]<a) ref[n++]=B[i];
```



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SVE COMPACT

COMPACT <Zd>.<T>, <Pg>, <Zn>.<T>
Shuffle active elements of vector to the right and fill with zero

```
for(i=0; i<N; i++)
  if(x[i]<a) ref[n++]=B[i];
```

b[i]	5	7	3	2
x[i] < a	1	0	1	0
ref	0	0	5	3

- Besides AArch64, x86 AVX512 also supports VPCOMPRESS*
- But until now, LLVM cannot automatically vectorize the above pattern in neither LoopVectorize nor others passes.

```
$ opt -passes=loop-vectorize compact.ll -debug-only=loop-vectorize -force-vector-width=4
LV: Not vectorizing: Found an unidentified PHI   %n.013 = phi i32 [ 0, %for.body.preheader ], [ %n.1, %for.inc ]
remark: <unknown>:0:0: loop not vectorized: value that could not be identified as reduction is used outside the loop
LV: Can't vectorize the instructions or CFG
LV: Not vectorizing: Cannot prove legality.
```

- LLVM already have **llvm.masked.compressstore.*** support, which is exactly a scenario to make use of COMPACT

Why LoopVectorize fails?

- Currently, only limited patterns of phi are supported
  - Induciton phis
  - Reduction phis
  - Fixed-order Recurrence phis
  - If not the above ones, STUCK!

- The presence of unrecognized phis hints the control flow too complex to analyze
  - Need to teach the Loop Vectorizer to understand the control flow

```
for.body:                                         ; preds = %for.body.preheader, %for.inc
  %indvars.iv = phi i64 [ 0, %for.body.preheader ], [ %indvars.iv.next,
%for.inc ]
  %n.013 = phi i32 [ 0, %for.body.preheader ], [ %n.1, %for.inc ]
  %arrayidx = getelementptr inbounds i32, ptr %comp, i64 %indvars.iv
  %0 = load i32, ptr %arrayidx, align 4
  %cmp1 = icmp slt i32 %0, %a
  br i1 %cmp1, label %if.then, label %for.inc

if.then:                                          ; preds = %for.body
  %arrayidx3 = getelementptr inbounds i32, ptr %B, i64 %indvars.iv
  %1 = load i32, ptr %arrayidx3, align 4
  %inc = add nsw i32 %n.013, 1
  %idxprom4 = sext i32 %n.013 to i64
  %arrayidx5 = getelementptr inbounds i32, ptr %Out_ref, i64 %idxprom4
  store i32 %1, ptr %arrayidx5, align 4
  br label %for.inc

for.inc:                                          ; preds = %for.body, %if.then
  %n.1 = phi i32 [ %inc, %if.then ], [ %n.013, %for.body ]
  %indvars.iv.next = add nuw nsw i64 %indvars.iv, 1
  %exitcond.not = icmp eq i64 %indvars.iv.next, %wide.trip.count
  br i1 %exitcond.not, label %for.end, label %for.body
```

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What we need to do?

```
for.body:                                         ; preds = %for.body.preheader, %for.inc
  %indvars.iv = phi i64 [ 0, %for.body.preheader ], [ %indvars.iv.next,
%for.inc ]
  %n.013 = phi i32 [ 0, %for.body.preheader ], [ %n.1, %for.inc ]
  %arrayidx = getelementptr inbounds i32, ptr %comp, i64 %indvars.iv
  %0 = load i32, ptr %arrayidx, align 4
  %cmp1 = icmp slt i32 %0, %a
  br i1 %cmp1, label %if.then, label %for.inc

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  %inc = add nsw i32 %n.013, 1
  %idxprom4 = sext i32 %n.013 to i64
  %arrayidx5 = getelementptr inbounds i32, ptr %Out_ref, i64 %idxprom4
  store i32 %1, ptr %arrayidx5, align 4
  br label %for.inc

for.inc:                                          ; preds = %for.body, %if.then
  %n.1 = phi i32 [ %inc, %if.then ], [ %n.013, %for.body ]
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  br i1 %exitcond.not, label %for.end, label %for.body
```

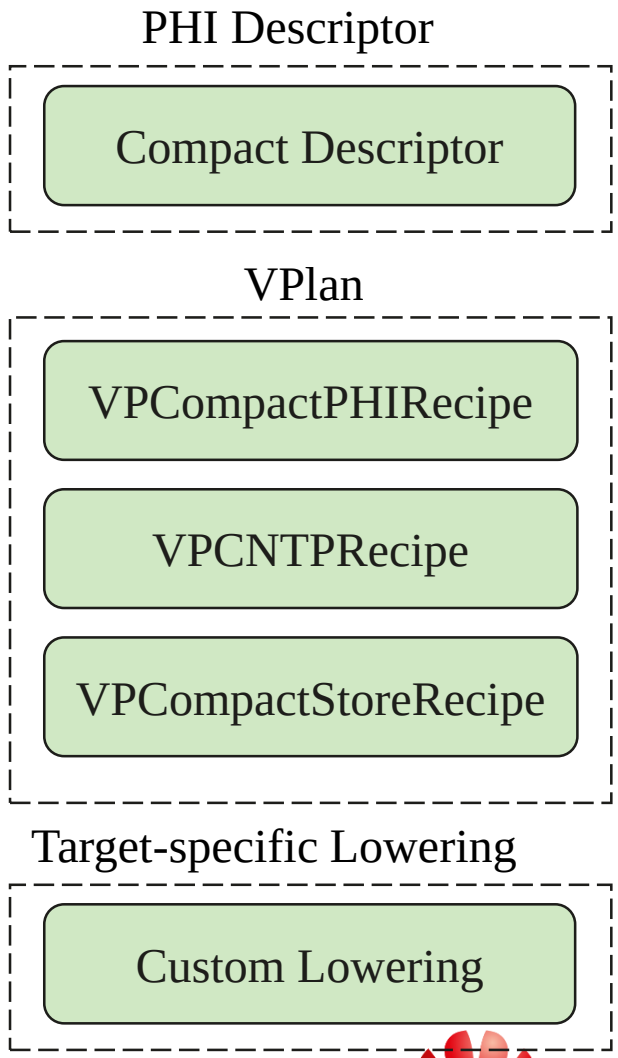

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New Header PHI Descriptor

```
for.body:                                         ; preds = %for.body.preheader, %for.inc
  %n.013 = phi i32 [ 0, %for.body.preheader ], [ %n.1, %for.inc ]


  %cmp1 = icmp slt i32 %0, %a

if.then:                                          ; preds = %for.body


  %inc = add nsw i32 %n.013, 1
  %idxprom4 = sext i32 %n.013 to i64
  %arrayidx5 = getelementptr inbounds i32, ptr %Out_ref, i64 %idxprom4
  store i32 %1, ptr %arrayidx5, align 4
  br label %for.inc

for.inc:                                          ; preds = %for.body, %if.then
  %n.1 = phi i32 [ %inc, %if.then ], [ %n.013, %for.body ]


  br i1 %exitcond.not, label %for.end, label %for.body
```

Compact Descriptor

Compact Header PHI

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New Header PHI Descriptor

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  %cmp1 = icmp slt i32 %0, %a

if.then:                                          ; preds = %for.body

  %inc = add nsw i32 %n.013, 1
  %idxprom4 = sext i32 %n.013 to i64
  %arrayidx5 = getelementptr inbounds i32, ptr %Out_ref, i64 %idxprom4
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  br label %for.inc

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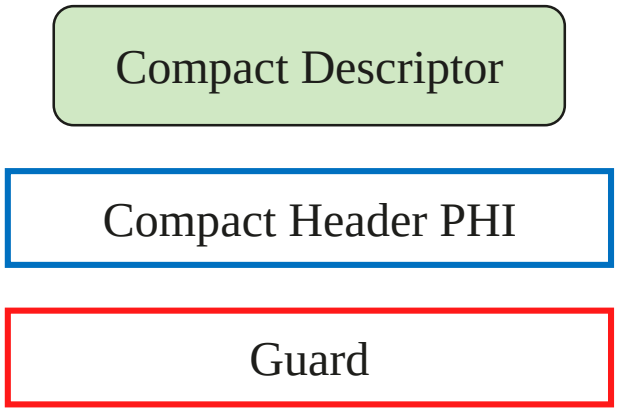

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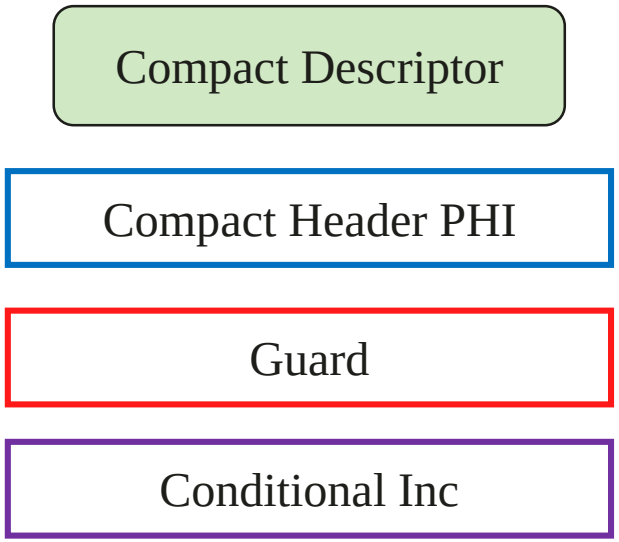

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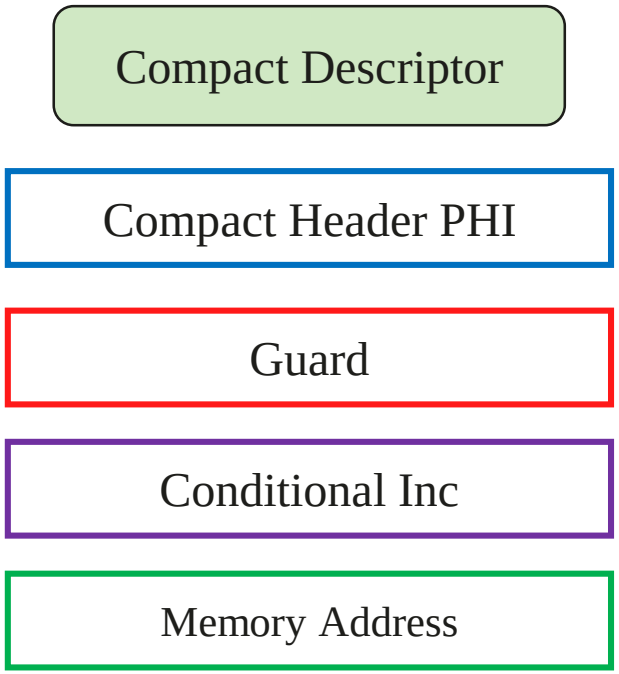

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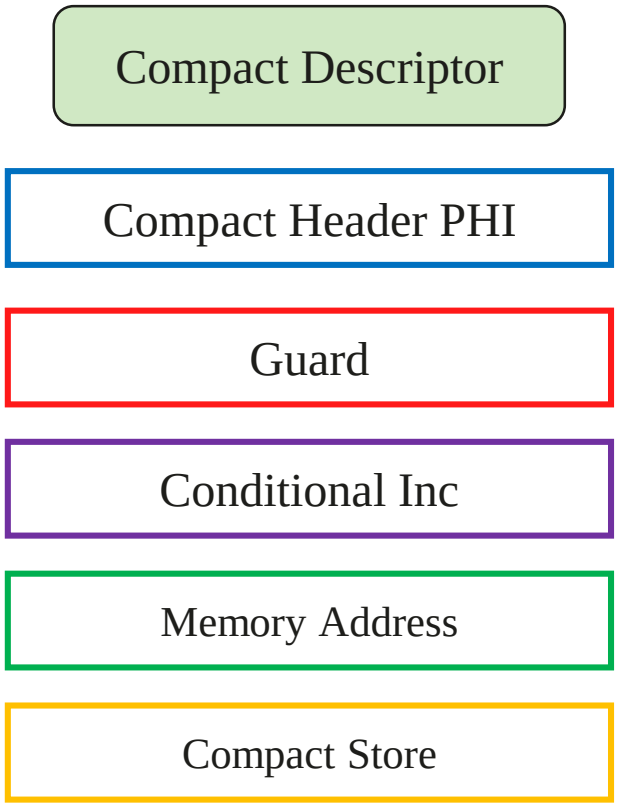

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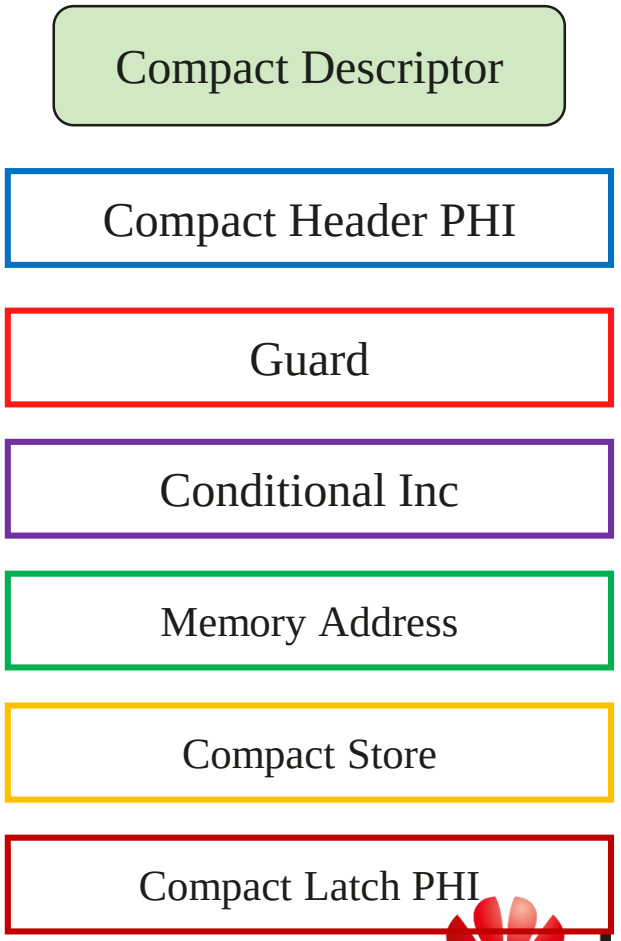

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New VPlan Recipes

Compact Descriptor

Compact Header PHI

Guard

Conditional Inc

Memory Address

Compact Store

Compact Latch PHI

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New VPlan Recipes

Compact Descriptor	New VPlan Recipes
Compact Header PHI	VPCompactPHIRecipe
Guard	
Conditional Inc	VPCNTPRecipe
Memory Address	
Compact Store	VPCompactRecipe
Compact Latch PHI	

```
<x1> vector loop: {
  vector.body:
    EMIT vp<%3> = CANONICAL-INDUCTION ir<0>, vp<%17>
    vp<%4> = SCALAR-STEPS vp<%3>, ir<1>
    COMPACT-PHI ir<%n.013> = phi ir<0>, ir<%n.1>
    CLONE ir<%arrayidx> = getelementptr inbounds ir<%comp>, vp<%4>
    vp<%7> = vector-pointer ir<%arrayidx>
    WIDEN ir<%0> = load vp<%7>
    WIDEN ir<%cmp1> = icmp slt ir<%0>, ir<%a>
    CLONE ir<%arrayidx3> = getelementptr ir<%B>, vp<%4>
    vp<%11> = vector-pointer ir<%arrayidx3>
    WIDEN ir<%1> = load vp<%11>, ir<%cmp1>
    ir<%inc> = CNTP ir<%n.013>, ir<1>, ir<%cmp1>
    CLONE ir<%idxprom4> = sext  ir<%n.013> to i64
    CLONE ir<%arrayidx5> = getelementptr inbounds ir<%Out_ref>, ir<%idxprom4
    COMPACT store ir<%1>, ir<%arrayidx5>
    ir<%n.1> = CNTP ir<%inc>, ir<%n.013>, ir<%cmp1>
    EMIT vp<%17> = add nuw vp<%3>, ir<4>
    EMIT branch-on-count vp<%17>, ir<%n.vec>
  No successors
}
```

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Transform VPlan to IR

VPlan

```
<x1> vector loop: {
  vector.body:
    EMIT vp<%3> = CANONICAL-INDUCTION ir<0>, vp<%17>
    vp<%4> = SCALAR-STEPS vp<%3>, ir<1>
    COMPACT-PHI ir<%n.013> = phi ir<0>, ir<%n.1>
    CLONE ir<%arrayidx> = getelementptr inbounds ir<%comp>, vp<%4>
    vp<%7> = vector-pointer ir<%arrayidx>
    WIDEN ir<%0> = load vp<%7>
    WIDEN ir<%cmp1> = icmp slt ir<%0>, ir<%a>
    CLONE ir<%arrayidx3> = getelementptr ir<%B>, vp<%4>
    vp<%11> = vector-pointer ir<%arrayidx3>
    WIDEN ir<%1> = load vp<%11>, ir<%cmp1>
    ir<%inc> = CNTP ir<%n.013>, ir<1>, ir<%cmp1>
    CLONE ir<%idxprom4> = sext  ir<%n.013> to i64
    CLONE ir<%arrayidx5> = getelementptr inbounds ir<%Out_ref>, ir<%idxprom4>
    COMPACT store ir<%1>, ir<%arrayidx5>
    ir<%n.1> = CNTP ir<%inc>, ir<%n.013>, ir<%cmp1>
    EMIT vp<%17> = add nuw vp<%3>, ir<4>
    EMIT branch-on-count vp<%17>, ir<%n.vec>
  No successors
}
```

Output IR

```
%cs = llvm.masked.compressstore.v4i32(
<4 x i32>  %val, ptr %base, <4 x i1>
%cmp)
```

COMPACT

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Transform VPlan to IR

VPlan

```
<x1> vector loop: {
  vector.body:
    EMIT vp<%3> = CANONICAL-INDUCTION ir<0>, vp<%17>
    vp<%4> = SCALAR-STEPS vp<%3>, ir<1>
    COMPACT-PHI ir<%n.013> = phi ir<0>, ir<%n.1>
    CLONE ir<%arrayidx> = getelementptr inbounds ir<%comp>, vp<%4>
    vp<%7> = vector-pointer ir<%arrayidx>
    WIDEN ir<%0> = load vp<%7>
    WIDEN ir<%cmp1> = icmp slt ir<%0>, ir<%a>
    CLONE ir<%arrayidx3> = getelementptr ir<%B>, vp<%4>
    vp<%11> = vector-pointer ir<%arrayidx3>
    WIDEN ir<%1> = load vp<%11>, ir<%cmp1>
    ir<%inc> = CNTP ir<%n.013>, ir<1>, ir<%cmp1>
    CLONE ir<%idxprom4> = sext  ir<%n.013> to i64
    CLONE ir<%arrayidx5> = getelementptr inbounds ir<%Out_ref>, ir<%idxprom4>
    COMPACT store ir<%1>, ir<%arrayidx5>
    ir<%n.1> = CNTP ir<%inc>, ir<%n.013>, ir<%cmp1>
    EMIT vp<%17> = add nuw vp<%3>, ir<4>
    EMIT branch-on-count vp<%17>, ir<%n.vec>
  No successors
}
```

Output IR

```
%cs = llvm.masked.compressstore.v4i32(
<4 x i32>  %val, ptr %base, <4 x i1>
%cmp)
```

→ COMPACT

```
%prom = zext <4 x i1> %cmp to <4 x i32>
%cntp = llvm.vector.reduce.add.v4i32(<4 x i32> %prom)
```

→ CNTP

- GitHub POC : https://github.com/llvm/llvm-project/pull/68980

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Can be generalized further

- Now we have support vectorization of:

```
for(i=0; i<N; i++)
  if(x[i]<a) ref[n++]=B[i];
```

- But the following patterns still fail:

```
j = -1;
for (int i = 0; i < LEN_1D; i++)
    if (a[i] < (real_t)0.) {
        j = i;
```

Example: TSVC s331

CLASTB <R><dn>, <Pg>, <R><dn>, <Zm>.<T>
Conditionally extract last element to general-purpose register.

```
for(i=0; i<N; i++)
  if(x[i]<a) sum += n++;
```

```
for.body4:                                        ; preds = %for.cond1.preheader, %for.body4
  %indvars.iv = phi i64 [ %indvars.iv.next, %for.body4 ], [ 0, %for.cond1.preheader ]
  %j.015 = phi i32 [ %spec.select, %for.body4 ], [ -1, %for.cond1.preheader ]
  %arrayidx = getelementptr inbounds i32, ptr %a, i64 %indvars.iv
  %0 = load i32, ptr %arrayidx, align 4, !tbaa !8
  %cmp5 = icmp slt i32 %0, 0
  %1 = trunc i64 %indvars.iv to i32
  %spec.select = select i1 %cmp5, i32 %1, i32 %j.015
  %indvars.iv.next = add nuw nsw i64 %indvars.iv, 1
  %exitcond.not = icmp eq i64 %indvars.iv.next, %wide.trip.count
  br i1 %exitcond.not, label %for.cond.cleanup3, label %for.body4, !llvm.loop !12
```

Control flow simplified by SimplifyCFG pass

- SELECT is generated by if-conversion to simplify CFG, which was important for the legacy loop vectorizer, but for VPlan?
- Currently, phis with select input are modeled in recurrence recipes, while those with “unsafe” control flow unrecognized, it might be worth thinking about unifying them, given the similar underneath control flow.

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Low-hanging fruit: one-to-one native instruction

- SVE FSCALE is a native instruction for ldexp("load exponent"), and LLVM already supports ‘llvm.ldexp.*’intrinsic

FSCALE <Zdn>.<T>, <Pg>/M, <Zdn>.<T>, <Zm>.<T>
Floating-point adjust exponent by vector (predicated)

num	5	7	3	2
exp	1	2	3	4
mask	1	0	1	0
result	$5*2^1$	0	$3*2^3$	0

```
for (int i = 0 ; i < n; ++i) {
  sum += ldexp(a[i], exps[i]);
}
```

LV: Not vectorizing: **Found a non-intrinsic callsite**
%call = tail call double @ldexp(double noundef %0, i32 noundef %1) #2

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FSCALE <Zdn>.<T>, <Pg>/M, <Zdn>.<T>, <Zm>.<T>
Floating-point adjust exponent by vector (predicated)

num	5	7	3	2
exp	1	2	3	4
mask	1	0	1	0
result	$5*2^1$	0	$3*2^3$	0

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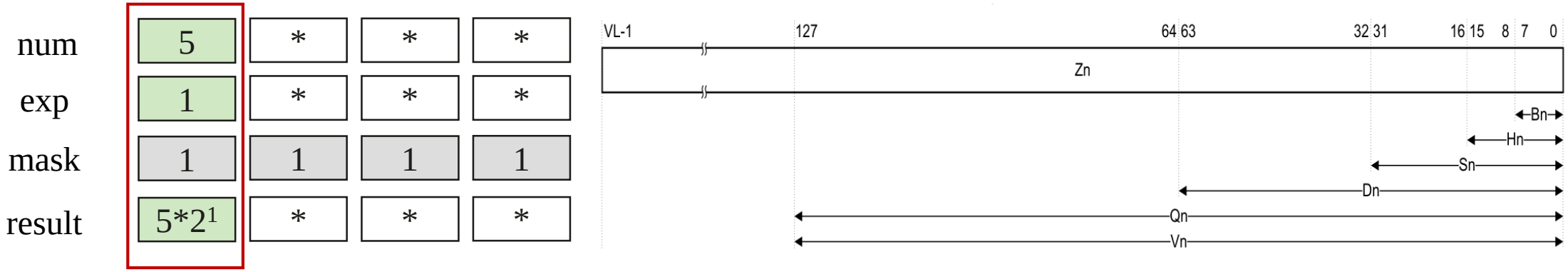
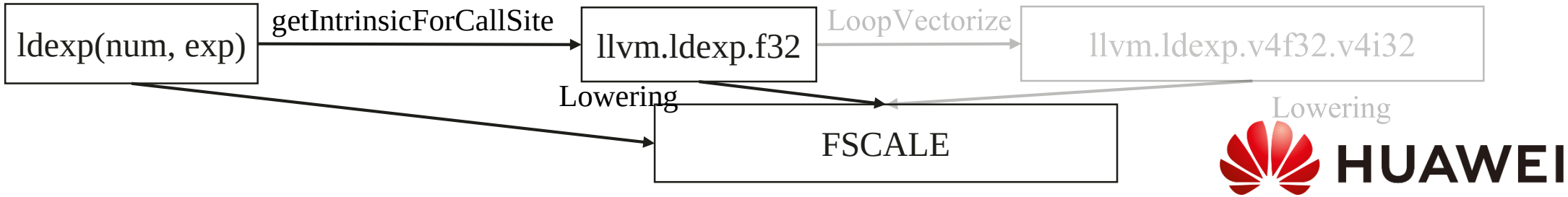
Low-hanging fruit: one-to-one native instruction

- SVE FSCALE is a native instruction for ldexp("load exponent"), and LLVM already supports ‘llvm.ldexp.*’intrinsic

FSCALE <Zdn>.<T>, <Pg>/M, <Zdn>.<T>, <Zm>.<T>
Floating-point adjust exponent by vector (predicated)



› Even there’s no loop or the loop cannot be vectorized, due to SIMD register file overlapping, it can also bring performance benefit



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More ongoing work

HISTCNT <Zd>.<T>, <Pg>/Z, <Zn>.<T>, <Zm>.<T>
Count matching elements in vector

- Also SVE2 HISTCNT is a native instruction for histogram computation
  - More generally, can be used for “conflict detection” like x86 AVX512-CD instructions
  - In community there’s already RFC raised by Arm to support it: Discourse#74788

[RFC] Vectorization support for histogram count operations

IR & Optimizations Loop Optimizations

paschalis.mpeis Nov 2023

Hello community,

We would like to propose a mechanism that detects and safely vectorizes histogram computations. This is a work in progress, and a Proof-of-Concept Pull Request will be opened in the coming days.

HUAWEI

Thank you.

Bring digital to every person, home and organization for a fully connected, intelligent world.