

# Knights Landing Vectorization

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## Advanced Vector eXtensions

- Vectorization:  
Execution of 16 single or 8 double precision math operations **at once**
- AVX-512
- Set of vectorization operations
- Can be used
  - automatically (compiler)
  - or enforced (programmer – pragmas)

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## Optimization report

- Two helpers
  - Vector Advisor analyzer
  - Optimization report
- Intel Compiler has an option  
**-qopt-report=n**

that will generate \*.oprpt file

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## Optimization report

- Long and detailed

```
Report from: Code generation optimizations
Hardware registers
Reserved      : 2[ rsp rip]
Available     : 39[ rax rdx rcx rbx rbp rsi rdi r8-r15 mm0-mm7 zmm0-zmm15]
Callee-saved  : 6[ rbx rbp r12-r15]
Assigned      : 8[ rax rdx rcx rsi rdi r8 r12-r13]
Routine temporaries      Total      : 67
Global        : 16
Local         : 51
Regenerable   : 21
Spilled       : 2
Routine stack
Variables     : 286 bytes*
Reads         : 4 [3.00e+00 ~ 3.4%]
Writes        : 8 [6.00e+00 ~ 6.9%]
Spills        : 0 bytes*
Reads         : 0 [0.00e+00 ~ 0.0%]
Writes        : 0 [0.00e+00 ~ 0.0%]
```

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# Optimization report

- Parts to pay attention to:

```
Begin optimization report for: Sum(float *, float *, float *, long)

Report from: Interprocedural optimizations [ipo]

INLINE REPORT: (Sum(float *, float *, float *, long)) [2] main.cpp(15,52)

Report from: OpenMP optimizations [openmp]

main.cpp(18:1-18:1):OMP:_Z3SumPfs_S_1: OpenMP DEFINED REGION WAS PARALLELIZED
main.cpp(26:1-26:1):OMP:_Z3SumPfs_S_1: OpenMP DEFINED REGION WAS PARALLELIZED

Report from: Loop nest, Vector & Auto-parallelization optimizations [loop, vec, par]

LOOP BEGIN at main.cpp(29,3)
  remark #15523: loop was not vectorized: loop control variable i was found, but loop
iteration count cannot be computed before executing the loop LOOP END

Report from: Code generation optimizations [cg]

main.cpp(15,52):remark #34051: REGISTER ALLOCATION : [_Z3SumPfs_S_1] main.cpp:15
```

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# How to vectorize?

Design your code with vectorization in mind by using:

## 1) Libraries

## 2) Auto vectorization

## 3) SIMD directives

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# SIMD directives example

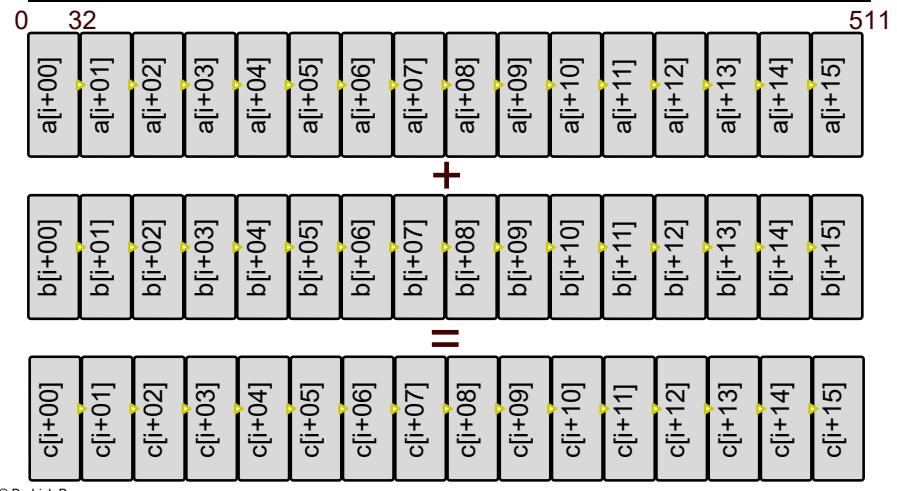
- Simple vectorization

```
__declspec(align(16)) float a[max], b[max], c[max];
for (i=0;i<MAX;i++)
  c[i]=a[i]+b[i];
```

`__declspec` is a C++ 11 construct

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# SIMD directives example



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## SIMD Example

```
__declspec(aligned(64)) float x[1000], x2[1000];

void foo(float * restrict a, int n, int n1, int n2) {
    int i;
    __assume_aligned(a, 64);
    __assume(n1%16==0);
    __assume(n2%16==0);

    for(i=0;i<n;i++) { // Compiler vectorizes loop with all aligned accesses
        x[i] += a[i] + a[i+n1] + a[i-n1] + a[i+n2] + a[i-n2];
    }

    for(i=0;i<n;i++) { // Compiler vectorizes loop with all aligned accesses
        x2[i] += x[i]*a[i];
    }
}
```

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© <https://software.intel.com/en-us/articles/data-alignment-to-assist-vectorization>

## Data Layout

- Vector parallelism  
the same operation on multiple pairs of data
- AVX-512 uses ZMM registers  
<https://software.intel.com/en-us/blogs/2013/avx-512-instructions>
- The data needs to flow in and out for maximum performance

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## Gather vs. Scatter

- *Gather*  
applications that are typically grid centric and accumulate values in the vertices (Eulerian approach to CFD)
- *Scatter*  
tasks are location oriented (particles) and measure contribution of the particle to the neighborhood (Lagrangian approach)

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## Data Layout

- Data aligned and packed in memory
  - 16 floats can be loaded by a single instruction
  - unaligned data require more instructions
  - gather - scatter and permute strategies
  - extra instructions can have performance hit

# Data Layout

- Data locality
  - Fetch from cache not memory if possible
    - Memory prefetch to L2, L2 to L1
    - Hardware or software prefetch
    - Inserted by compiler automatically
      - or
      - use `mm_prefetch` intrinsics
  - Data reuse
    - Temporal locality – data used later can be prefetched
    - Streaming stores – disable caching for write only

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# Data Alignment

- Aligned dynamic memory allocation

```
void *_mm_malloc(int size, int base)
```

for MCDRAM:

```
int hbw_posix_memalign(void **memptr,
                       size_t alignment,
                       size_t size)

int hbw_posix_memalign_psize(void **memptr,
                            size_t alignment,
                            size_t size,
                            int pagesize)
```

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# Data Alignment

- Aligned static memory allocation

```
__attribute__((align(64))) float a[MAX];      //linux gcc
__declspec(align(64)) float a[MAX];           //windows
```

the Intel compiler accepts both

there is also a compiler directive (`align`)

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# Data Alignment

- Two step process
  - Align the data
  - Let the compiler know
- Letting know:

```
__assume_aligned(variable, bits)
```

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## Data Alignment

- Example:

```
void foo(double x[], double y[], int n){  
    __assume_aligned(x, 64);  
    __assume_aligned(y, 64);  
    for (int i=0; i<n; i++)  
        x[i]=y[i]/2.0;  
}
```

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## Prefetching - compiler

- Hardware prefetchers are efficient
- Compiler can be set to

**-opt-prefetch=n** //linux  
**/Qopt-prefetch:n** //Win

n=1,2,..,4

four being the most aggressive

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## Prefetching - pragma

- Compiler prefetch
- Compiler can be set to

**#pragma prefetch var:hint:distance**

**hint** 0 for L1 cache  
1 for L2

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## Prefetching – pragma - example

```
#pragma prefetch tab:1:30  
#pragma prefetch tab:0:6  
//vprefetch1 for tab with a distance of 30 vectorized iterations ahead  
//vprefetch0 for tab with a distance of 6 vectorized iterations ahead  
//If pragmas are not present, compiler chooses both distance values  
  
for (i=0; i<2*n; i++) {  
    tab[i*maxl + k] = i;  
}
```

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## Prefetch - pragma, noprefetch

- variables can be explicitly not prefetched

```
#pragma noprefetch b
#pragma prefetch a
for(i=0; i<MAX; i++) {
    a[i]=b[i]+1;
}
```

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## Prefetch - manual

- manual prefetching
- use only after all others failed..
- disable compiler prefetch
- can lead excessive memory communication

```
void _mm_prefetch(char const *address, int hint)
hint: _MM_HINT_T1, _MM_HINT_T0
```

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## Streaming Stores

- instructions for filling a continuous stream without gaps
- does not use caches

```
Linux and Mac OS X: -opt-streaming-stores keyword
Windows: /Qopt-streaming-stores:keyword
keyword
always the compiler optimizes
never
auto lets the compiler decide which instructions to use (default)
```

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## #pragma vector nontemporal

- generates nontemporal hints on stores

```
float a[1024];
void foo(int N){
    int i;
    #pragma vector nontemporal
    for (i = 0; i < N; i++) {
        a[i] = 1;
    }
}
```

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## #pragma vector nontemporal

- generates nontemporal hints on stores

```
double A[1000];
double B[1000];
void foo(int n){
    int i;
#pragma vector nontemporal (A, B)
    for (i=0; i<n; i++){
        A[i] = 0;
        B[i] = i;
    }
}
```

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## #pragma vector aligned

- informs compiler the data is aligned

```
void vec_aligned(float *a, int m, int c) {
    int i;
    // Instruct compiler to ignore assumed vector dependencies.
#pragma vector aligned
    for (i = 0; i < m; i++)
        a[i] = a[i] * c;
    // Alignment unknown but compiler can still align.
    for (i = 0; i < 100; i++)
        a[i] = a[i] + 1.0f;
}
```

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## #pragma vector always

```
void vec_always(int *a, int *b, int m) {
    #pragma vector always
    for(int i = 0; i <= m; i++)
        a[32*i] = b[99*i];
}
```

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## When will a loop vectorize?

- if nested, must be the inner one  
(outer loops are auto parallelized OpenMP)
- Must contain a single strain-code line  
(no jumps or branches)
- The loop must be countable  
(the # is known before the loop starts)
- no backward loop-carried dependencies

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## When will a loop vectorize?

```
for (i=0;i<MAX;i++){
    a[i]=b[i]+c[i];
    d[i]=e[i]-a[i-1]; //OK a[i-1] is valid
}
```

```
for (i=0;i<MAX;i++){
    d[i]=e[i]-a[i-1];
    a[i]=b[i]-c[i];//not OK a[i-1] is needed
}
```

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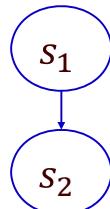
## Data Dependence and Loops

- Given two program statements  $s_1$  and  $s_2$
- We say  $s_2$  depends on  $s_1$  if they share a memory location and one of them writes there

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## Flow (true) dependence

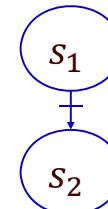
- Ex:  
 $s_1 : x = a + b;$   
 $s_2 : c = x * 10;$



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## Anti dependence (backward)

- Cannot be reordered
- Ex:  
 $s_1 : a = x + b;$   
 $s_2 : x = c + d;$

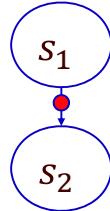


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## Output dependence

- Ex:

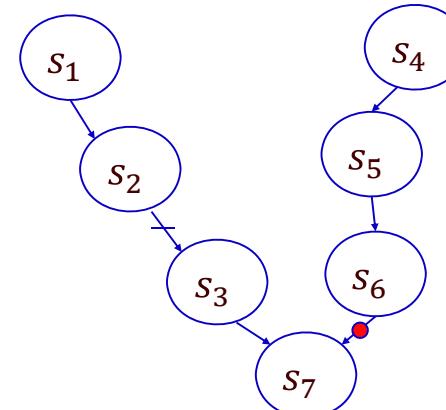
$s_1 : x = a + b;$   
 $s_2 : x = c + d;$



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## Parallel vs Sequential

$s_1, s_2, s_3$  can be executed in parallel with  $s_4, s_5, s_6$ :



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## Loop Data Dependencies

- Example of loop data dependency

```
for (i=0;i<n;i++){  
    a[i]=b[i]/2.f;  
    c[i]=c[i+1]*a[i];  
}
```

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## How to fix loops?

- Loop Interchange
- Loop Fission
- Loop Fusion
- Loop Peeling
- Loop Unrolling
- Loop Reversal

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## Loop Interchange

- perfectly nested loops
- no mutual dependency

```
for (int i=0;i<n;i++)  
for (int j=0;j<n;j++)  
    sum+=a[i][j];
```

```
for (int j=0;j<n;j++)  
for (int i=0;i<n;i++)  
    sum+=a[i][j];
```

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## Loop Fission (Loop Splitting)

```
for (int i=0;i<n;i++){  
    b[i]=i;  
    for (int j=0;j<n;j++)  
    {  
        a[i][j]+=a[i-1][j];  
        sum+=a[i][j];  
    }  
}
```

```
for (int i=0;i<n;i++)  
    b[i]=i;  
for (int i=0;i<n;i++)  
for (int j=0;j<n;j++)  
    a[i][j]+=a[i-1][j];  
    sum+=a[i][j];  
}
```

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## Loop Fission (Loop Splitting)

- possible for loops with independent parts
- changes the order of the execution and can help alignment, caches, etc.

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## Loop Fusion

- The inverse of loop fission
- Reduces granularity
- Allows more work to be done in parallel on one thread

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## Loop Peeling

- Takes the first(s) and/or the last(s) iterations
- Enforces initializations

```
for (int i=0;i<n;i++){
    c[i]=a[i]+b[i];
}
c[0]=a[0]+b[0];
for (int i=1;i<n-1;i++){
    c[i]=a[i]+b[i];
}
c[n-1]=a[n-1]+b[n-1];
```

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## Loop unrolling

- Carefully!  
The compiler is efficient at vectorization if a loop is **not** manually unrolled
- Unrolling:

```
void Loop(int *a, int *b) {
    for(int i = 0; i <= 3; i++)
        a[i] = b[i];
}
```

```
void Unrolled(int *a, int *b) {
    a[0] = b[0];
    a[1] = b[1];
    a[2] = b[2];
}
```

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## Loop unrolling

- Let the compiler do it
- n – how many times

```
#pragma unroll n
#pragma nounroll
```

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## Loop unrolling

```
void unroll(int *a, int *b,
            int *c, int *d) {
    #pragma unroll(4) //inner loop
    for (int i = 1; i < 100; i++) {
        b[i] = a[i] + 1;
        d[i] = c[i] + 1;
    }
}
```

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<https://software.intel.com/en-us/node/524556>

## Loop unrolling

```
int m = 0;
int dir[4] = {1,2,3,4};
int data[10];
#pragma unroll (4) // outer loop unrolling
for (int i = 0; i < 4; i++) {
    for (int j = dir[i]; data[j]==N; j+=dir[i])
        m++;
}
```

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[© https://software.intel.com/en-us/node/524556](https://software.intel.com/en-us/node/524556)

## Loop Reversal

- Runs the loop backwards
- Valid only for independent variables

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## Memory Disambiguation

- Assume

```
void foo(float *a, float *b, float *c, int n){
    for (int i = 0; i < n; i++){
        a[i] = c[i] * b[i];
        b[i] = a[i] + c[i];
    }
```

- The compiler does NOT assume a, b, c are independent! **No vectorization at all!!**
- a[2] could be c[0]

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## Memory Disambiguation

- You can let the compiler know

```
void foo(float *restrict a,
         float *restrict b,
         float *restrict c, int n){
    for (int i = 0; i < n; i++){
        a[i] = c[i] * b[i];
        b[i] = a[i] + c[i];
    }
```

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## Memory Disambiguation

- You can let the compiler know that they are not dependent by `ivdep`

```
void foo(float *a, float *b, float *c, int n){  
#pragma ivdep  
    for (int i = 0;i<n;i++){  
        a[i]=c[i]*b[i];  
        b[i]=a[i]+c[i];  
    }
```

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## #pragma ivdep

- Example:
- The code will NOT vectorize automatically
- $k$  is not known and indexing invalid for  $k < 0$

```
void indep(int *a, int k, int c, int n){  
    for (int i = 0;i<n;i++)  
        a[i]=a[i+k]+c;  
}
```

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## #pragma ivdep

- If YOU know, you can tell

```
void indep(int *a, int k, int c, int n){  
#pragma ivdep  
    for (int i = 0;i<n;i++)  
        a[i]=a[i+k]+c;  
}
```

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## #pragma ivdep

- Another example when ivdep will help

```
#pragma ivdep  
for (i = 0;i<n;i++)  
    a[b[i]]=a[b[i]]+1;
```

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## #pragma omp simd

- Enforces loop vectorization
- Not restricted to inner loops

```
#pragma omp simd
for (int i = 0;i<n;i++){
    while (a[i]>threshold)
        a[i]*=0.5;
}
```

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## #pragma omp simd

- Can be combined with parallel for

```
char foo(char *a, int n){
    int k;
    char c=0;
    #pragma omp parallel for simd
    for (k=0;k<n;k++){
        c=c+a[k];
    }
    return c;
}
```

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## vector always, ivdep, and simd

- **#pragma ivdep**
  - checks for some dependencies
- **#pragma vector always**
  - will not vectorize if there is no gain
- **#pragma simd**
  - does not check for any dependencies you are responsible
  - will always vectorize

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## When will SIMD vectorize?

- Countable loops (no break, continue inside)
- Weird non-math operators
- Complex array subscripts
- Low number of iteration loops
- Large loop bodies
- Some C++ exception handlings

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## fast vs precise math

- **-fp-model=fast**
  - is a compiler directive for fast math
  - this will very likely vectorize
- **-fp-model=precise**
  - is a compiler directive for precise math
  - this may not vectorize
  - parallel computation may not guarantee the same results

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## SIMD vectorization

- Be careful...
- SIMD will always vectorize, but it does not mean it will be good
- You may not achieve **automatic** vectorization by other pragmas, SIMD will force it

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## SIMD directive clauses

- SIMD has additional clauses
  - **PRIVATE, LASTPRIVATE, LINEAR, REDUCTION**
- See Chapter 9 for details

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## Compiler summary

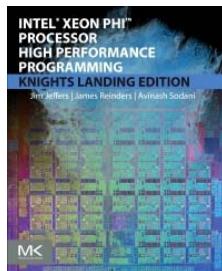
Syntax of Hint	Semantics
#pragma ivdep	discard assumed data dependences
#pragma vector always	override efficiency heuristics
#pragma vector nontemporal	enable streaming stores
#pragma vector [un]aligned	assert [un]aligned property
#pragma novector	disable vectorization
#pragma distribute point	suggest point for loop distribution
#pragma loop count (<int>)	estimate trip count
restrict	assert exclusive access through pointer
_declspec(align(<int>,<int>))	suggest memory alignment
_assume_aligned(<var>,<int>)	assert alignment property

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from  
<https://software.intel.com/en-us/articles/vectorization-with-the-intel-compilers-part-i>

# Reading

- Intel Xeon Phi Processor High Performance Programming Knights Landing Edition
- James Jeffers, James Reinders, and Avinash Sodani
- ISBN: 9780128091944
- Morgan Kaufmann
- Chapter 9



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