

## Hands-on "Vectorization"

- Automatic Vectorization
  - Vectorization Report
- Guided Vectorization
  - `pragma simd`
  - `pragma ivdep`
  - `restrict`
- Intel Advisor
  - Create Advisor Project
  - Collect Survey Data
  - Change xhost
- Matrix Multiplication
  - New advisor Project
  - Collect Survey Data
  - Check Trip Count
  - Check Dependencies
  - Memory Access Patterns

1) Compile the example with `vec-report6` and `O3`

```
icc VectorizationHandson.c -o VectorizationHandson -vec-report6 -O3
```

2) Open the vectorization report (`VectorizationHandson.optrpt`)

Note that the loop on function `main` was automatically vectorized;

**remark #15300: LOOP WAS VECTORIZED**

Note that the loop on function `add_floats` was not automatically vectorized;

**remark #15344: loop was not vectorized: vector dependence prevents vectorization**

2) Include "`#pragma ivdep` directive" in top of loop "`for (i=0; i<n; i++)`" on function `add_floats`

```
#pragma ivdep
for (i=0; i<n; i++){
```

3) Recompile the example with `vec-report`

```
icc VectorizationHandson.c -o VectorizationHandson -vec-report6 -O3
```

Note that the Outer loop can be vectorized now.

**remark #15301: OUTER LOOP WAS VECTORIZED**

2) Include `pragma simd` directive in the loop "`for (j=n; j>0; j--)`" on function `add_floats`

```
#pragma simd
for (j=n; j>0; j--){
```

3) Recompile the example with `vec-report`

```
icc VectorizationHandson.c -o VectorizationHandson -vec-report6 -O3
```

Note that compiler vectorized the inner loop instead of outer loop

Outer loop:

remark #15542: loop was not vectorized: inner loop was already vectorized

Inner loop:

remark #15301: SIMD LOOP WAS VECTORIZED

2) Include keyword restrict to avoid in all arguments of function quad

```
void quad(int length, double * restrict a, double * restrict b, double * restrict c, double *  
restrict x1, double * restrict x2)
```

3) Recompile the example with vec-report and restrict

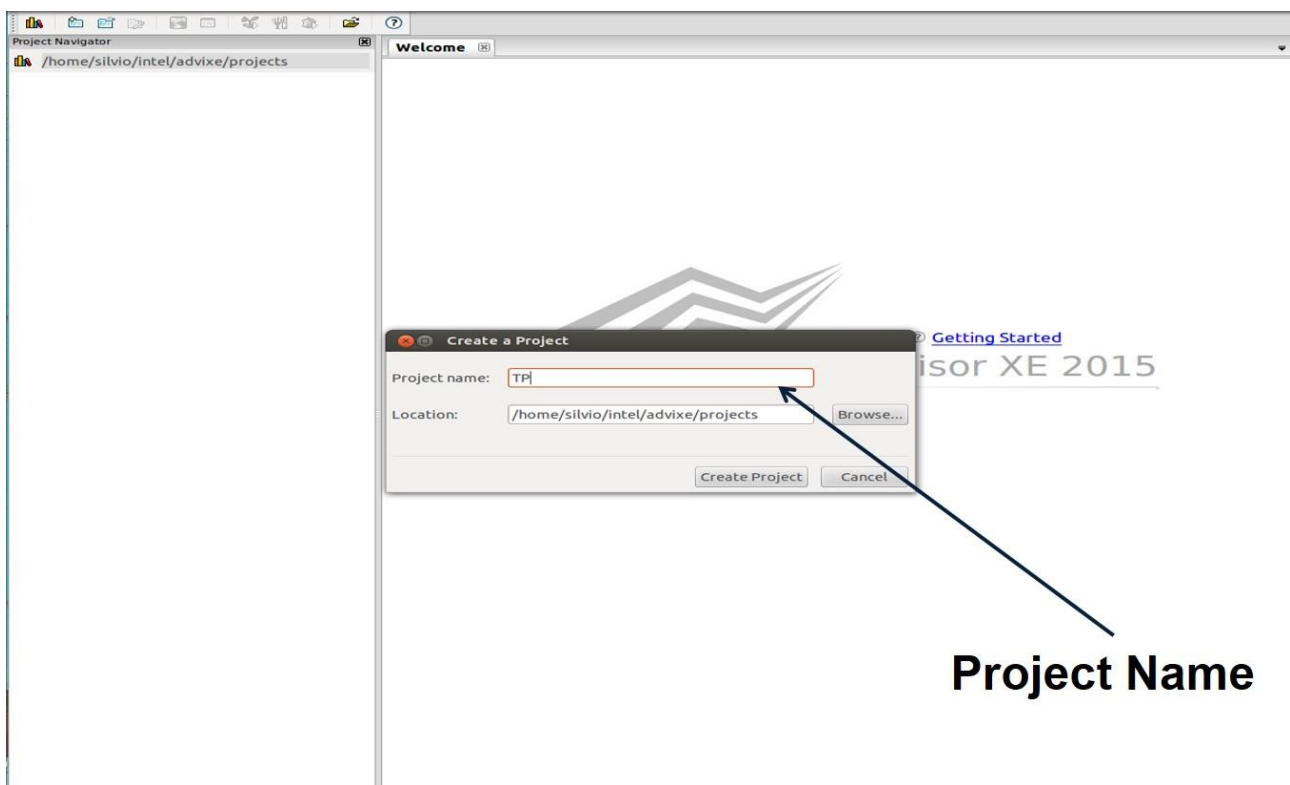
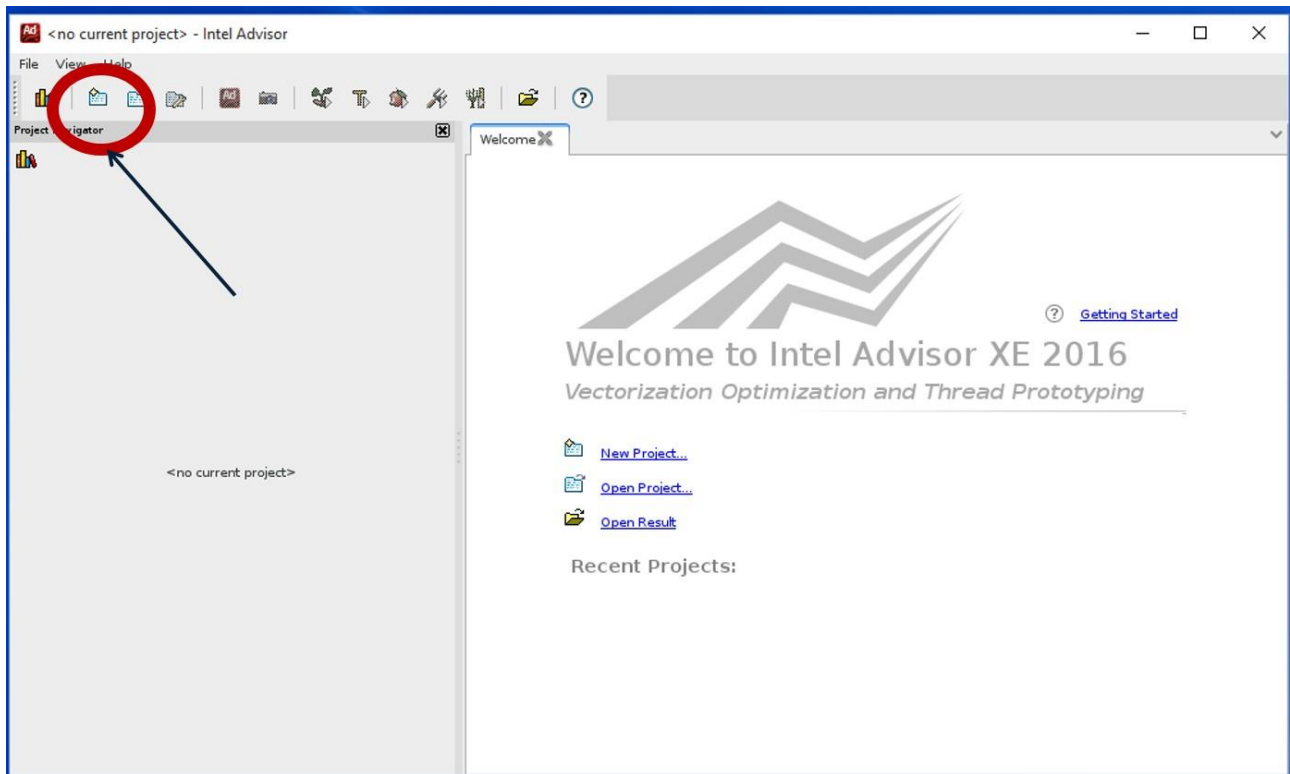
```
icc VectorizationHandson.c -o VectorizationHandson -vec-report6 -O3 -restrict
```

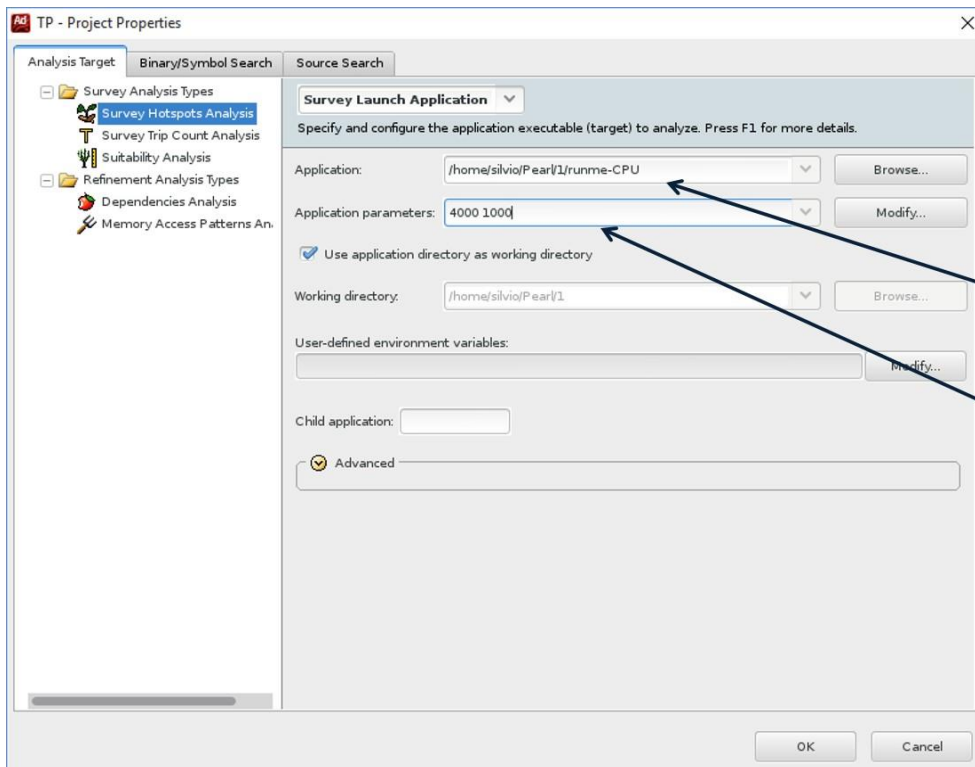
Note that the loop can be vectorized now.

remark #15300: LOOP WAS VECTORIZED

Intel Advisor – Create New Project

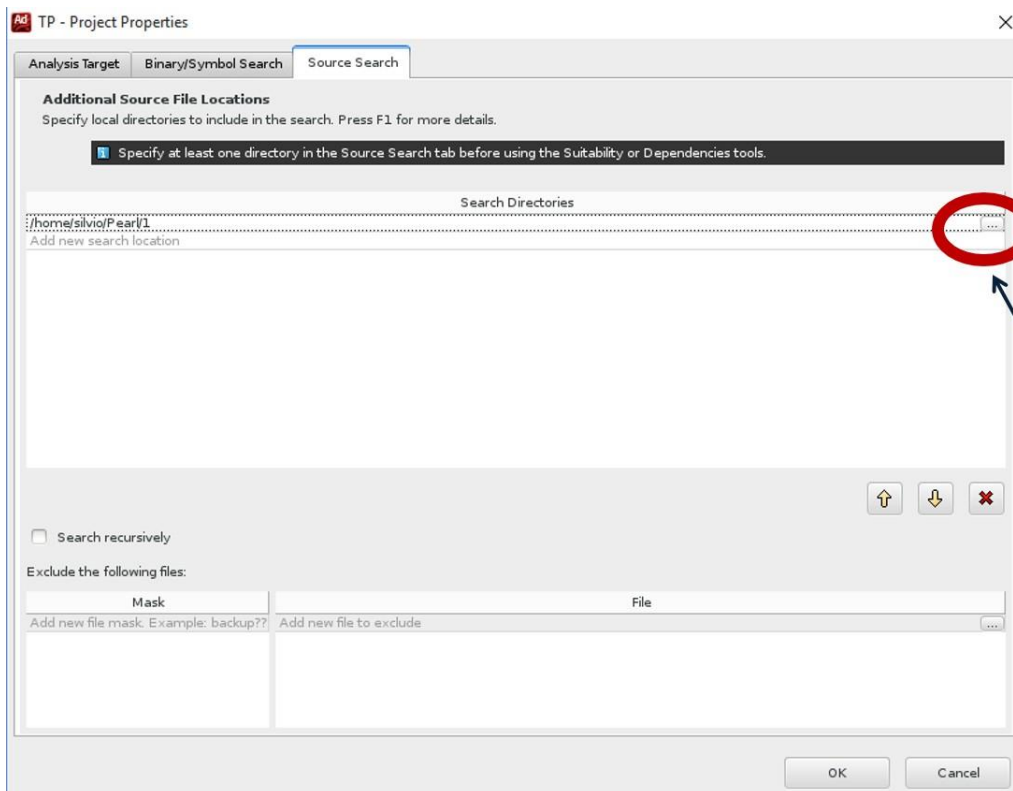
- Execute Intel Advisor on terminal: advixe-gui
- create new Advisor project:
  - name: Vectest
  - application: ~/handson/vec/VectorizationHandson
  - Source Folder: ~/handson/vec/



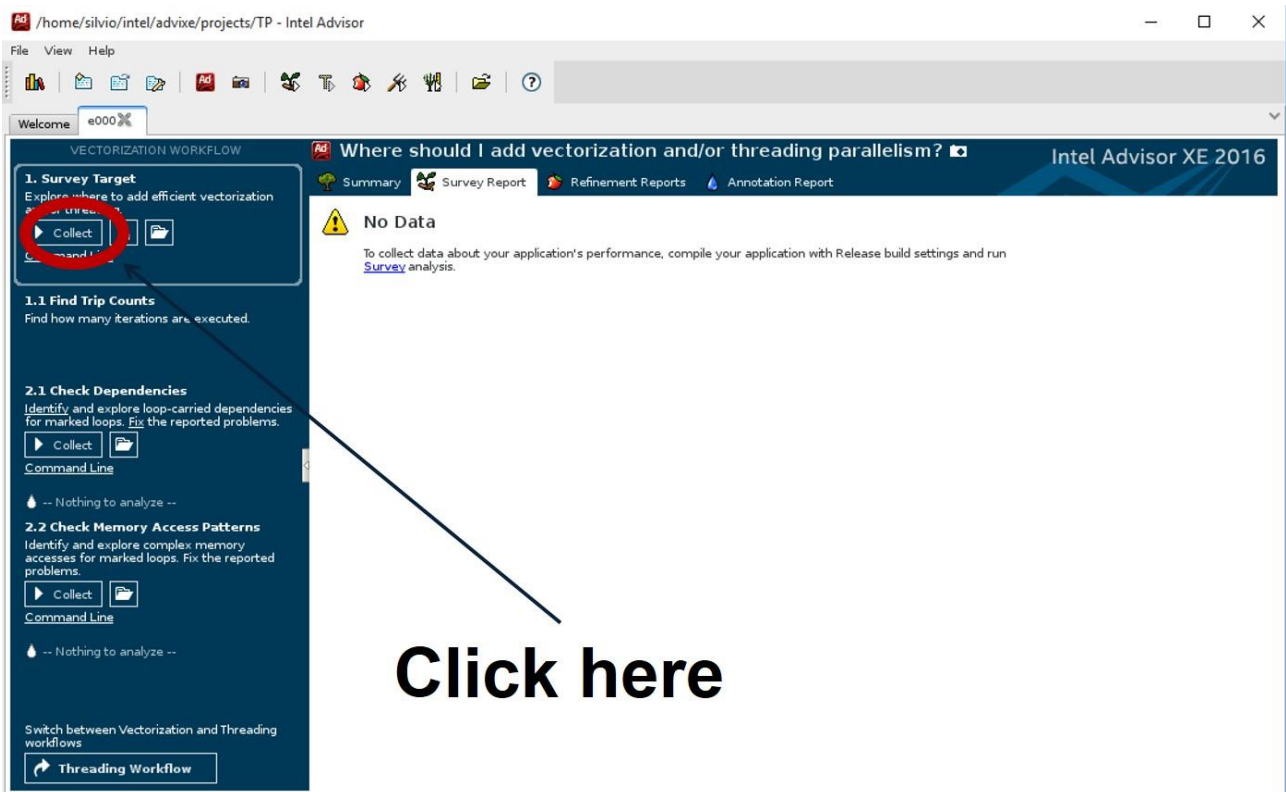


**Application**

**Application Parameters**



**Click here**



**Click here**

## Change xhost

- Note that the code was compiled using SSE
  - Recompile application using xhost and `-g`
- ```
icc VectorizationHandson.c -o VectorizationHandson -vec-report6 -O3 -restrict -xhost -g
```
- Collect Survey Data again
  - Note that now the code was compiled using AVX

## Matrix Multiplication

- Compile code;
- Create new Advisor Project;
- Execute Survey Analysis;
- Execute Trip Count Analysis;
- Execute Check Dependencies Analysis;
- Compile code
  - `Cd ~/handson/matrix/linux`
  - `Make clean ; make icc`
- Execute Intel Advisor on terminal: `advixe-gui`
- create new Advisor project:
  - name: `matrix-handson`
  - application: `~/handson/matrix/linux/matrix.icc`
  - Source Folder: `~/handson/matrix/src/`
- Execute Survey Analysis

Summary

Survey Report

Refinement Reports

Annotation Report

Some target modules do not contain debug information

Suggestion: enable debug information for relevant modules.

| Function Call Sites and Loops                  | Vector Issues | Self Time | Total Time | Type             | Why No Vectorization? | Vectorized Loops |            | VL (Vector Length) | Trip C... | Instruction Set Analysis |                        | Advanced   | Location                      |
|------------------------------------------------|---------------|-----------|------------|------------------|-----------------------|------------------|------------|--------------------|-----------|--------------------------|------------------------|------------|-------------------------------|
|                                                |               |           |            |                  |                       | Vec...           | Efficiency | Gal...             |           | Median                   | Traits                 | Data ...   | Nu...                         |
| [loop in _INTERNAL_16_offload_host_cpp_ad92... |               | 0.000s    | 0.000s     | Scalar           |                       |                  |            |                    |           | 5                        | Unpacks                | Float32... | 4                             |
| [loop in __libc_csu_init]                      |               | 0.000s    | 0.000s     | Scalar           |                       |                  |            |                    |           | 3                        |                        | Float32... | 0                             |
| [loop in func@0x5b810]                         | 2 Data typ... | 0.000s    | 0.000s     | Scalar           |                       |                  |            |                    |           |                          | Type Conversions       | Float64... | 1                             |
| [loop in main at matrix.c:144]                 | 2 Data typ... | 0.000s    | 0.000s     | Scalar           | inner loop was al...  |                  |            |                    |           | 1024                     | FMA; Shuffles; Type... | Float64... | 16                            |
| [loop in main at matrix.c:144]                 | 1 Data typ... | 0.000s    | 0.000s     | Vectorized (8... |                       | AVX2             | 100%       | 5.55x              | 4         | 64                       | FMA; Type Conversi...  | Float64... | 13                            |
| [loop in multiply0 at multiply.c:179]          | 2 Assume...   | 0.000s    | 0.910s     | Scalar           | vector depende...     |                  |            |                    |           | 1024                     |                        | Float64... | 4                             |
| [loop in multiply0 at multiply.c:180]          | 2 Assume...   | 0.000s    | 0.910s     | Scalar           | vector depende...     |                  |            |                    |           | 1024                     | FMA                    | Float64... | 4                             |
| [loop in multiply0 at multiply.c:181]          | 2 Assume...   | 0.910s    | 0.910s     | Scalar           | vector dependen...    |                  |            |                    |           | 512                      | FMA                    | Float64... | 4                             |
|                                                |               |           |            |                  |                       |                  |            |                    |           |                          |                        |            | Unrolled by 2: multiply.c:181 |

Source

Top Down

Loop Analytics

Loop Assembly

Recommendations

Compiler Diagnostic Details

File: multiply.c:181 multiply0

| Line | Source                                                                                                    | Total Time | % | Loop Time | % | Traits    |
|------|-----------------------------------------------------------------------------------------------------------|------------|---|-----------|---|-----------|
| 166  | for(k=0; k<msize; k++) {                                                                                  |            |   |           |   |           |
| 167  | c[i][i] = c[i][i] + a[i][k] * t[i][k];}                                                                   |            |   |           |   |           |
| 168  | /*                                                                                                        |            |   |           |   |           |
| 169  | */                                                                                                        |            |   |           |   |           |
| 170  | #endif // USE THR                                                                                         |            |   |           |   |           |
| 171  | #ifdef USE OMP                                                                                            |            |   |           |   |           |
| 172  | void multiply0(int msize, int tidx, int numt, TYPE a[][NUM], TYPE b[][NUM], TYPE c[][NUM], TYPE t[][NUM]) |            |   |           |   |           |
| 173  | {                                                                                                         |            |   |           |   |           |
| 174  | int i, k;                                                                                                 |            |   |           |   |           |
| 175  | {                                                                                                         |            |   |           |   |           |
| 176  | // Basic serial implementation                                                                            |            |   |           |   |           |
| 177  | for(i=0; i<msize; i++) {                                                                                  |            |   |           |   | 909.973ms |
| 178  | for(k=0; k<msize; k++) {                                                                                  |            |   |           |   | 909.973ms |
| 179  | for(i=0; i<msize; i++) {                                                                                  | 169.996ms  |   |           |   | 909.973ms |
| 180  | c[i][i] = c[i][i] + a[i][k] * b[k][i];                                                                    |            |   |           |   |           |
| 181  | }                                                                                                         |            |   |           |   |           |
| 182  | }                                                                                                         | 739.977ms  |   |           |   | FMA       |
| 183  | }                                                                                                         |            |   |           |   |           |
| 184  | }                                                                                                         |            |   |           |   |           |
| 185  | }                                                                                                         |            |   |           |   |           |
| 186  |                                                                                                           |            |   |           |   |           |
| 187  |                                                                                                           |            |   |           |   |           |
| 188  |                                                                                                           |            |   |           |   |           |

- Note that Inner loop was not automatic vectorized.

Vectorization Workflow

Threading Workflow

OFF

Batch mode

1. Survey Target

Collect

1.1 Find Trip Counts

Collect

Mark Loops for Deeper Analysis

Select loops in the Survey Report for Dependencies and/or Memory Access Patterns analysis.

-- There are no marked loops --

2.1 Check Dependencies

Collect

-- Nothing to analyze --

2.2 Check Memory Access Patterns

Collect

-- Nothing to analyze --

| Trip Counts |      |      |            |                    |
|-------------|------|------|------------|--------------------|
| Median      | Min  | Max  | Call Count | Iteration Duration |
| 5           | 5    | 5    | 1          |                    |
| 3           | 3    | 3    | 1          |                    |
| 1024        | 1024 | 1024 | 1          |                    |
| 64          | 64   | 64   | 1024       |                    |
| 1024        | 1024 | 1024 | 1          | 0.0009s            |
| 1024        | 1024 | 1024 | 1024       | < 0.0001s          |
| 512         | 512  | 512  | 1048576    | < 0.0001s          |

- Mark Inner Loop for deeper analysis;
- Click on “check dependency”;

Summary Survey Report Refinement Reports Annotation Report

| Function Call Sites and Loops    | Vector Issues                   | Self Time | Total Time | Type              | Why No Vectorization?                    | Vectorized Loops | Gal... | VL... | Com | Instruction Set Analysis | Data Types     | Number of Vector |
|----------------------------------|---------------------------------|-----------|------------|-------------------|------------------------------------------|------------------|--------|-------|-----|--------------------------|----------------|------------------|
| [46] loop in mult at matrix.c:51 | 2 Assumed dependency present    | 2.920s    | 2.920s     | Scalar            | vector dependence prevents vectorization |                  |        |       |     |                          | Float64        | 5                |
| [47] loop in int at matrix.c:51  | 2 Data type conversions present | 0.010s    | 0.010s     | Vectorized (Body) |                                          | AUX              | 0.50%  | 4.82x | 4   | 4.82x                    | Float64, Int32 | 15               |
| [48] loop in mult at matrix.c:50 | 2 Assumed dependency present    | 0.000s    | 2.920s     | Scalar            | vector dependence prevents vectorization |                  |        |       |     |                          | Float64        | 5                |
| [49] loop in mult at matrix.c:49 | 2 Assumed dependency present    | 0.000s    | 2.920s     | Scalar            | vector dependence prevents vectorization |                  |        |       |     |                          | Float64        | 5                |

Source Tip Down Loop Analytics Loop Assembly Recommendations Compiler Diagnostic Details

File: matrix.c:51 mult

```

44  */
45  void mult(double* a, double* b, double* c, int msize) {
46      int i, j, k;
47      for(i=0; i<msize; i++) {
48          for(j=0; j<msize; j++) {
49              for(k=0; k<msize; k++) {
50                  c[i*msize+j] = a[i*msize+k] * b[k*msize+j];
51              }
52          }
53      }
54  }
55  }
56  }
57  }

```

| Line | Source | Total Time | % | Loop Time | % | Traits |
|------|--------|------------|---|-----------|---|--------|
| 49   |        | 2.920s     |   | 2.920s    |   |        |
| 50   |        | 1.950s     |   | 2.920s    |   | FMA    |
| 51   |        | 0.970s     |   |           |   |        |

- No dependencies found. It is safe to vectorize;

Check for loop-carried dependencies in your application

Elapsed time: 4.04s Vectorized Not Vectorized FILTER: All Module All Source Loops All

Summary Survey Report Refinement Reports Annotation Report

| Site Location                         | Loop-Carried Dependencies | Strides Distribution     | Access Pattern           | Site Name     |
|---------------------------------------|---------------------------|--------------------------|--------------------------|---------------|
| [loop in multiply0 at multiply.c:1... | No dependencies found     | No information available | No information available | loop_site_54  |
| [loop in multiply0 at multiply.c:1... | No information available  | 50% / 50% / 0%           | Mixed strides            | loop_site_184 |

Memory Access Patterns Report Dependencies Report Recommendations

Problems and Messages

| ID | Type                      | Site Name    | Sources    | Modules    | State         |
|----|---------------------------|--------------|------------|------------|---------------|
| P1 | Parallel site information | loop_site_54 | multiply.c | matrix.icc | Not a problem |

Parallel site information: Code Locations

| ID | Instruction Address | Description   | Source         | Function  | Variable references | Module     | State         |
|----|---------------------|---------------|----------------|-----------|---------------------|------------|---------------|
| X1 | 0x4028be            | Parallel site | multiply.c:181 | multiply0 |                     | matrix.icc | Not a problem |

```

179  for(i=0; i<msize; i++) {
180      for(k=0; k<msize; k++) {
181          for(j=0; j<msize; j++) {
182              c[i][j] = c[i][j] + a[i][k] * b[k][j];
183          }
184      }
185  }

```

- Put `#pragma simd` in top of inner loop on function `multiply0`:
  - Nano `~/handson/matrix/src/multiply.c`

```
for(i=0; i<msize; i++) {
    for(k=0; k<msize; k++) {
        #pragma simd
        for(j=0; j<msize; j++) {
```
- Recompile application
  - Make clean ; make icc
  - Run survey data again;
- Note that inner loop is vectorized now;
- Run Check Memory Access Patterns;



- Memory access Patterns Results:
  - 50% constant stride;
  - 50% unit stride;



Elapsed time: 4.19s

Vectorized

Not Vectorized

FILTER: All Modules

All Source

Loops

All Threads

Summary

Survey Report

Refinement Reports

Annotation Report

| Site Location                         | Loop-Carried Dependencies | Strides Distribution     | Access Pattern           | Site Name    |
|---------------------------------------|---------------------------|--------------------------|--------------------------|--------------|
| [loop in multiply0 at multiply.c:1... | No dependencies found     | No information available | No information available | loop_site_54 |
| [loop in multiply0 at multiply.c:1... | No information available  | 50% / 50% / 0%           | Mixed strides            | loop_site_42 |

Memory Access Patterns Report

Dependencies Report

Recommendations

| ID                                                                                                                                                                 | Stride | Type                                      | Source         | Site Name    | Nested Function | Modules    | Variable references                                                                            |
|--------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------|-------------------------------------------|----------------|--------------|-----------------|------------|------------------------------------------------------------------------------------------------|
| P1                                                                                                                                                                 | 4      | Constant stride                           | multiply.c:185 | loop_site_42 |                 | matrix.icc | block 0x7fa97c80f010 allocated at matrix.c:126, block 0x7fa97ca10010 allocated at matrix.c:121 |
| <pre> 183     #pragma ivdep 184     for(j=0; j&lt;msize; j++) { 185         c[i][j] = c[i][j] + a[i][k] * b[k][j]; 186     } 187     } </pre>                      |        |                                           |                |              |                 |            |                                                                                                |
| P2                                                                                                                                                                 |        | Parallel site information: multiply.c:184 |                | loop_site_42 |                 | matrix.icc |                                                                                                |
| <pre> 182     #pragma vector aligned 183     #pragma ivdep 184     for(j=0; j&lt;msize; j++) { 185         c[i][j] = c[i][j] + a[i][k] * b[k][j]; 186     } </pre> |        |                                           |                |              |                 |            |                                                                                                |
| P4                                                                                                                                                                 | 0      | Uniform stride                            | multiply.c:185 | loop_site_42 |                 | matrix.icc | block 0x7fa97ccf1010 allocated at matrix.c:116                                                 |
| <pre> 183     #pragma ivdep 184     for(j=0; j&lt;msize; j++) { 185         c[i][j] = c[i][j] + a[i][k] * b[k][j]; 186     } 187     } </pre>                      |        |                                           |                |              |                 |            |                                                                                                |