



# Hardware-Aware Optimization: Using Intel® Streaming SIMD Extensions

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# Agenda



- Introduction to SIMD
- SIMD arithmetic
- Conditional Code with SIMD
- Search and String Operations
- Data layout for SIMD
- Using SIMD for Full-Table Scans
- Summary

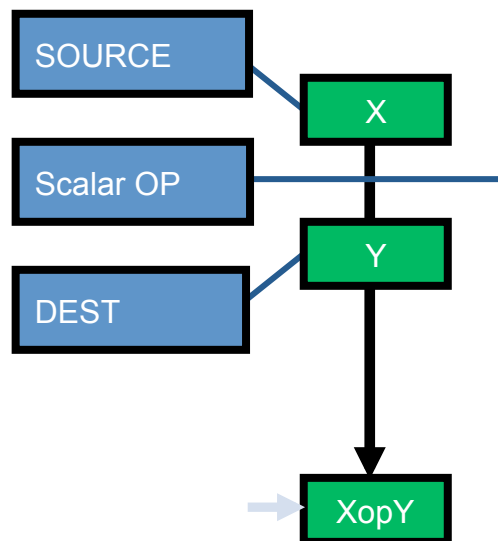
This presentation introduces only a subset of Intel® SSE with a strong focus on integer operations.

# Single Instruction Multiple Data (SIMD)



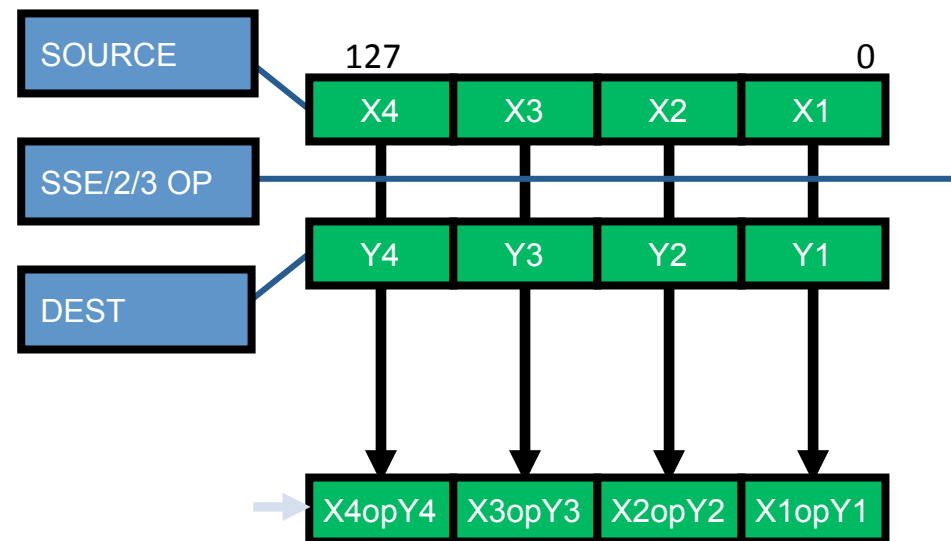
## Scalar processing

- traditional mode
- one instruction produces one result



## SIMD processing

- with Intel® SSE
- one instruction produces multiple results



# SSE Data Types & Speedup Potential



4x floats



2x doubles



16x bytes



8x 16-bit shorts



4x 32-bit integers



2x 64-bit integers



1x 128-bit integer

Potential speed-up is roughly  
the amount of packing

# SIMD is orthogonal to Multi-Core and Instruction-Level Parallelism

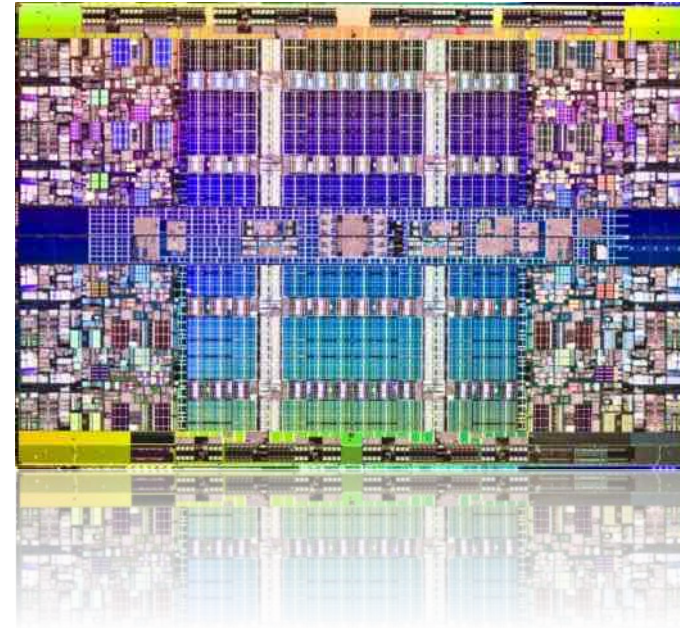
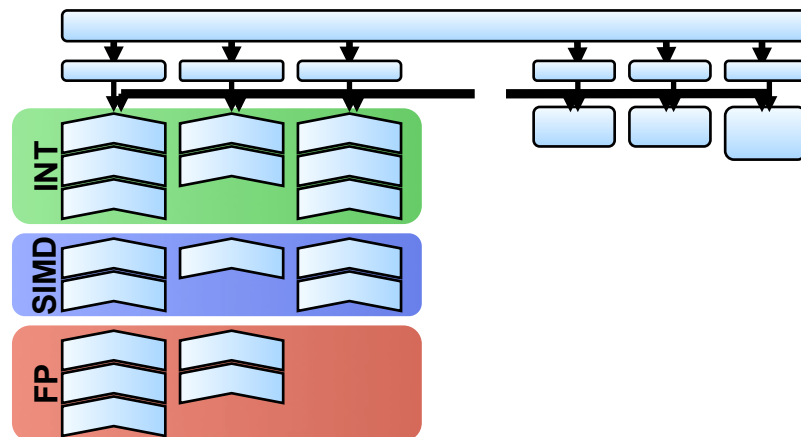


Available in all cores

Multiple Execution units

Allow SIMD parallelism

Up to 4 instructions can be retired in 1 clock cycle



# Evolution of SIMD on Intel® Architecture

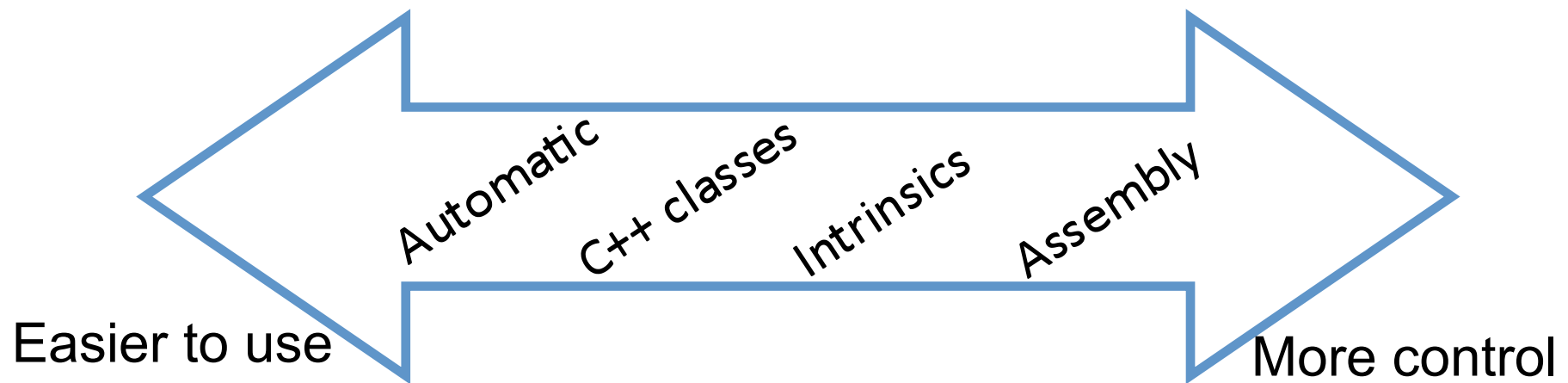


- MMX™
  - 64 bit
- Intel® Streaming SIMD Extensions (Intel® SSE)
  - 128 bit
- Intel® Advanced Vector Extensions (Intel® AVX)
  - 256 bit
  - Announced for Sandy Bridge architecture
- Intel® Many Integrated Core Architecture
  - 512 bit

# Four Vectorization Approaches



- Inline assembly language
- Intrinsics (see next slide)
- C++ class library
- Automatic vectorization by compiler





# Intel® SSE instructions are accessed as C functions:



```
// Original version using standard C/C++
void half(int array[], int len) {
    for (int i = 0; i < len; i++) {
        array[i] = array[i] >> 1; // shift right by 1
    }
}

// Modified version using intrinsics
void halfIntrinsic(int array[], int len) {
    __m128i *array4 = (__m128i *) array;
    for (int i = 0; i < len/4; i++) {
        array4[i] = _mm_srai_epi32(array4[i], 1);
    }
}
```

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# Basic Operations



PADD{B,W,D,Q,SB,SW}      xmm, xmm/m128  
 PSUB{B,W,D,Q,SB,SW}      xmm, xmm/m128  
 PAVG{B,W}                  xmm, xmm/m128

src

dst

0x0010	0x0100	0x0001	0x0004
--------	--------	--------	--------

0x0100	0x0100	0x000f	0x0321
--------	--------	--------	--------

src + dst

0x0110	0x0200	0x0010	0x0325
--------	--------	--------	--------

PAND                          xmm, xmm/m128  
 PANDNOT                      xmm, xmm/m128  
 POR                            xmm, xmm/m128  
 PXOR                          xmm, xmm/m128

P{MIN,MAX}{UB,SB,UW,SW,UD,SD}      xmm, xmm/m128

SSE 2      SSE 4.1

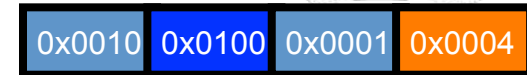
# Multiplication



PMULUDQ xmm, xmm/m128

PMULDQ xmm, xmm/m128

src



dst



src \* dst



PMULH{W,SW} xmm, xmm/m128

PMULLW xmm, xmm/m128

PMULLD xmm, xmm/m128

Higher and lower 32bits of product

src



dst



Hi/Lo (src \* dst)



SSE 2

SSE 4.1

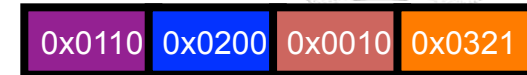
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# Shifting

PSLL{W,D,Q} xmm, xmm/imm8  
PSRA{W,D} xmm, xmm/imm8  
Shifting by bits

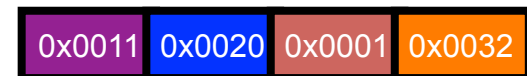
src



b

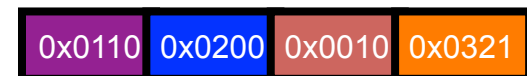


src >> b

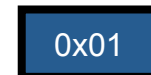


PSRL{W,D,Q,DQ} xmm, xmm/imm8  
Shifting by bytes

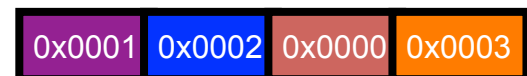
src



b



src >> b\*8



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# Packed Comparison

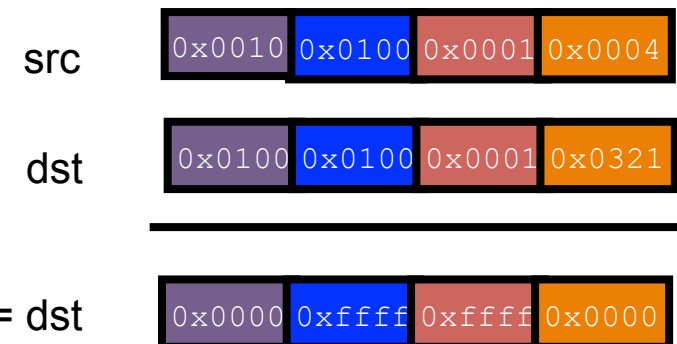


PCMPEQ{B,W,D,Q} xmm, xmm/m128

PCMPGT{B,W,D} xmm, xmm/m128

PCMPGT{B,W,D}r xmm, xmm/m128

Ex: pcmpeqd xmm1, xmm2



- Pair-wise compare equal, greater than, less than
- All the bits are set “1” if a pair is equal

SSE 2

SSE 4.1

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# Use Masks for Conditional Expressions



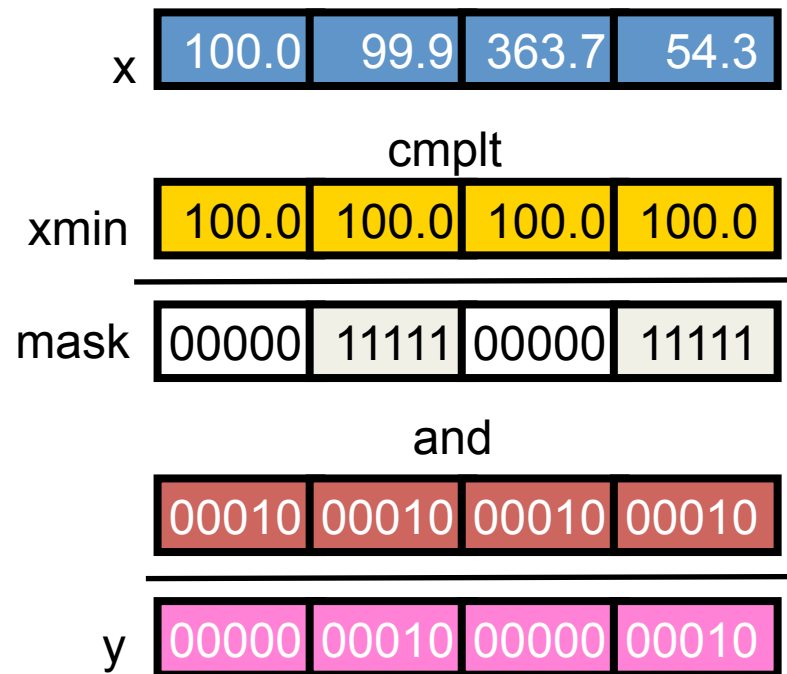
```
// Original version using standard C/C++
```

```
if (x<xmin)
```

```
    y=10;
```

```
else
```

```
    y=0;
```

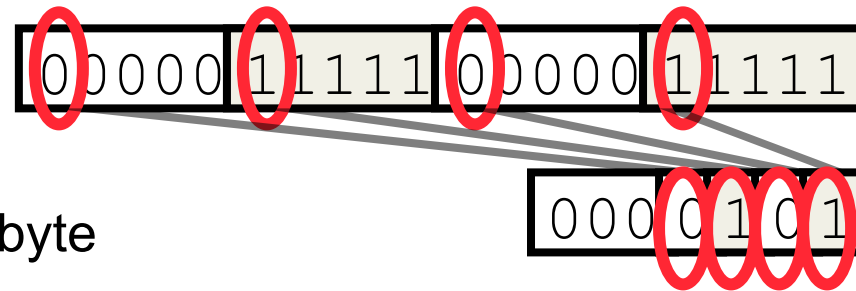




# Convert Mask to Bit-Vectors



pmovmskb

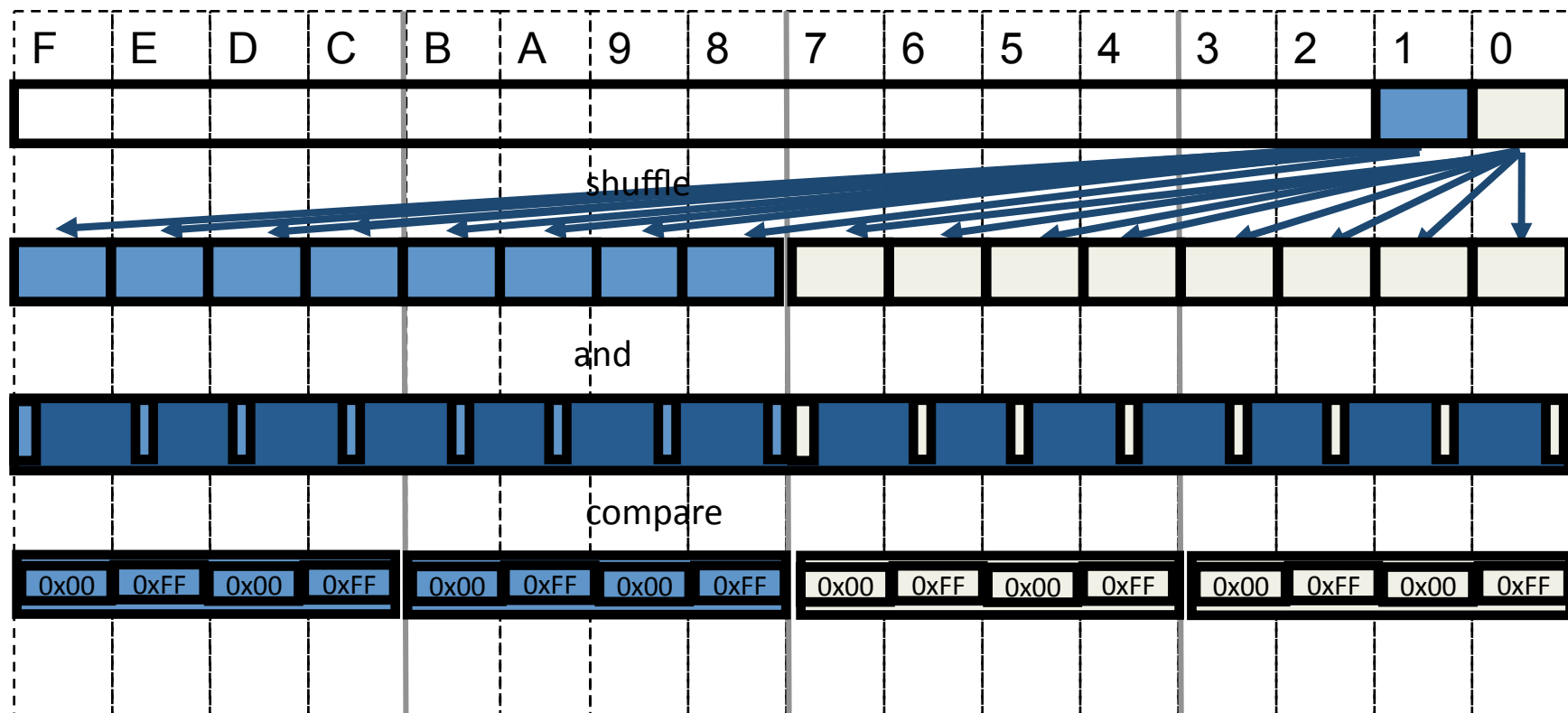


- Extract highest bit of each byte
- Converts comparison result to bit-vector

Can be used to store the result of a search as bit-vector.



# Convert Bit-Vector to Mask



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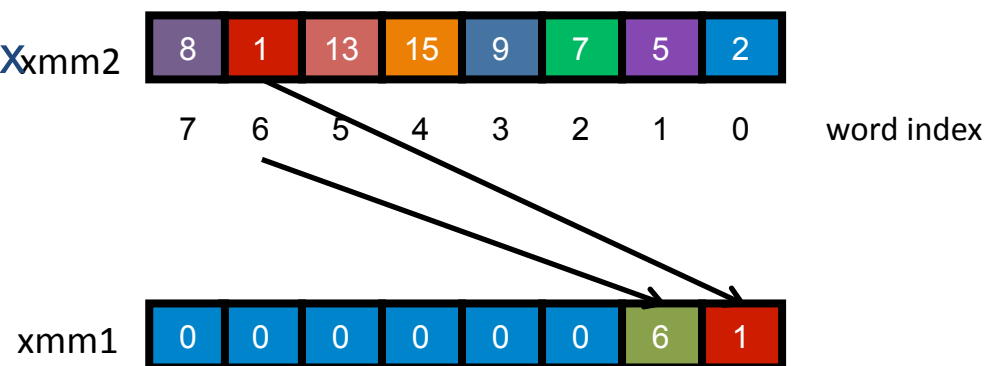
# Search Minimum



PHMINPOSUW xmm, xmm/m128

- Minimum of 8 words is put in the lowest word
- Index of the minimum word index is put in bit
- All the other bits are set 0

Ex: phminposuw xmm1, xmm2



# String Operations



PCMPxSTRx: 8 and 16 bit, signed and unsigned, 0-terminated or fixed length

## Equal [ i.e. strcmp() ]

- true for each character in Src2 if same position in Src1 is equal

```
Src1:  These_are_the_sa
Src2:  These are the sa
Mask:  1111101110111011
Index: 0x00
```

## Sub-string[ i.e. strstr() ]

- finds the start of a substring (Src1) within another string (Src2)

```
Src1:  sub
Src2:  busubusubusubusu
Mask:  0010001000100010
Index: 0x02
```

## Equal Any [ i.e. strcspn() ]

- true for each character in Src2 if any character in Src1 matches

```
Src1:  {}~|#\\@\\b\\t\\0
Src2:  bad#passw@rd\\0
Mask:  0001000001000000
Index: 0x03
```

## Ranges

- true if a character in Src2 is in at least one of up to 8 ranges in Src1

```
Src1:  AZaz09\\0
Src2:  #AlphaNumeric#\\0
Mask:  0111111111111000
Index: 0x01
```

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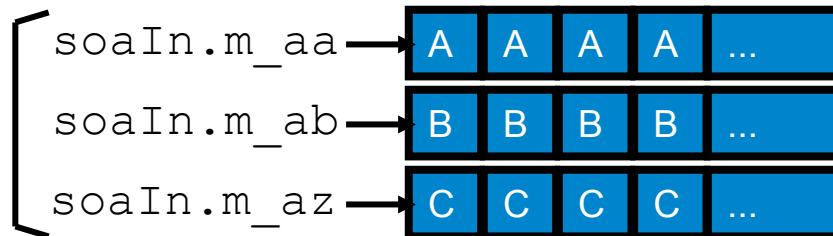
# Row-Orientation is Unsuitable for SIMD

AoS: Array of Structures “Row-oriented”



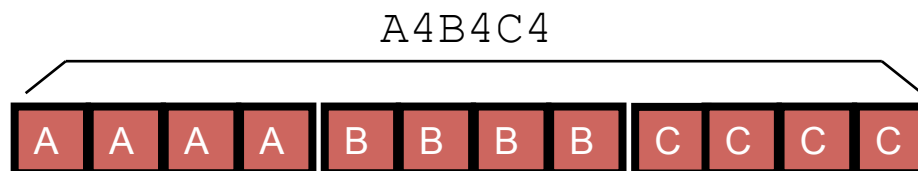
Row-orientation  
defeats SIMD

SoA: Structure of Arrays “Column-oriented”



Column-orientation  
is perfect for  
SIMD!

Hybrid Structure



# Insert and Extract Single Values



PINSRB xmm, r/m8, imm8

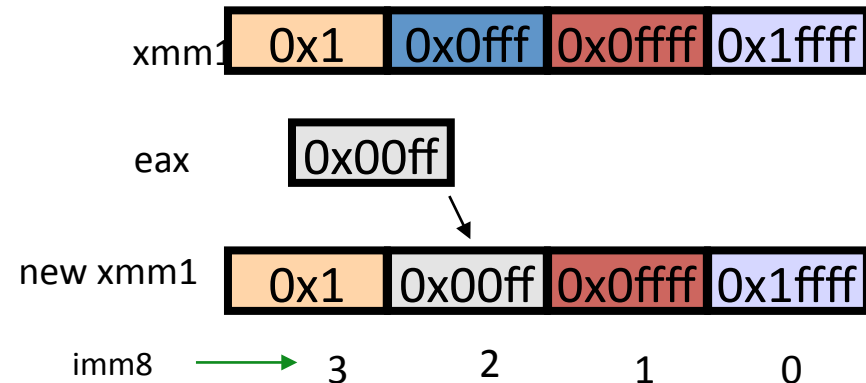
PINSRW xmm, r/m8, imm8

PINSRD xmm, r/m32, imm8

PINSRQ xmm, r/m64, imm8

- Insert a byte, a word, a dword, or a qword to the dst indicated by the offset in imm8

Ex: pinsrd xmm1, eax, 2



PEXTRB r32/r64/m8, xmm, imm8

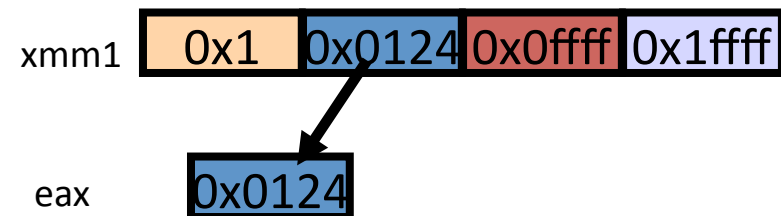
PEXTRW r/m32/m64, xmm, imm8

PEXTRD r/m32, xmm, imm8

PEXTRQ r/m64, xmm, imm8

- Extract byte / word / dword / qword indicated by offset in imm8

Ex: pextrd eax, xmm, 3



SSE 2

SSE 4.1

Insert and extract serialize the code

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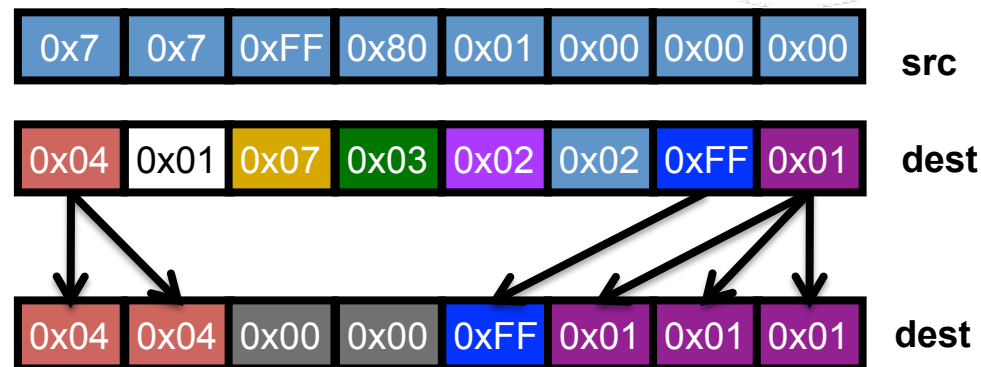


# Byte Permutation



PSHUFB mm, mm/m64

PSHUFB xmm, xmm/m128



- Byte-granularity permutation
- Variable control by source field
- Each byte of the source field selects the origin of the corresponding destination byte
- Also includes force-byte-to-zero flag (bit 7)

Byte permute is a very powerful operation for data preparation

# Blends



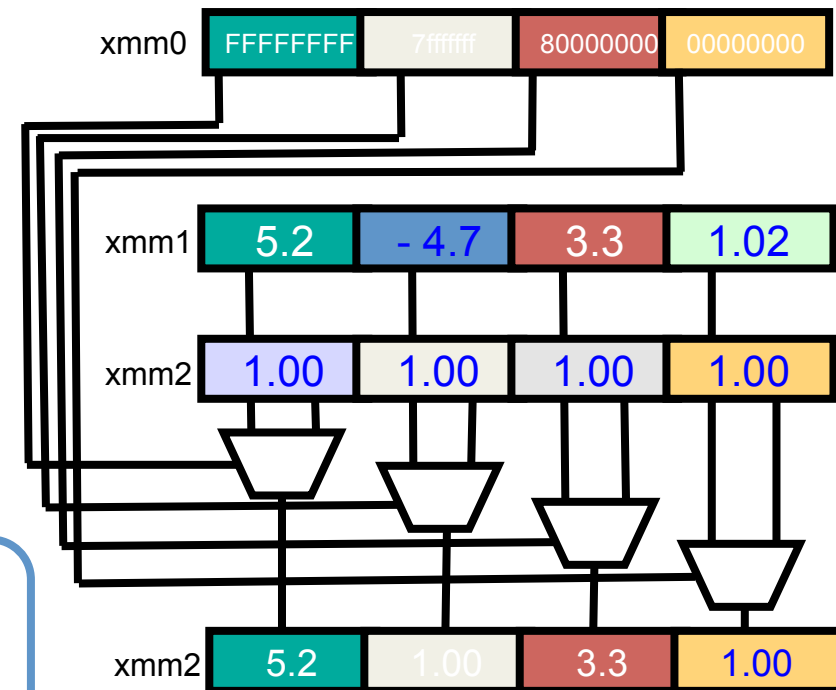
BLENDVP{B,S,D} xmm, xmm/m128  
<xmm0>

BLENDVP{B,S,D} xmm, xmm/m128 imm8

- Based on implicit input xmm0 or imm8, copy fields from source to dest.
  - Selectively copy 4 sp FP
  - Selectively copy 2 dp FP
  - Selectively copy 16 bytes
- The control bit is the MSB in the corresponding fields in xmm0
- Copy if the corresponding MSB is 1

Blending allows merging results of 2 code paths

BLENDVPS xmm2, xmm1 <xmm0>

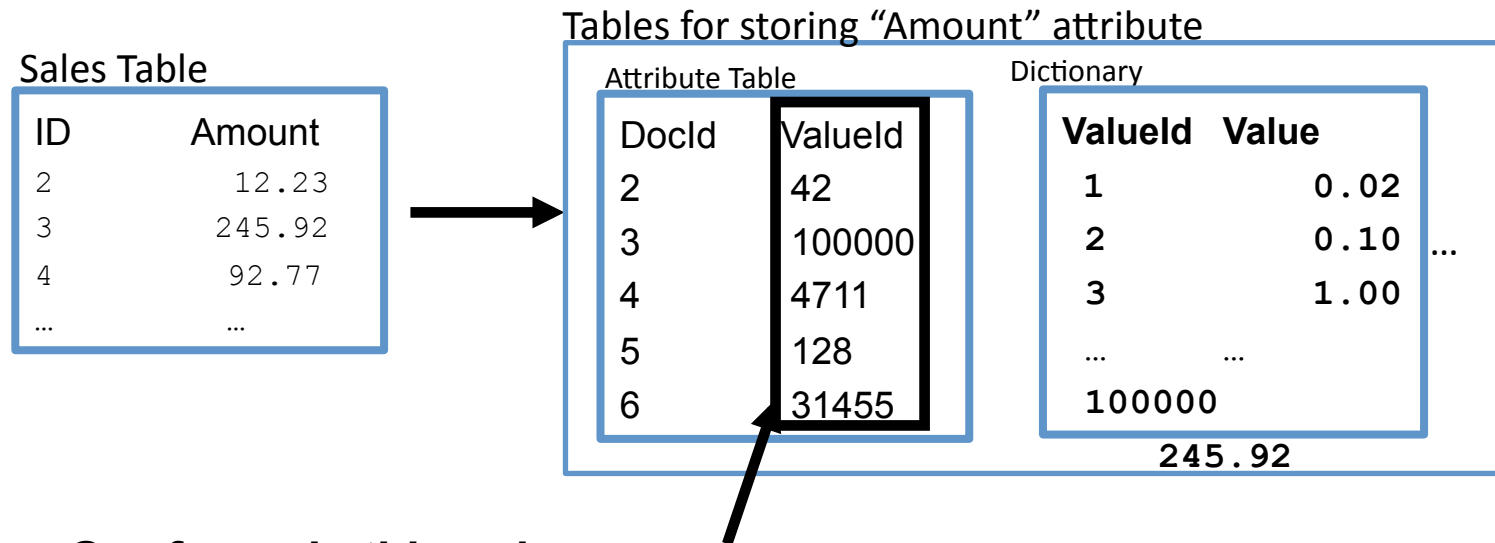


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# Recap: TREX Stores Values in Columns

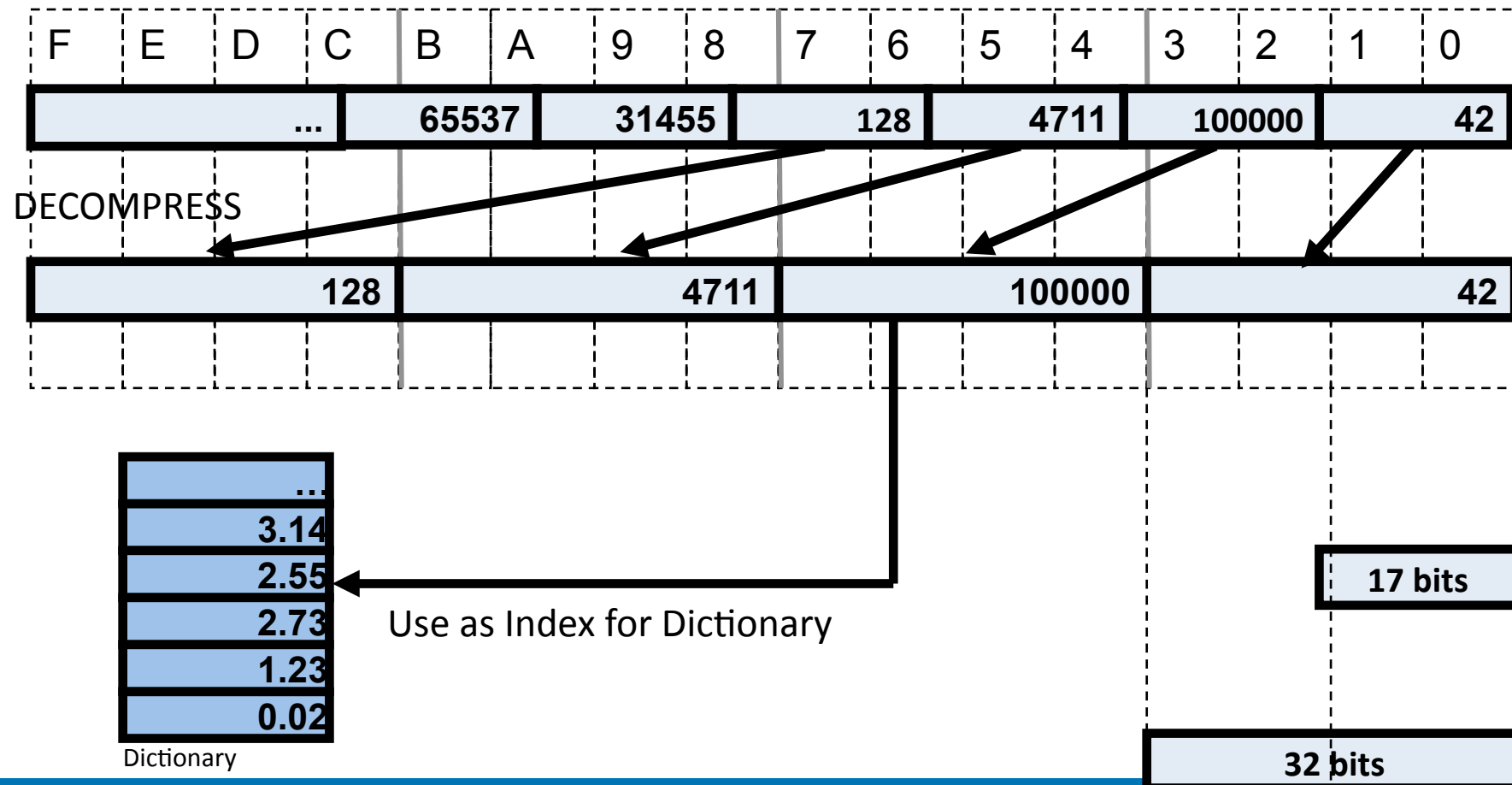


## Our focus is this column

- From "Dictionary", those values are {0, 1, 2, 3, ..., 100000}
- Max is 100000, which needs 17 bits to represent ( $2^{17}-1$ )
- Idea: instead of 32-bits, use 17-bits fields to store each ValueID
- Accessing "Value" needs decompression into 32-bits

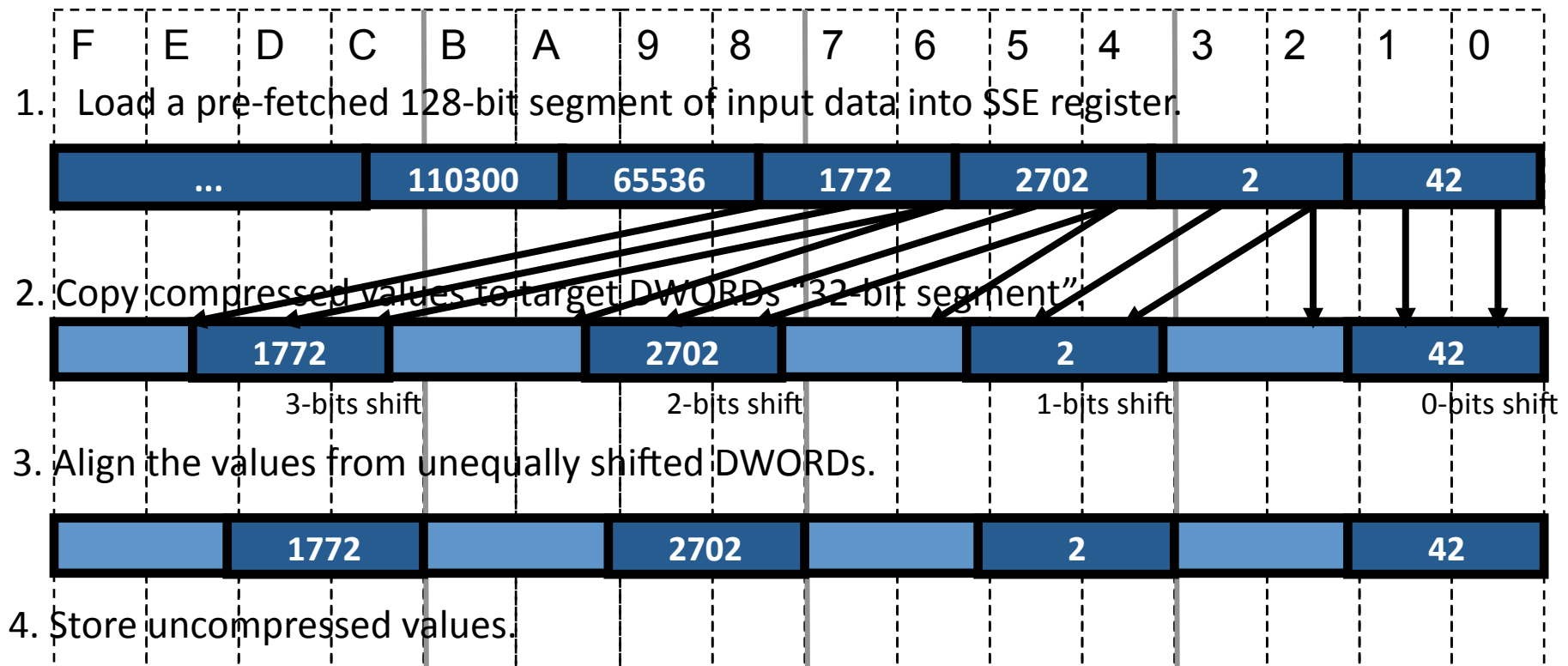
# Integers are compressed as packed bit-fields

Example: packed 17-bit fields



# DECOMPRESS unaligned bit fields

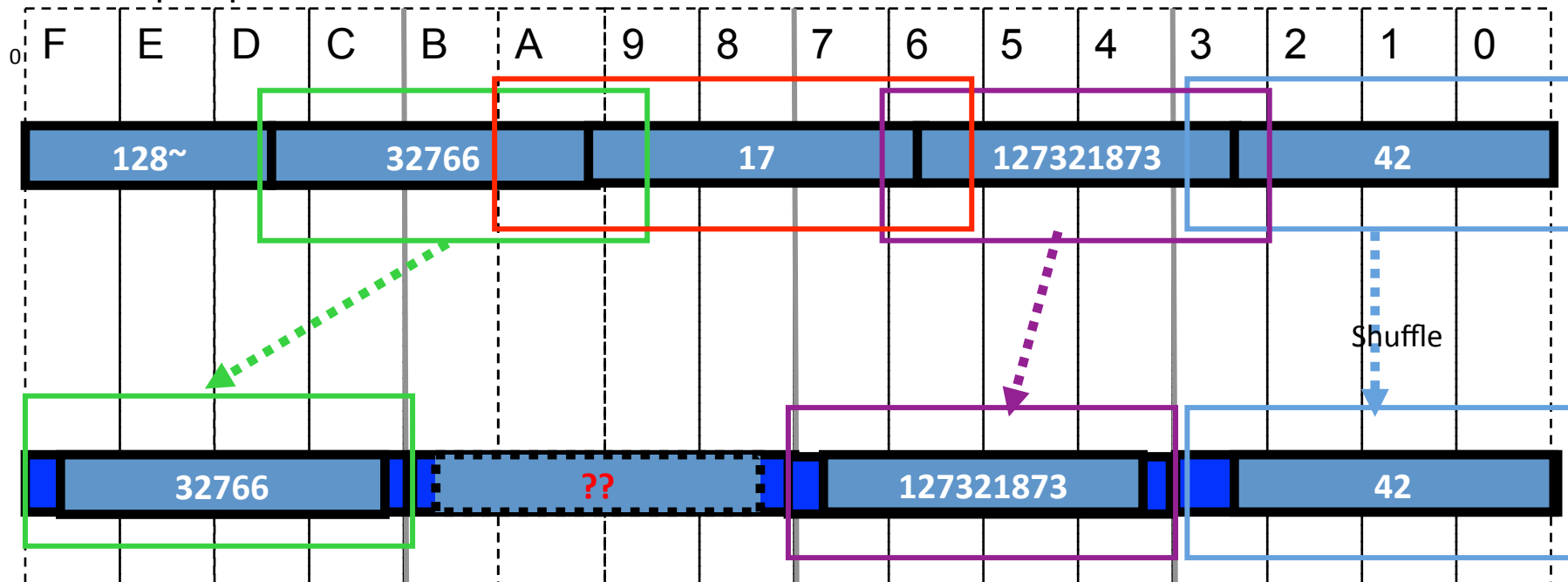
Example: packed 17-bit fields



# Problem: There are values that span across 5 Bytes



Example: packed 27-bit fields

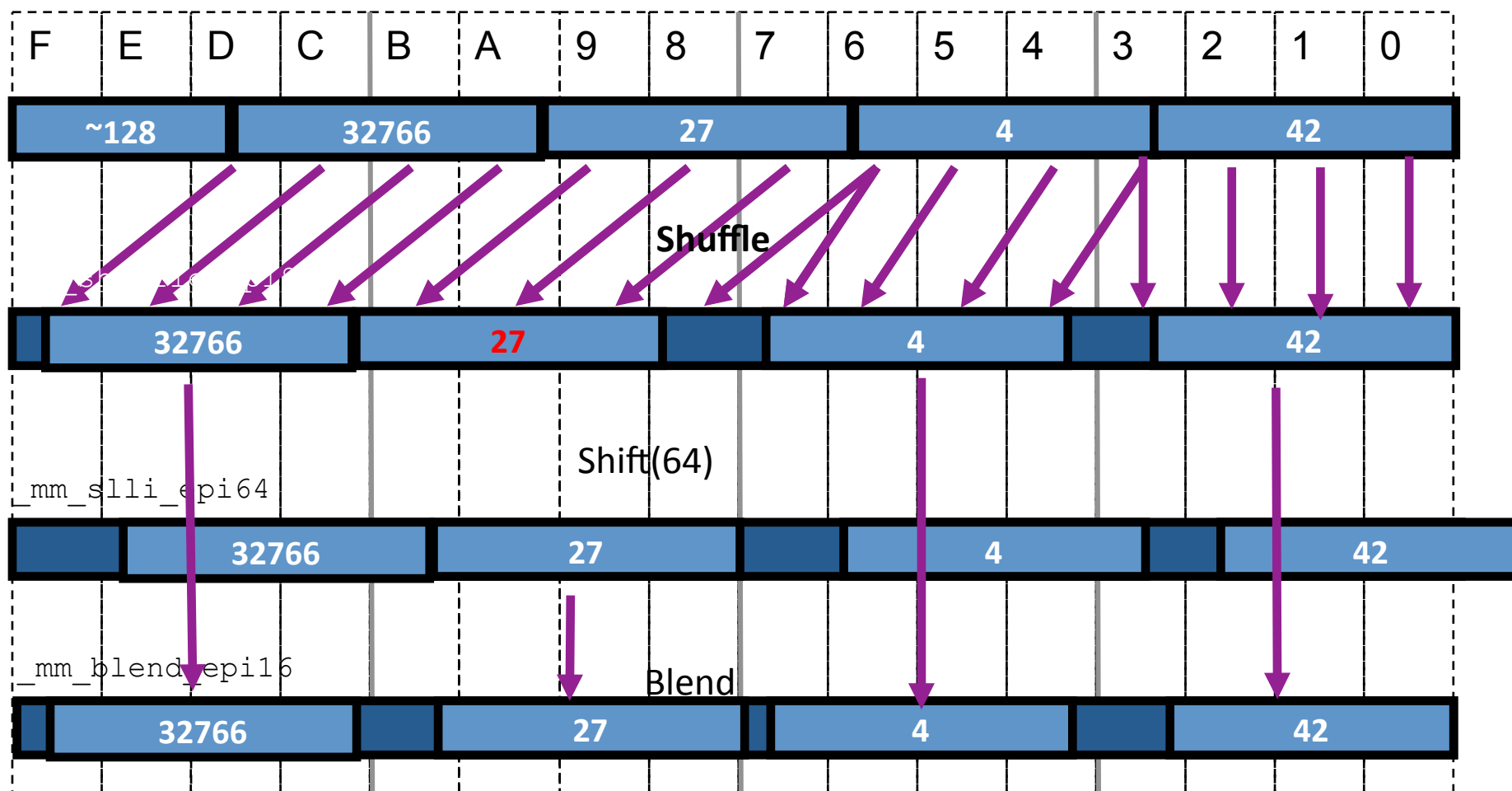


- The 3<sup>rd</sup> value spans across 5 Bytes.
- Cannot use Shuffle to copy the FULL bits into a 4-Byte space directly.

# Solution: Shift 5-Bytes values into 4 Bytes and blend

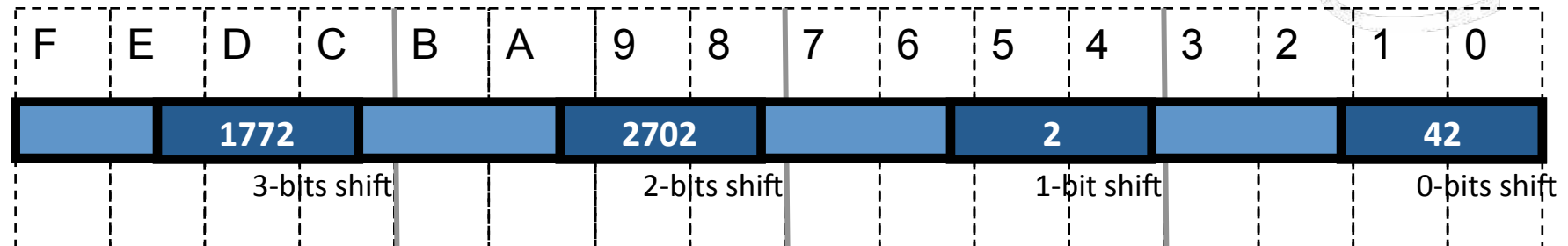


Example: packed 27-bit field





## Example: Simulate Independent Shift

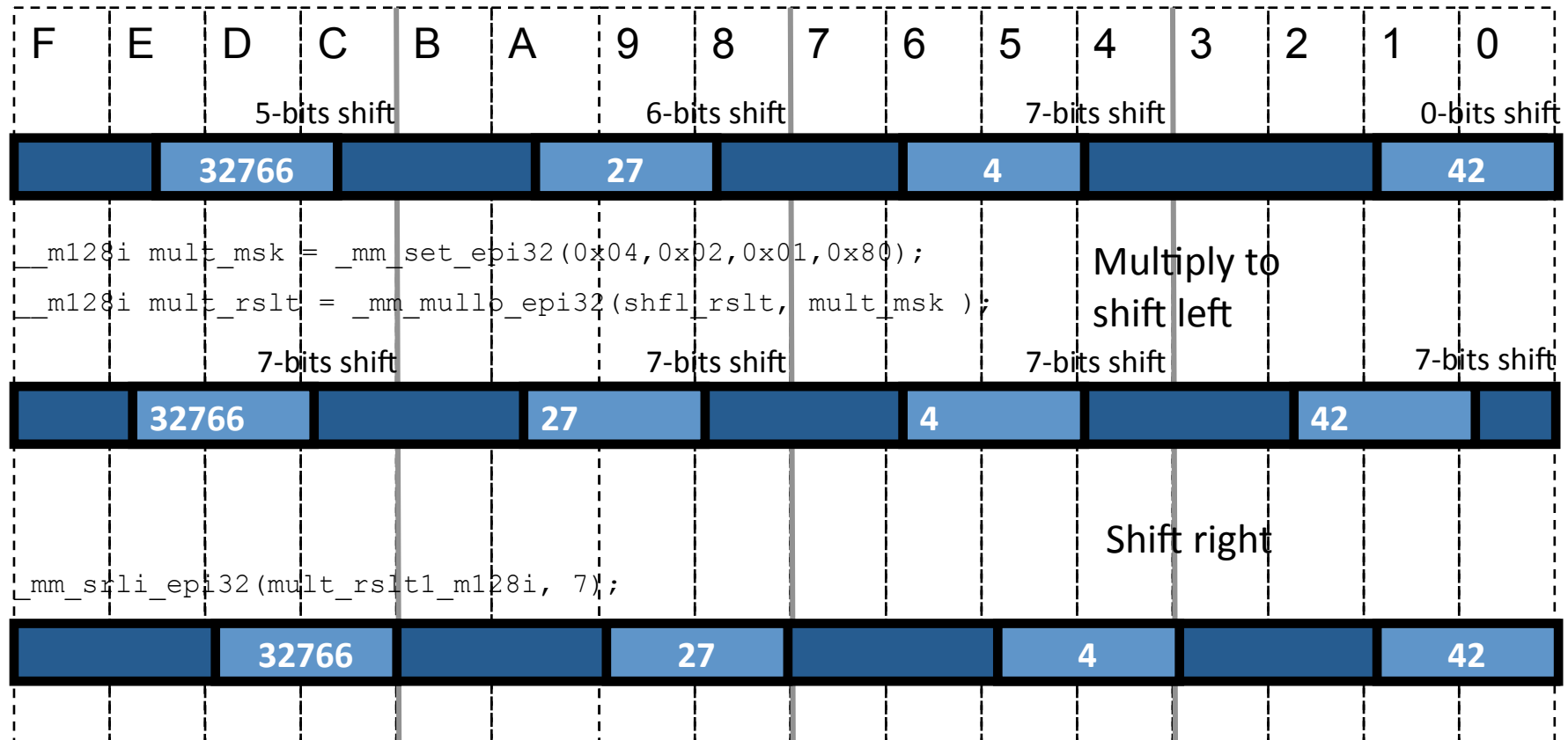


- Problem: Intel® SSE shift instruction shifts all values by the same shift amount
  - Quiz: How to compute  $n * 16$  efficiently?
  - Answer: use shift to multiply  $n \ll 4$
- Solution: use multiplication to shift



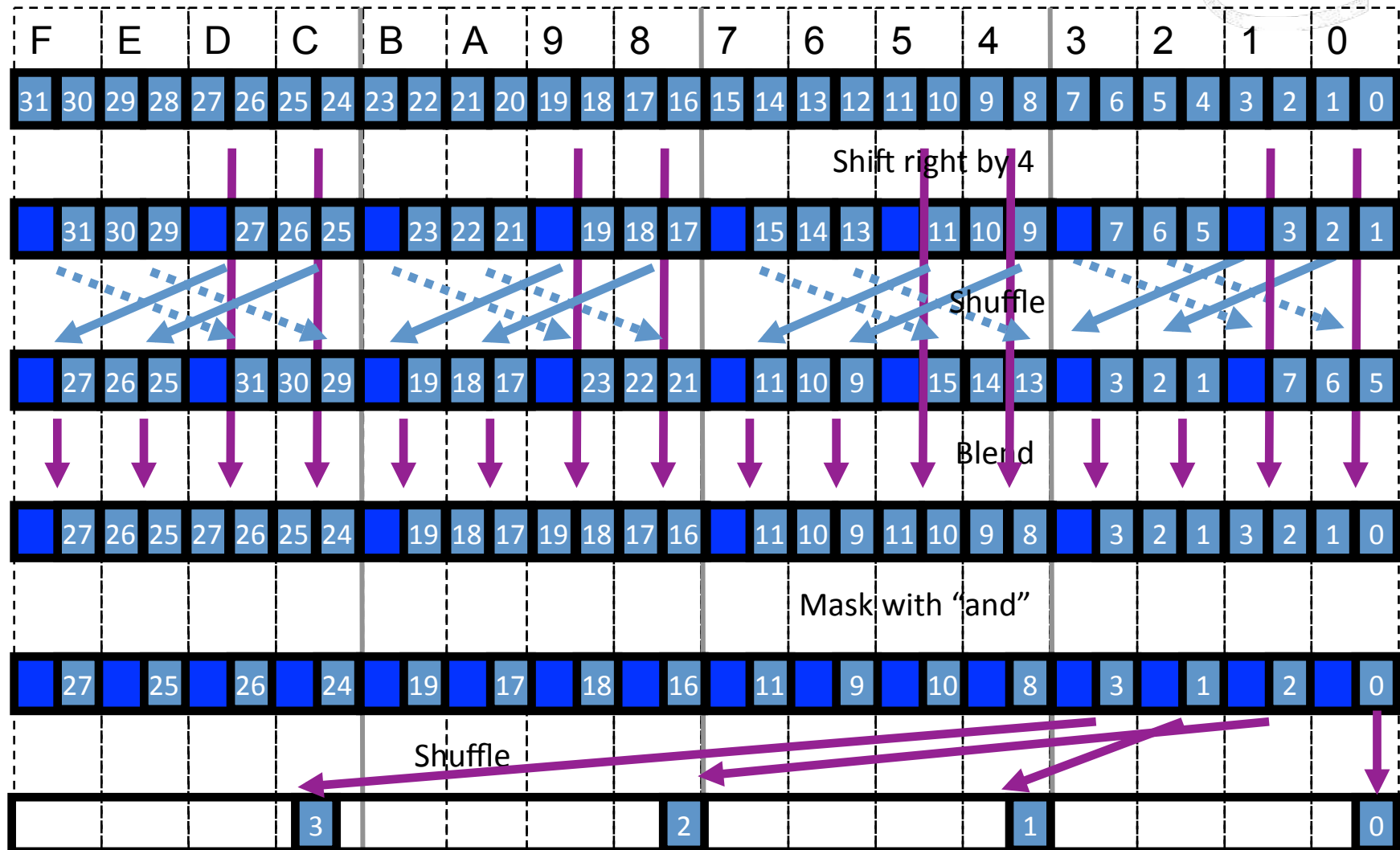
# Example: Simulate Independent Shift

Example: packed 15-bit fields



# Blend results of different shift amount

Example: packed 4-bit fields

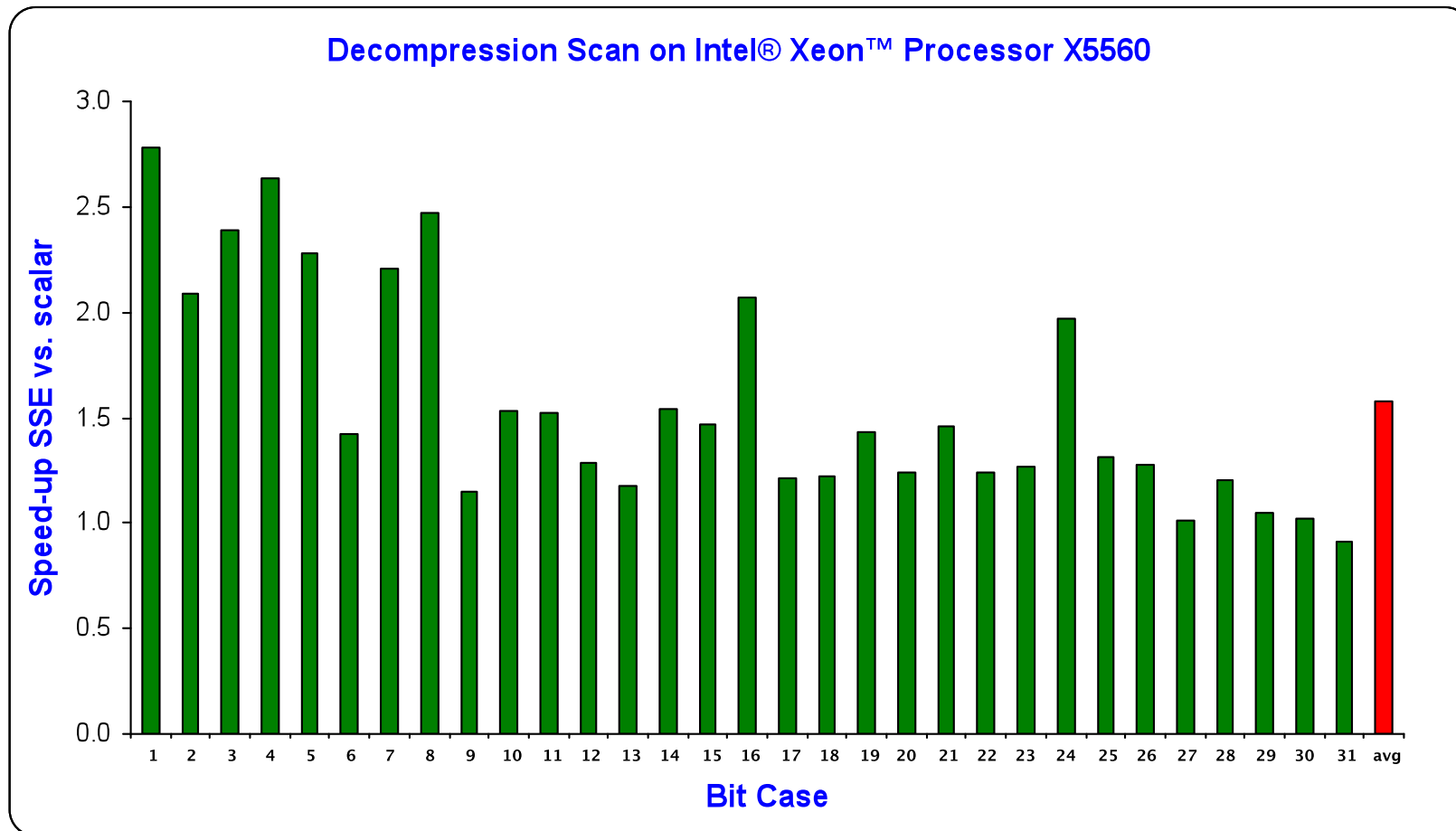


Use second Blend for remaining values

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# DECOMPRESS is 1.6x faster with SIMD



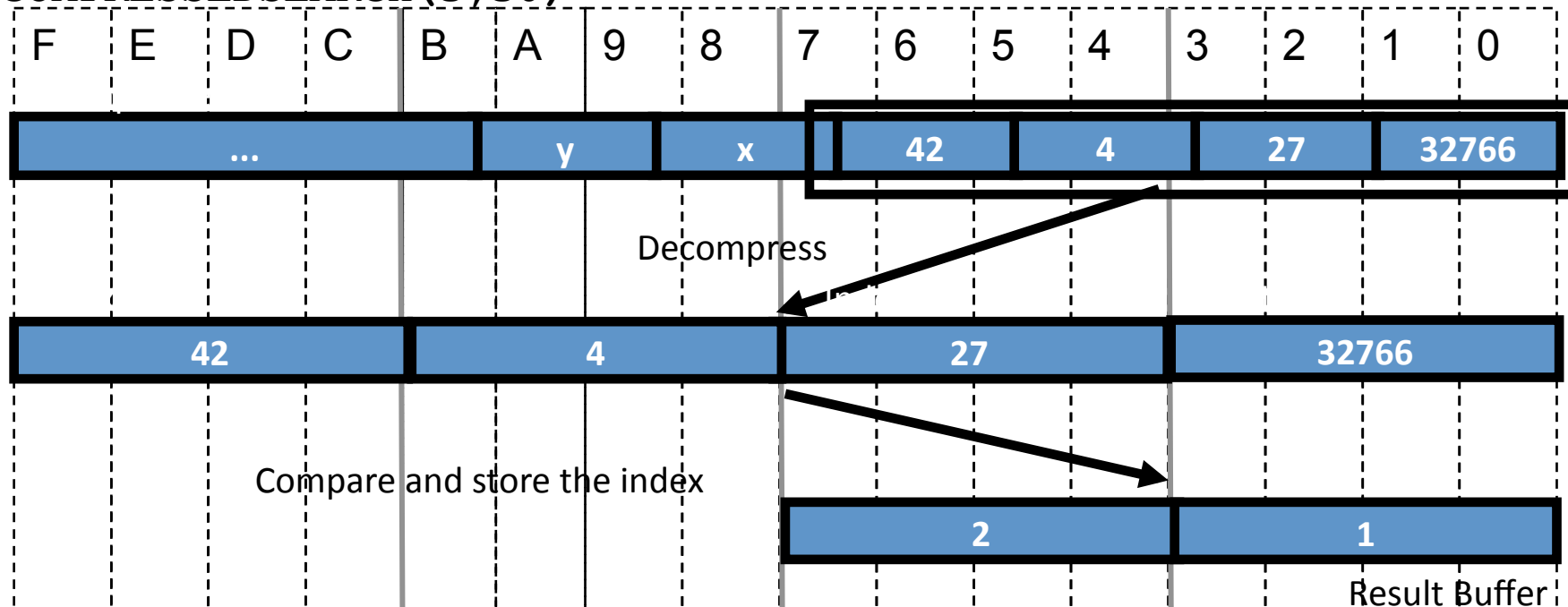
# Full-Table Scan searches on compressed values



Algorithmic optimization by only decompressing the range of values that are of interest:

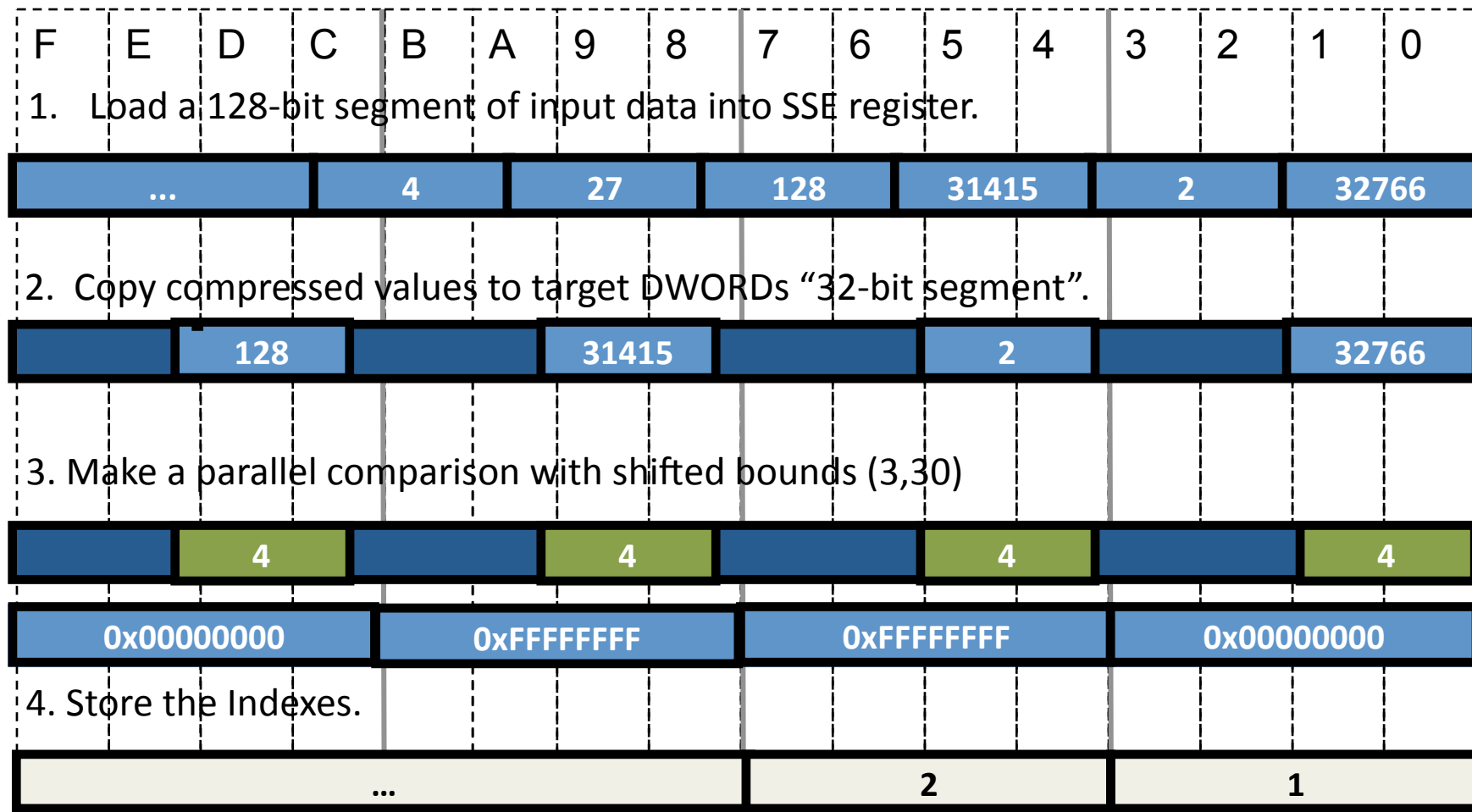
- DECOMPRESS
- And returns indexes of “Index Values” instead of decompressed “Index Values”

COMPRESSEDSEARCH (3, 30)



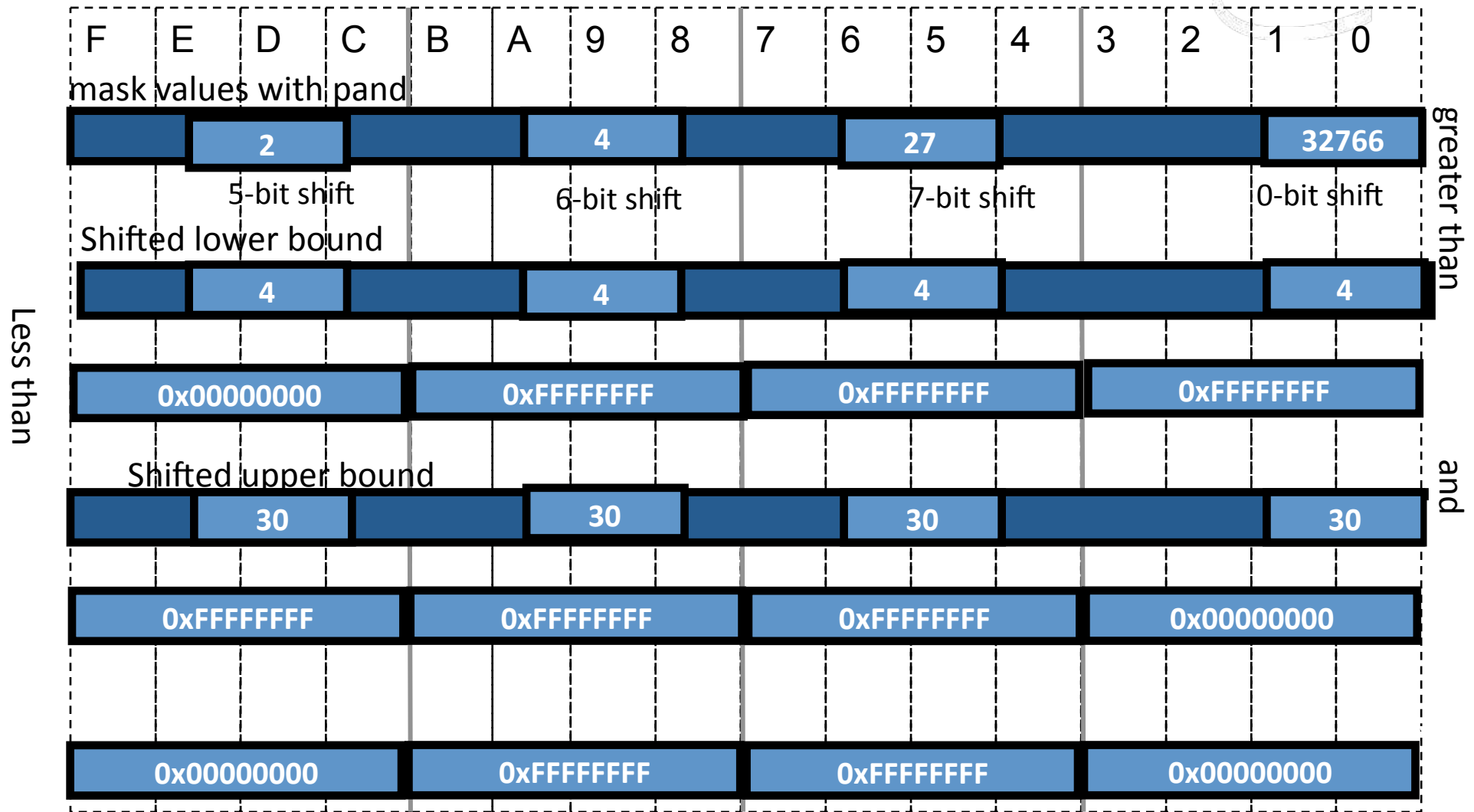
# Basic idea of COMPRESSEDSEARCH

Example: COMPRESSEDSEARCH(3,30) for packed 17-bit fields



# Compare shifted values

Example: COMPRESSEDSEARCH(3,30) for packed 15-bit fields

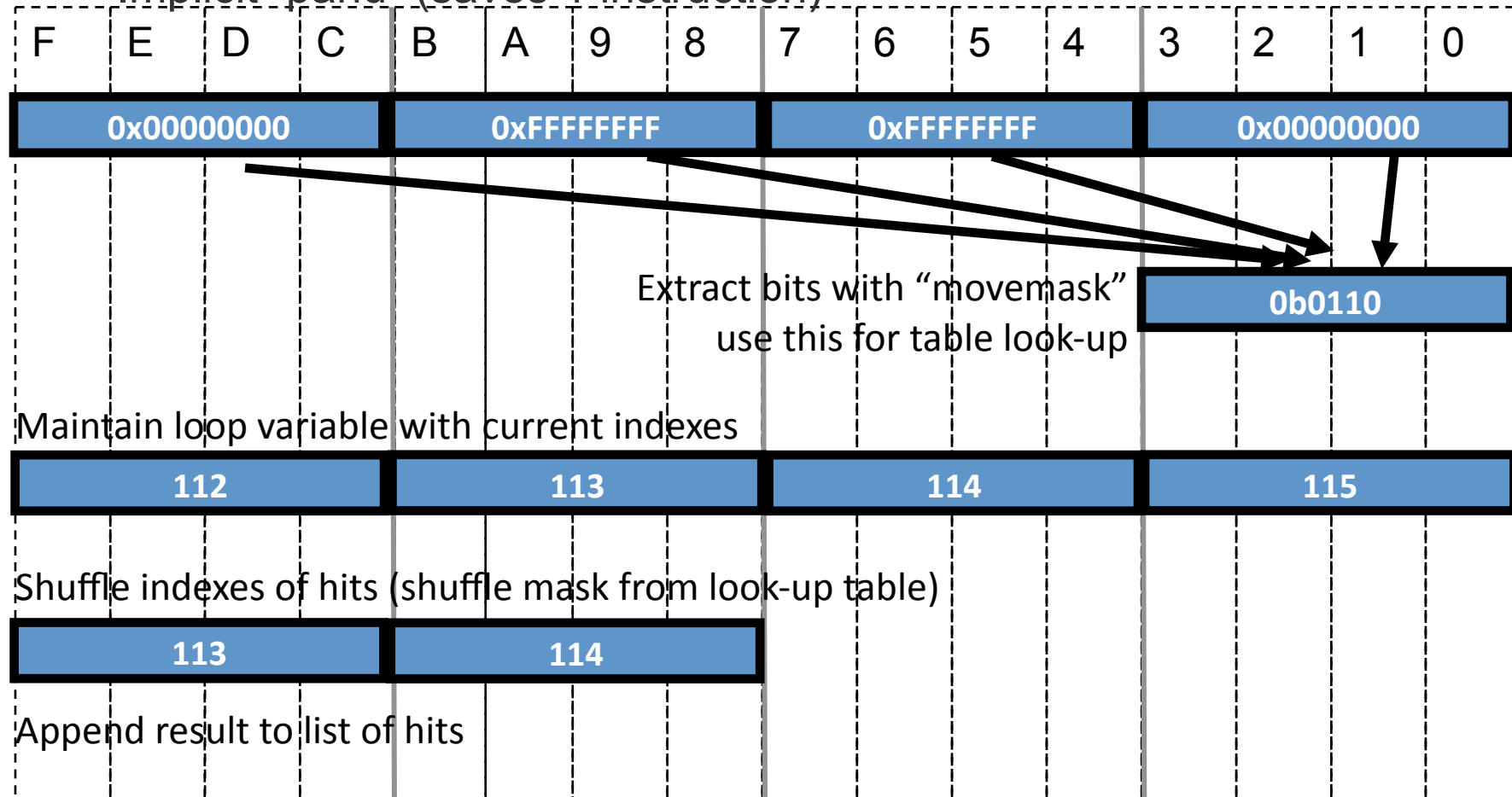


# Hits are stored with look-up table



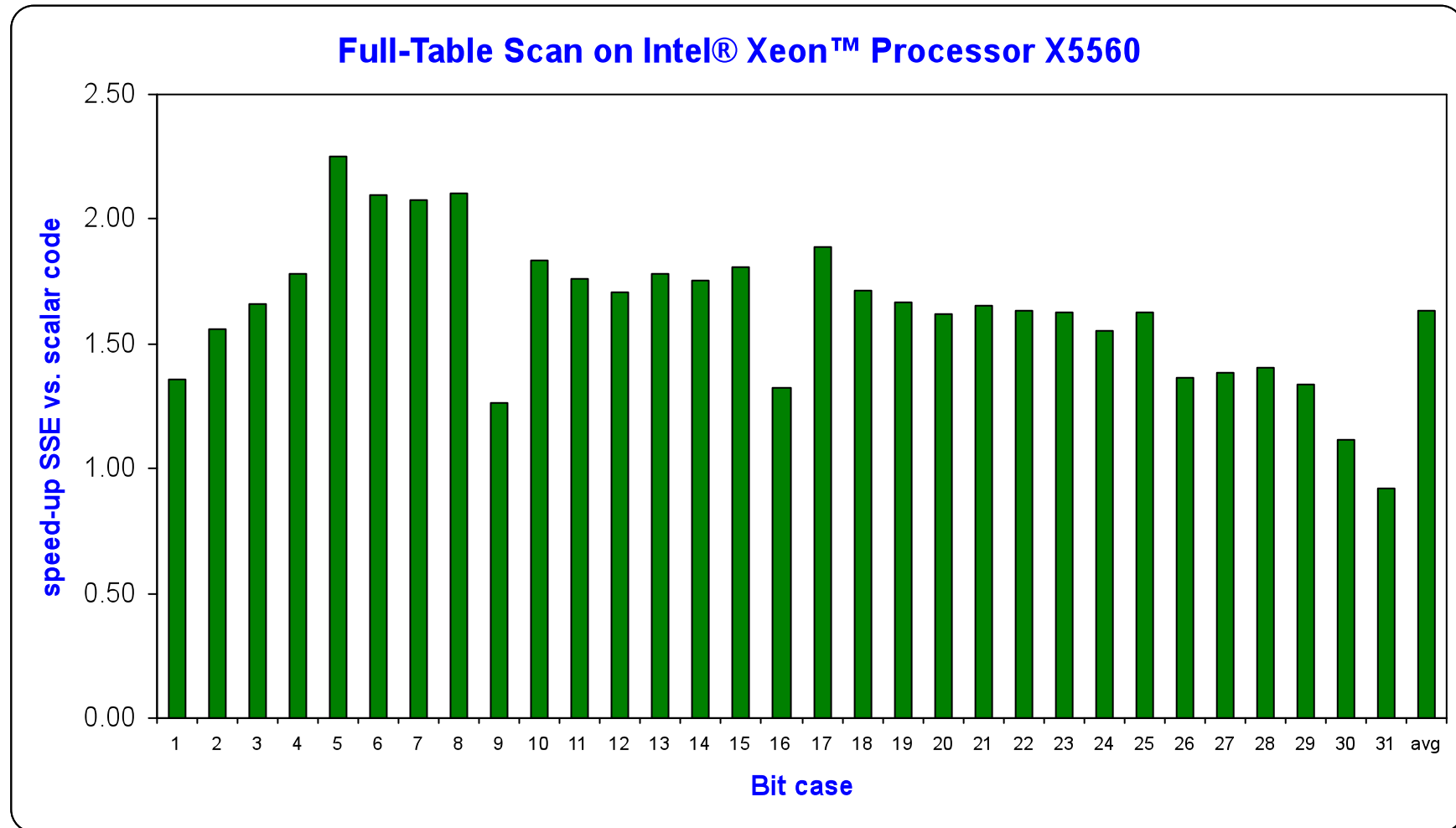
- Test first, if there are any hits with `_mm_testz_si128`

– Implicit “pand” (saves 1 instruction)





# Full-Table Scan is 1.6x faster with SIMD



# Summary



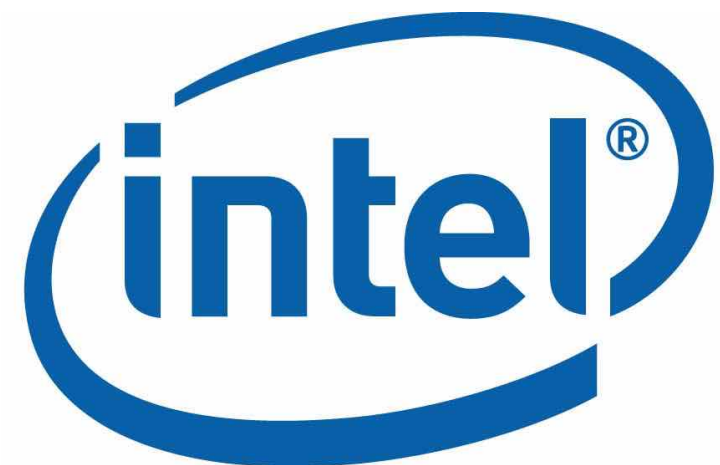
- A single instruction processes multiple data
- Standard arithmetic operations are available
- Use masks for conditional code
- Special instructions for searching and strings
- Column-orientation favors SIMD
- Shuffle and blend to arrange data
- Full-table scan is 1.6x faster with SIMD

Get creative and find new ways to use SIMD!

# References



- Intel® 64 and IA-32 Architectures Software Developer's Manual Volume 2A and 2B <http://www.intel.com/products/processor/manuals/>
- Intrinsics Reference  
[http://software.intel.com/sites/products/documentation/studio/composer/en-us/2009/compiler\\_c/](http://software.intel.com/sites/products/documentation/studio/composer/en-us/2009/compiler_c/)
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- C++ Larrabee Prototype Library  
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