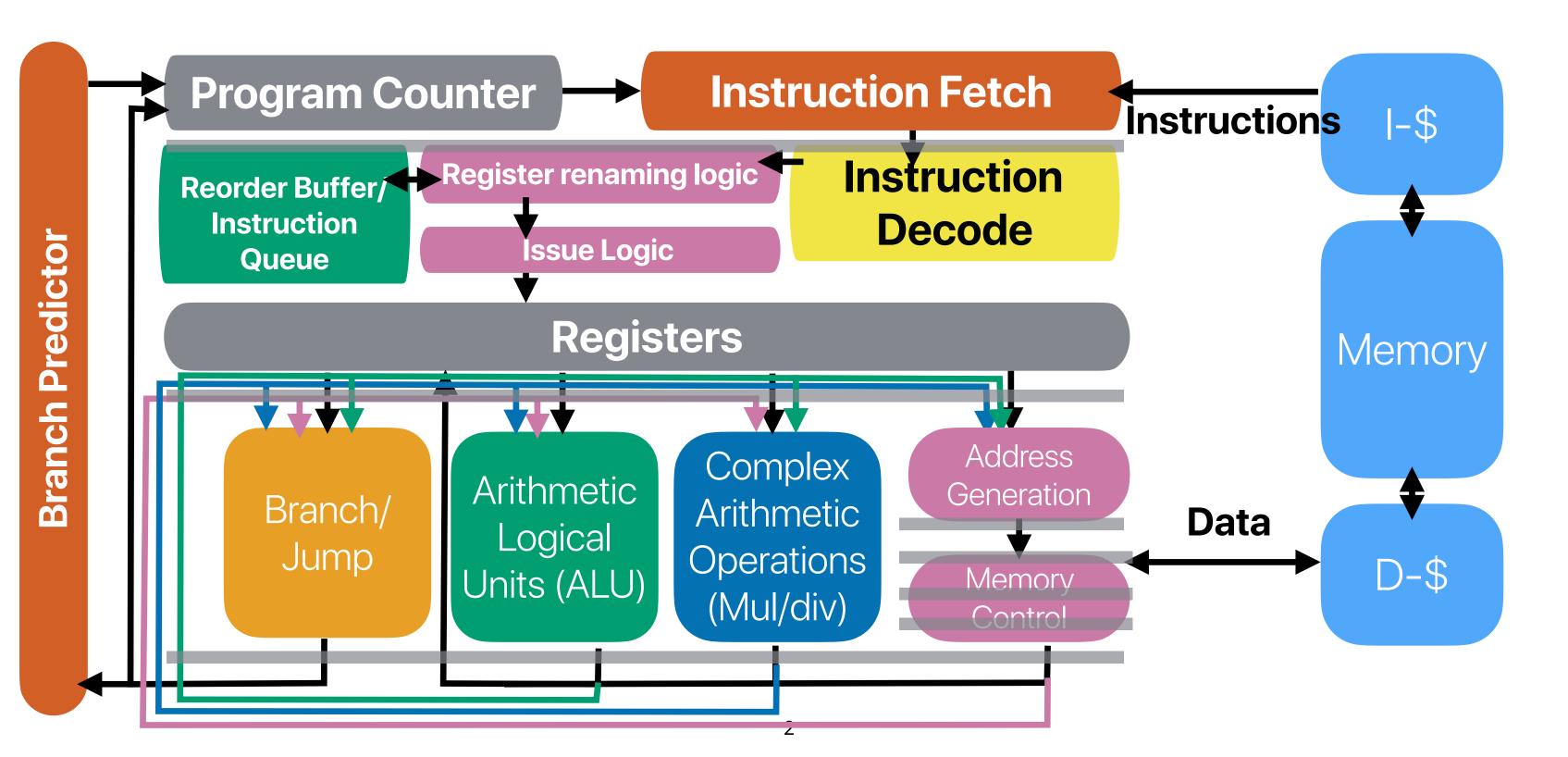
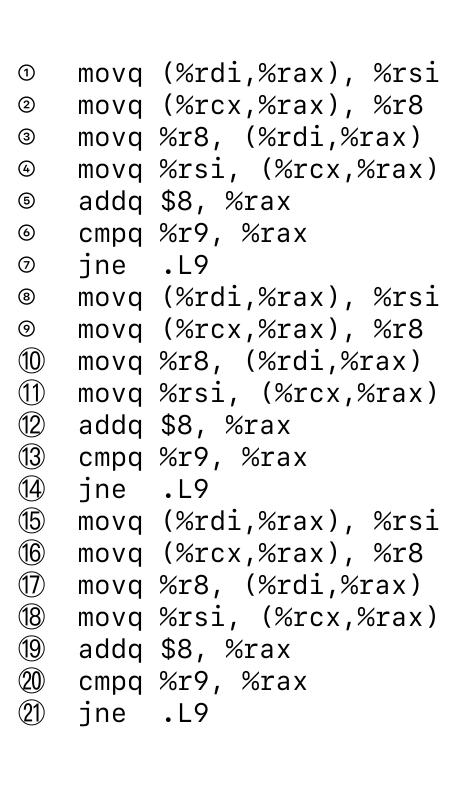
Programming on Modern Processors: The Single Thread Version

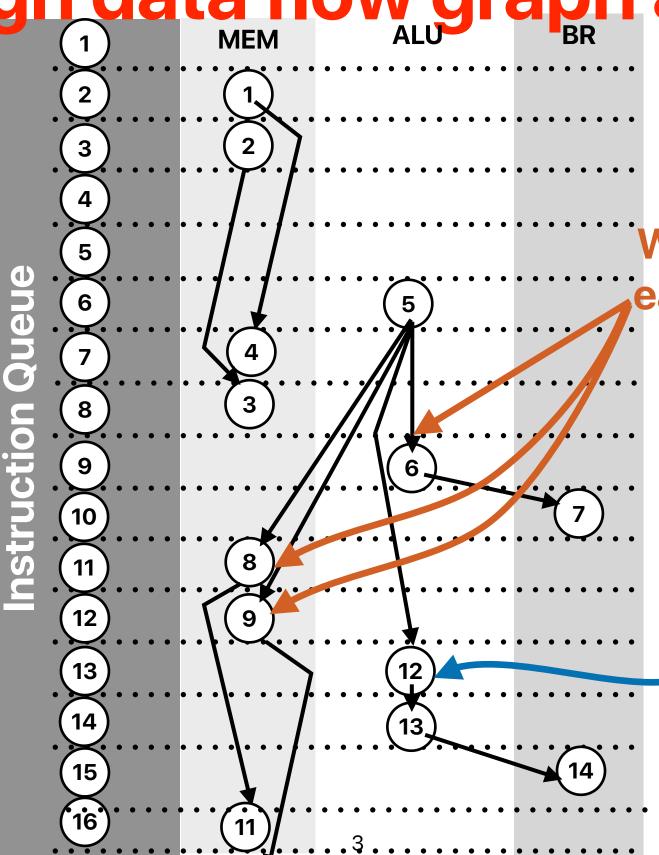
Hung-Wei Tseng

Recap: Register renaming + OoO + RoB



Through data flow graph analysis



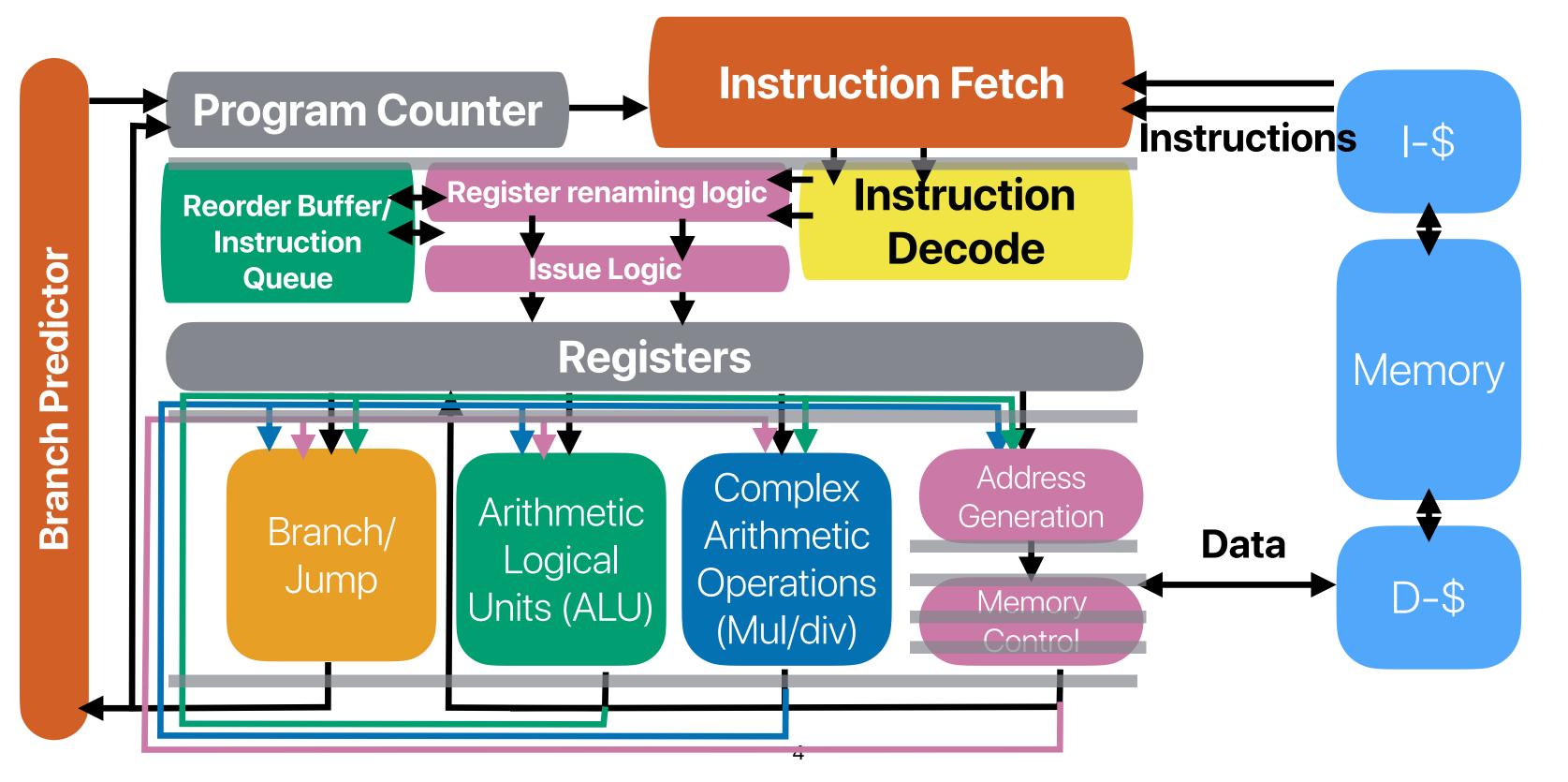


10

We cannot issue them earlier simply because structural hazards!

We could have this executed earlier if it's in the queue earlier

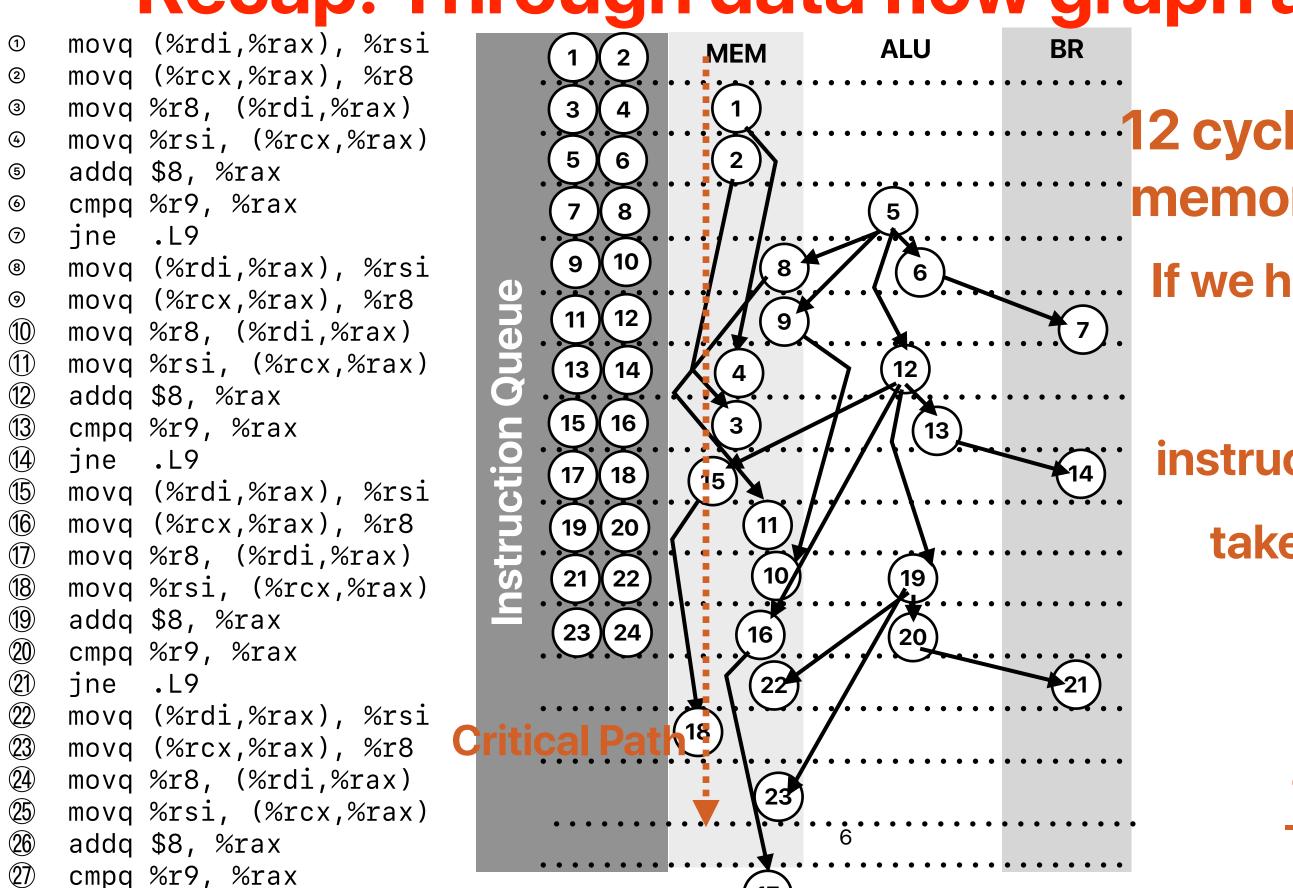
Recap: Register renaming + OoO + ROB + SuperScalar



Recap: Super-Scalar + Register Renaming + Speculative Execution

- SuperScalar: fetching & issuing multiple instructions from the same process/ thread/running program at the same cycle
- Register Renaming & OoO Scheduling
 - Redirecting the output of an instruction instance to a physical register
 - Redirecting inputs of an instruction instance from architectural registers to correct physical registers
 - Executing an instruction all operands are ready (the values of depending physical registers are generated)
- Speculative execution: execute an instruction before the processor know if we need to execute or not
 - Storing results in **reorder buffer** before the processor knows if the instruction is going to be executed or not.
 - Retiring instructions only when all earlier-order instructions are retired

Recap: Through data flow graph analysis



12 cycles for every 11 memory instructions

If we have n loops, it will have 4n memory instructions, 7n instructions in total and $4n \times 11$ take $\frac{4n \times 11}{10} = 4.37n$

cycles

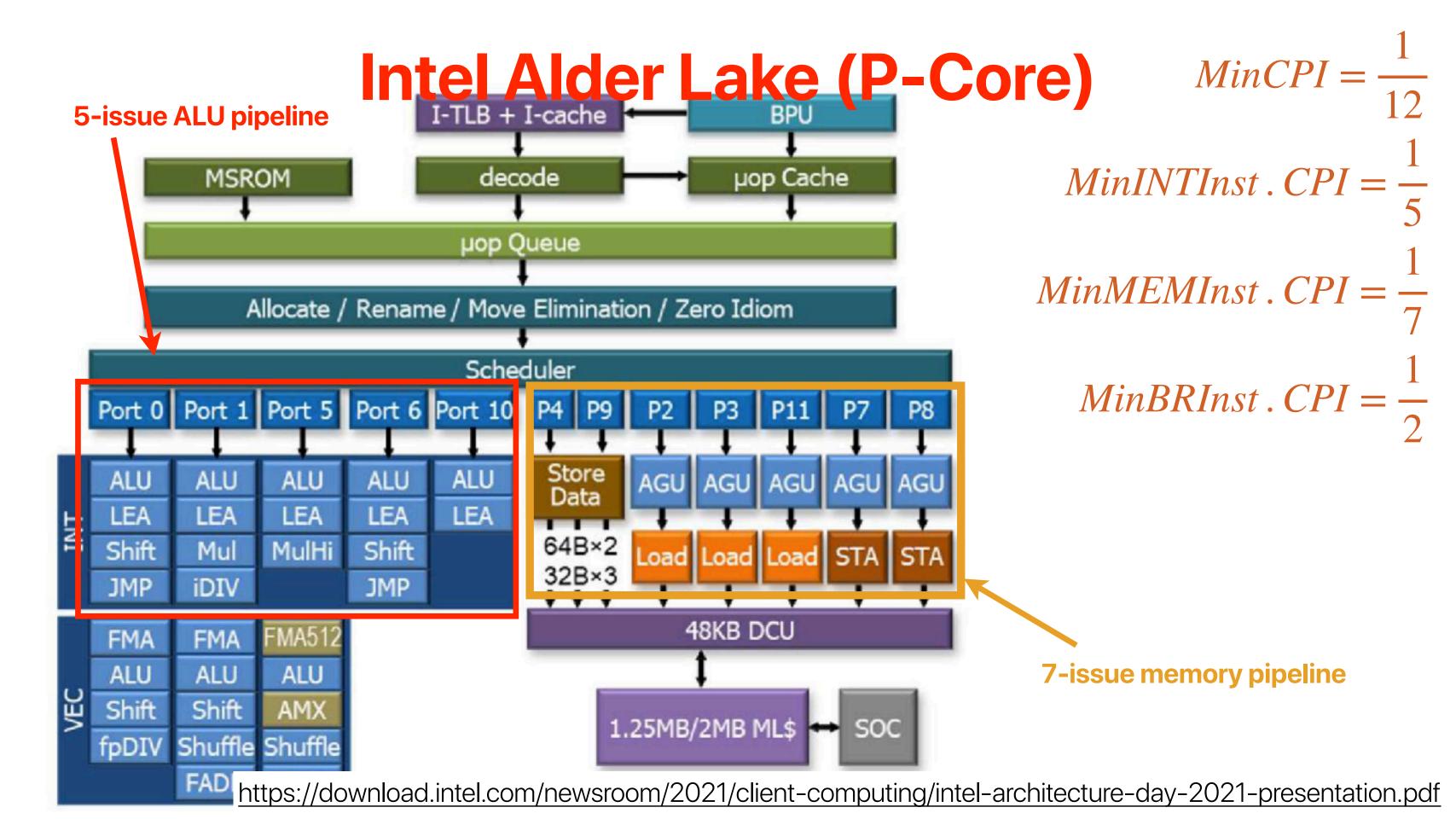
CPI:

$$\frac{4.37n}{7n} = 0.62$$

Refresh our minds! What are the characteristics of modern processors?

Summary: Characteristics of modern processor architectures

- Multiple-issue pipelines with multiple functional units available
 - Multiple ALUs
 - Multiple Load/store units
 - Dynamic OoO scheduling to reorder instructions whenever possible
- Cache very high hit rate if your code has good locality
 - Very matured data/instruction prefetcher
- Branch predictors very high accuracy if your code is predictable
 - Perceptron
 - Tournament predictors



Outline

- Programming on modern processors exploiting instruction– level parallelism
- Simultaneous multithreading



Linked list v.s. arrays

- We can use either a linked list or an array to store a list of data, compare the performance of the array (version A) and linked list (version B) implementations that can achieve the same outcome as below. Assume we have a processor with a reasonably good branch predictor and unlimited fetch/issue width and the dataset size is small enough to fit inside the L1 cache, please identify the correct statements.
 - 1 There is very little performance difference between A and B
 - ② B will outperform A as A has more branch instructions
 - 3 A will outperform B as A has fewer cache misses
 - A will outperform B as A has fewer data dependance related stalls
 - ⑤ A will outperform B as A has fewer dynamic instructions

```
A. 0
B. 1
C. 2
D. 3
E. 4
```

```
for(i=0;i<size;i++)
{
    if(node[i].next)
        number_of_nodes++;
}</pre>
```

```
while(node)
{
    node = node->next;
    number_of_nodes++;
}
```

Linked list v.s. arrays

- We can use either a linked list or an array to store a list of data, compare the performance of the array (version A) and linked list (version B) implementations that can achieve the same outcome as below. Assume we have a processor with a reasonably good branch predictor and unlimited fetch/issue width and the dataset size is small enough to fit inside the L1 cache, please identify the correct statements.
 - 1 There is very little performance difference between A and B
 - ② B will outperform A as A has more branch instructions
 - A will outperform B as A has fewer cache misses about the same
 - 4 A will outperform B as A has fewer data dependance related stalls
 - A will outperform B as A has fewer dynamic instructions

Take a look of their instructions

```
for(i=0;i<size;i++)
{
    if(node[i].next)
        number_of_nodes++;
}</pre>
```

```
① .L9: cmpq $1, 8(%rax)
② sbbl $-1, %edx
③ addq $16, %rax
④ cmpq %rdi, %rax
⑤ jne .L9
```

If we have n iterations, we will execute 5n instructions.

```
while(node)
{
    node = node->next;
    number_of_nodes++;
}
```

```
    ① .L3: movq 8(%rdi), %rdi
    ② addl $1, %eax
    ③ testq %rdi, %rdi
    ④ jne .L3
```

If we have n iterations, we will execute 4n instructions.

Linked list v.s. arrays

- We can use either a linked list or an array to store a list of data, compare the performance of the array (version A) and linked list (version B) implementations that can achieve the same outcome as below. Assume we have a processor with a reasonably good branch predictor and unlimited fetch/issue width and the dataset size is small enough to fit inside the L1 cache, please identify the correct statements.
 - 1 There is very little performance difference between A and B
 - ② B will outperform A as A has more branch instructions
 - A will outperform B as A has fewer cache misses about the same
 - 4 A will outperform B as A has fewer data dependance related stalls
 - ⑤ A will outperform B as A has fewer dynamic instructions more instructions

```
A. 0

B. 1

C. 2

if(node[i].next)

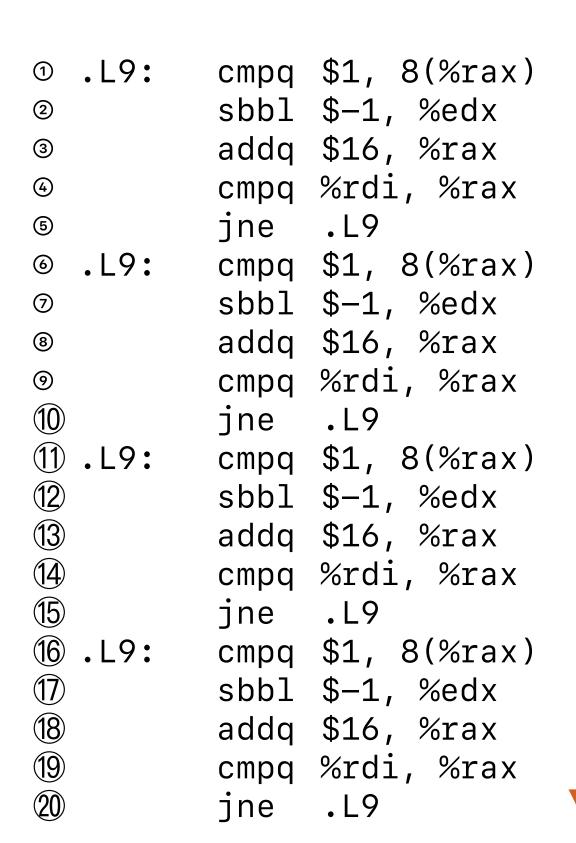
number_of_nodes++;
}

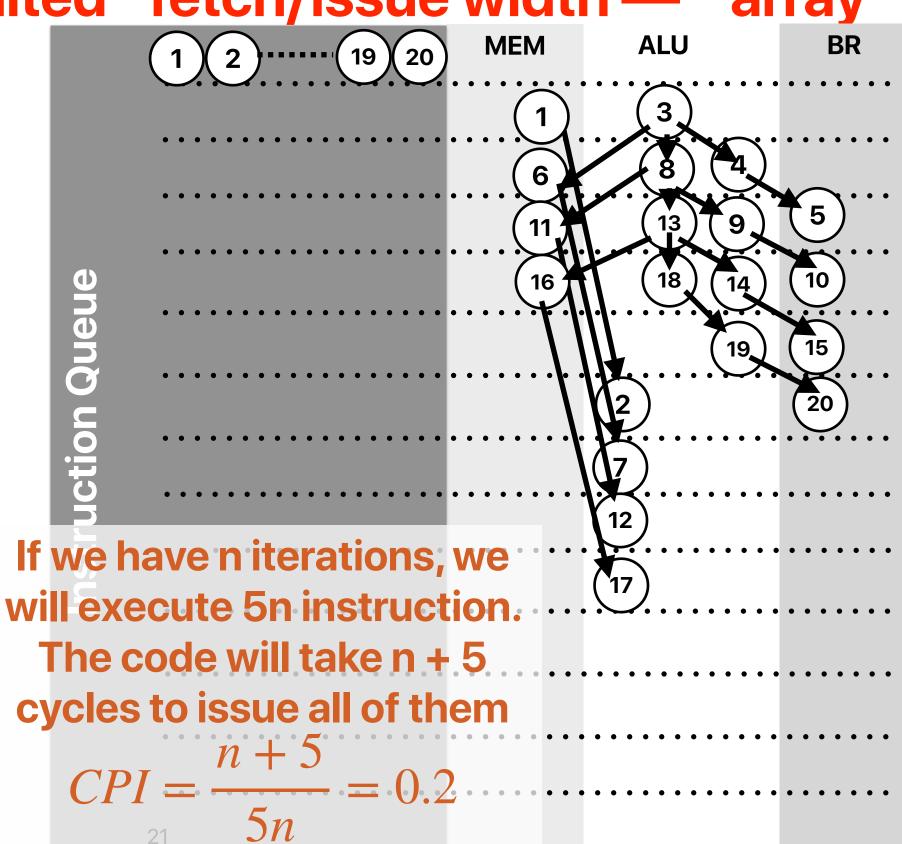
E. 4

for(i=0;i<size;i++)

{
    node = node->next;
    number_of_nodes++;
}
```

What if we have "unlimited" fetch/issue width — "array"







What about "linked list"

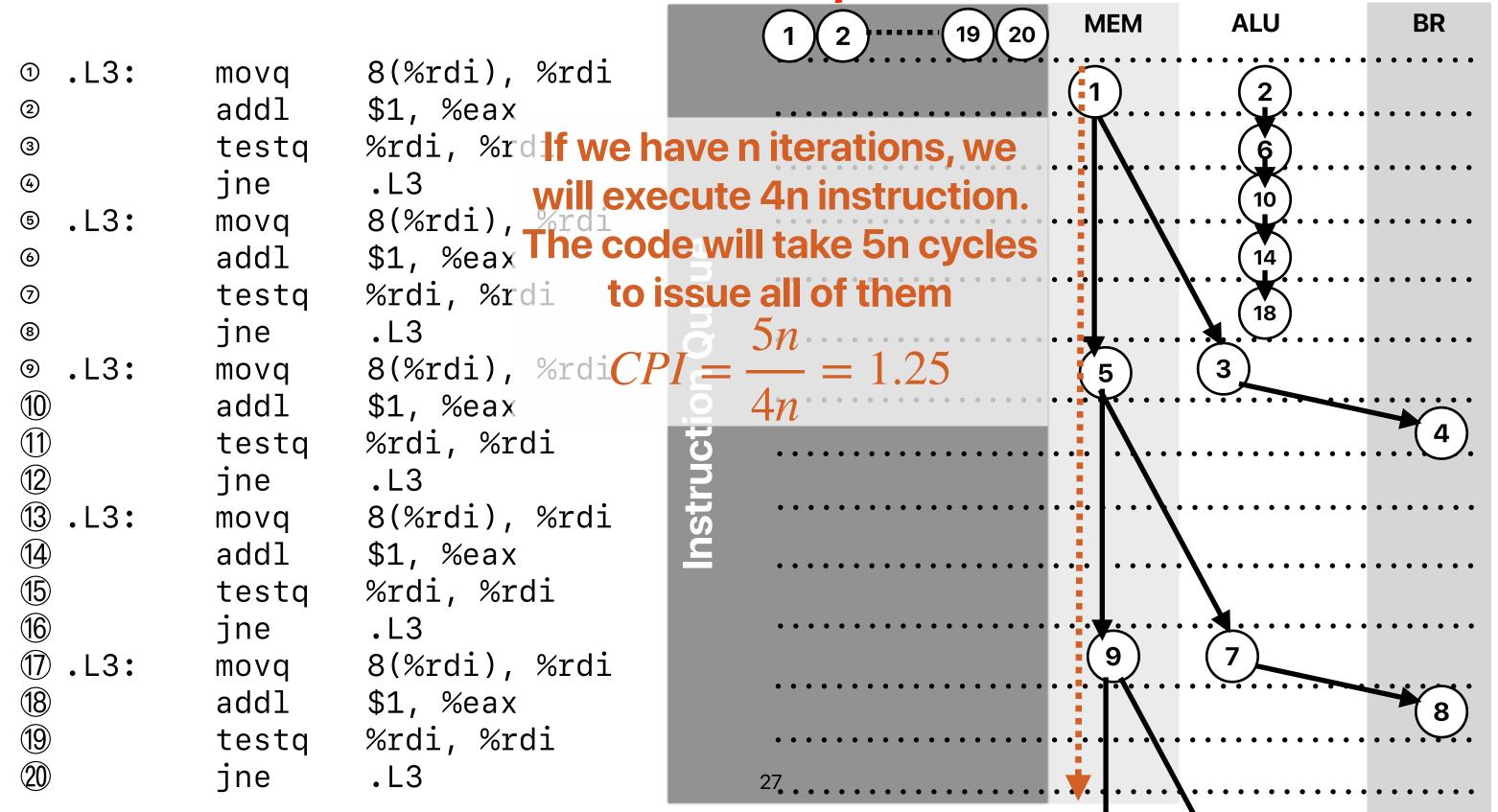
• For the following C code and it's translation in x86, what's **average CPI**? Assume the current PC is already at instruction (1) and this linked list has thousands of nodes. This processor can fetch and issue **unlimited** number of instructions per cycle, with exactly the same register renaming hardware and pipeline as we showed previously (**5-cycle** memory access latencies, 100% hit rate).

① .L3:

```
do {
    number_of_nodes++;
    current = current->next;
} while ( current != NULL )
A. 0.5
B. 0.75
C. 1.0
D. 1.25
E. 1.5
```

```
movq 8(%rdi), %rdi
addl $1, %eax
testq %rdi, %rdi
jne .L3
```

What if we have "unlimited" fetch/issue width — "linked list"

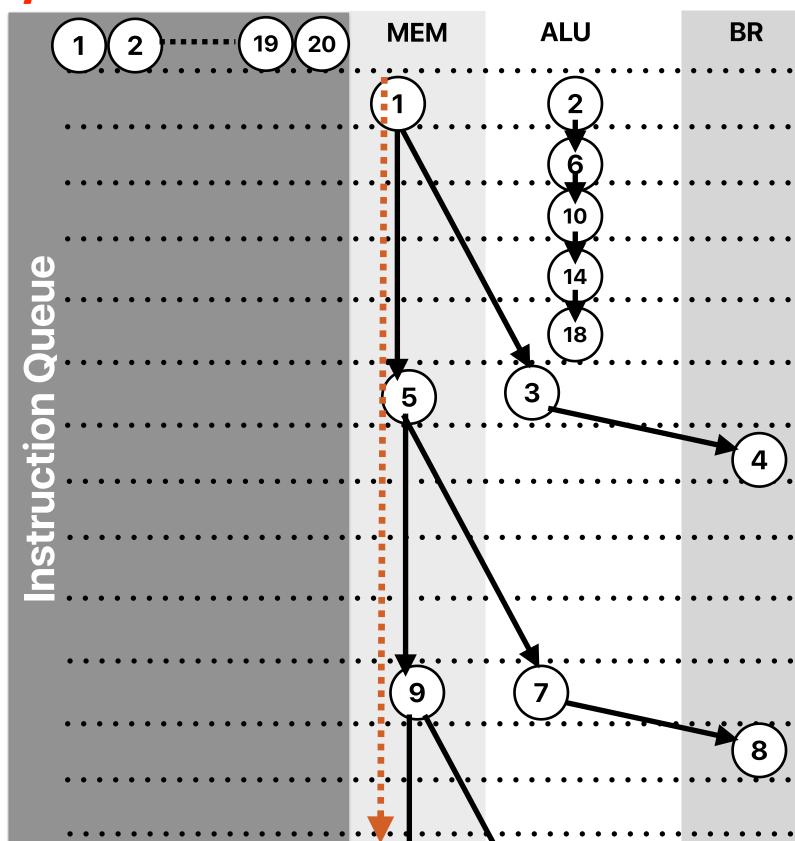


What if we have "unlimited" fetch/issue width — "linked list"

If we cannot improve the performance of executing movq 8(%rdi), %rdi we cannot improve the execution time. That's the "critical path"!

```
do {
    number_of_nodes++;
    current = current->next;
} while ( current != NULL );

① .L3: movq 8(%rdi), %rdi
② addl $1, %eax
③ testq %rdi, %rdi
④ jne .L3
```



What if we have "unlimited" fetch/issue width — "linked list"

MEM

(19)(20)

ALU

BR

If we cannot improve the performance of executing movq 8(%rdi), %rdi we cannot improve the execution time.

8(%rdi), %rdi

\$1, %eax

.L3

%rdi, %rdi

.L3:

mova

addl

jne

testq

What about "linked list"

• For the following C code and it's translation in x86, what's **average CPI**? Assume the current PC is already at instruction (1) and this linked list has thousands of nodes. This processor can fetch and issue **unlimited** number of instructions per cycle, with exactly the same register renaming hardware and pipeline as we showed previously (**5-cycle** memory access latencies, 100% hit rate).

```
do {
    number_of_nodes++;
    current = current->next;
} while ( current != NULL )
A. 0.5
B. 0.75
C. 1.0
D. 1.25
E. 1.5
```

```
    ① .L3: movq 8(%rdi), %rdi
    ② addl $1, %eax
    ③ testq %rdi, %rdi
    ④ jne .L3
```

Linked list v.s. arrays

- We can use either a linked list or an array to store a list of data, compare the performance of the array (version A) and linked list (version B) implementations that can achieve the same outcome as below. Assume we have a processor with a reasonably good branch predictor and unlimited fetch/issue width and the dataset size is small enough to fit inside the L1 cache, please identify the correct statements.
 - 1 There is very little performance difference between A and B
 - ② B will outperform A as A has more branch instructions
 - ③ A will outperform B as A has fewer cache misses
 - A will outperform B as A has fewer data dependance related stalls
 - ⑤ A will outperform B as A has fewer dynamic instructions

```
A. 0

B. 1

C. 2

D. 3

E. 4

| for(i=0;i<size;i++) { | while(node) | { | node = node->next; | number_of_nodes++; | } }
```

Perfectly matches our analysis!!!

size	list	IC	Cycles	CPI	СТ	ET	L1_dcache_miss_rate
1024	array	514259657	106295528	0.206696	0.197243	0.020966	0.000014
1024	list	411795196	515812542	1.252595	0.196544	0.101380	0.000071

Linked-list is never an ideal option CPI is a lot higher even with lower IC, perfect cache and branch predictors

1024 array 514259657 106295528 0.206696 0.197243 0.020966 0.000014 1024 list 411795196 515812542 1.252595 0.196544 0.101380 0.000071	size	list	IC	Cycles	СРІ	СТ	ET	L1_dcache_miss_rate
1024 list 411795196 515812542 1.252595 0.196544 0.101380 0.000071	1024	array	514259657	106295528	0.206696	0.197243	0.020966	0.000014
	1024	list	411795196	515812542	1.252595	0.196544	0.101380	0.000071

size	list	IC	Cycles	СРІ	СТ	ET	L1_dcache_miss_rate
4096	array	205080322	41547848	0.202593	0.196833	0.008178	0.250965
4096	list	164474202	356755154	2.169065	0.196561	0.070124	0.334309
8192	array	409931842	82621771	0.201550	0.196462	0.016232	0.250467
8192	list	329389168	1048885357	3.184335	0.196532	0.206140	0.701870

\$ miss rate dominates the performance despite lower ICs than using arrays

Takeaways: programming modern processors

- The key to efficient code is exploiting as much instruction-level parallelism (ILP) or say higher instructions per cycle (IPC) or lower cycles per instruction (CPI) as possible
 - Avoiding data dependent operations (e.g., pointer chasing)
 - Avoiding inter-iteration dependencies (e.g., linked list, trees)

Problem: Popcount

- The population count (or popcount) of a specific value is the number of set bits (i.e., bits in 1s) in that value.
- Applications
 - Parity bits in error correction/detection code
 - Cryptography
 - Sparse matrix
 - Molecular Fingerprinting
 - Implementation of some succinct data structures like bit vectors and wavelet trees.

Problem: Popcount

• Given a 64-bit integer number, find the number of 1s in its binary representation.

• Example 1:

Input: 59487

Output: 9

Explanation: 59487's binary representation is

0b10110010100001111

```
int main(int argc, char *argv[]) {
     uint64_t key = 0xdeadbeef;
     int count = 1000000000;
     uint64_t sum = 0;
     for (int i=0; i < count; i++)
         sum += popcount(RandLFSR(key));
     printf("Result: %lu\n", sum);
     return sum;
```



Five implementations

Which of the following implementations will perform the best on modern

pipeline processors?

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
        c += x & 1;
        x = x >> 1;
     }
  return c;
}
```

```
inline int popcount(uint64_t x) {
    int c = 0;
    int table[16] = {0, 1, 1, 2, 1,
2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
    while(x) {
        c += table[(x & 0xF)];
        x = x >> 4;
    }
    return c;
}
```

```
inline int popcount(uint64_t x) {
   int c = 0;
   while(x) {
     c += x \& 1;
    x = x >> 1;
    c += x \& 1;
    x = x >> 1;
    c += x \& 1;
    x = x >> 1;
    c += x \& 1;
    x = x >> 1;
   return c;
inline int popcount(uint64_t x) {
     int c = 0;
     int table[16] = \{0, 1, 1, 2, 1,
2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
     for (uint64_t i = 0; i < 16; i++)
         c += table[(x & 0xF)];
         x = x \gg 4;
     return c;
```

```
inline int popcount(uint64_t x) {
     int c = 0;
     for (uint64 t i = 0; i < 16; i++)
         switch((x & 0xF))
             case 1: c+=1; break;
             case 2: c+=1; break;
             case 3: c+=2; break;
             case 4: c+=1; break;
             case 5: c+=2; break;
             case 6: c+=2; break;
             case 7: c+=3; break;
             case 8: c+=1; break;
             case 9: c+=2; break;
             case 10: c+=2; break;
             case 11: c+=3; break;
             case 12: c+=2; break;
             case 13: c+=3; break;
             case 14: c+=3; break;
             case 15: c+=4; break;
             default: break;
         x = x \gg 4;
     return c;
```

Five implementations

Which of the following implementations will perform the best on modern pipeline

processors?

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
      c += x & 1;
      x = x >> 1;
    }
  return c;
}
```

```
inline int popcount(uint64_t x) {
    int c = 0;
    int table[16] = {0, 1, 1, 2, 1,
2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
    while(x) {
        c += table[(x & 0xF)];
        x = x >> 4;
    }
    return c;
}
```

```
inline int popcount(uint64_t x) {
  int c = 0;
  while(x) {
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
    c += x & 1;
    x = x >> 1;
}
return c;
}
```

```
line int popcount(uint64_t x) {
    int c = 0;
    int table[16] = {0, 1, 1, 2, 1,
    2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
    for (uint64_t i = 0; i < 16; i++)
    {
        c += table[(x & 0xF)];
        x = x >> 4;
    }
    return c;
}
```

```
inline int popcount(uint64 t x) {
     int c = 0:
     for (uint64 t i = 0; i < 16; i++)
         switch((x \& 0xF))
             case 1: c+=1; break;
             case 2: c+=1; break;
             case 3: c+=2; break;
             case 4: c+=1; break;
             case 5: c+=2; break;
             case 6: c+=2; break;
             case 7: c+=3; break;
             case 8: c+=1; break;
             case 9: c+=2; break;
             case 10: c+=2; break;
             case 11: c+=3; break;
             case 12: c+=2; break;
             case 13: c+=3; break;
             case 14: c+=3; break;
             case 15: c+=4; break;
             default: break;
         x = x >> 4;
     return c;
```



- How many of the following statements explains the reason why B outperforms A with compiler optimizations
 - ① B has lower dynamic instruction count than A
 - ② B has significantly lower branch mis-prediction rate than A
 - 3 B has significantly fewer branch instructions than A
 - B has better CPI than A
 - A. 0
 - B. 1
 - C. 2
 - D. 3
 - E. 4

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
    c += x & 1;
    x = x >> 1;
  }
  return c;
}
```

- How many of the following statements explains the reason why B outperforms A with compiler optimizations
 - ① B has lower dynamic instruction count than A
 - ② B has significantly lower branch mis-prediction rate than A
 - 3 B has significantly fewer branch instructions than A
 - B has better CPI than A

```
A. 0
```

B. 1

C. 2

D. 3

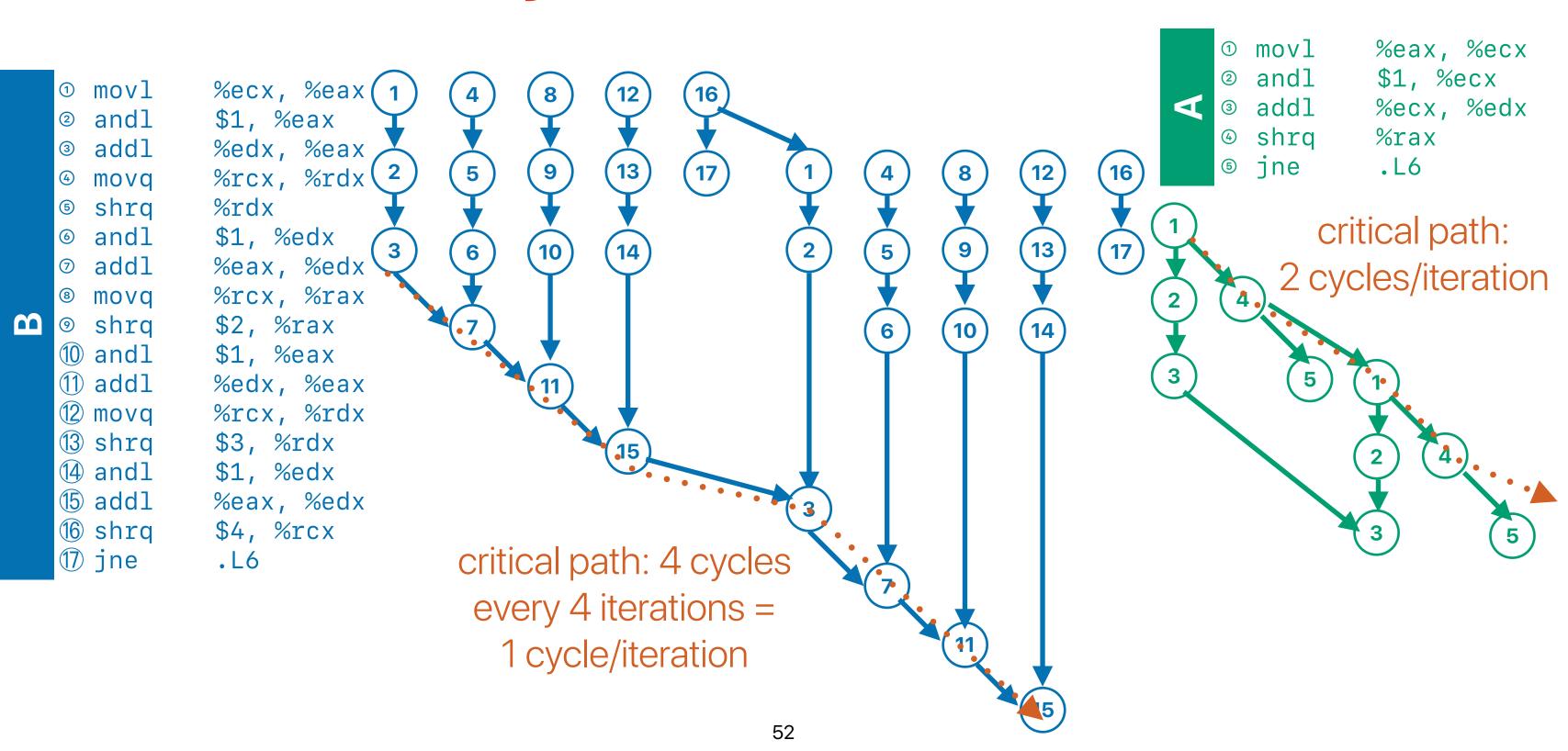
E. 4

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
    c += x & 1;
    x = x >> 1;
  }
  return c;
}
```

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
      c += x & 1;
      x = x >> 1;
    }
  return c;
}
```

```
%eax, %ecx
            movl
                    $1, %ecx
            andl
                    %ecx, %edx
            addl
            shrq
                    %rax
                                       %ecx, %eax
                               movl
            jne
                     .L6
                                       $1, %eax
                               andl
                               addl
                                       %edx, %eax
            5*n instructions
                                       %rcx, %rdx
                               movq
                               shrq
                                       %rdx
                                       $1, %edx
                               andl
                               addl
                                       %eax, %edx
                                       %rcx, %rax
                               movq
                               shrq
                                       $2, %rax
                                       $1, %eax
                               andl
                               addl
                                       %edx, %eax
                                       %rcx, %rdx
                               movq
17*(n/4) = 4.25*n instructions
                               shrq
                                       $3, %rdx
                                       $1, %edx
                               andl
                               addl
                                       %eax, %edx
                               shrq
                                       $4, %rcx
                               jne
                                        .L6
```

Only one branch for four iterations in A



- How many of the following statements explains the reason why B outperforms A with compiler optimizations
 - B has lower dynamic instruction count than A
 - ② B has significantly lower branch mis-prediction rate than A
 - B has significantly fewer branch instructions than A
 - B has better CPI
 - A. 0
 - B. 1
 - C. 2
 - D. 3
 - E. 4

```
inline int popcount(uint64_t x){
  int c=0;
  while(x) {
    c += x & 1;
    x = x >> 1;
  }
  return c;
}
```

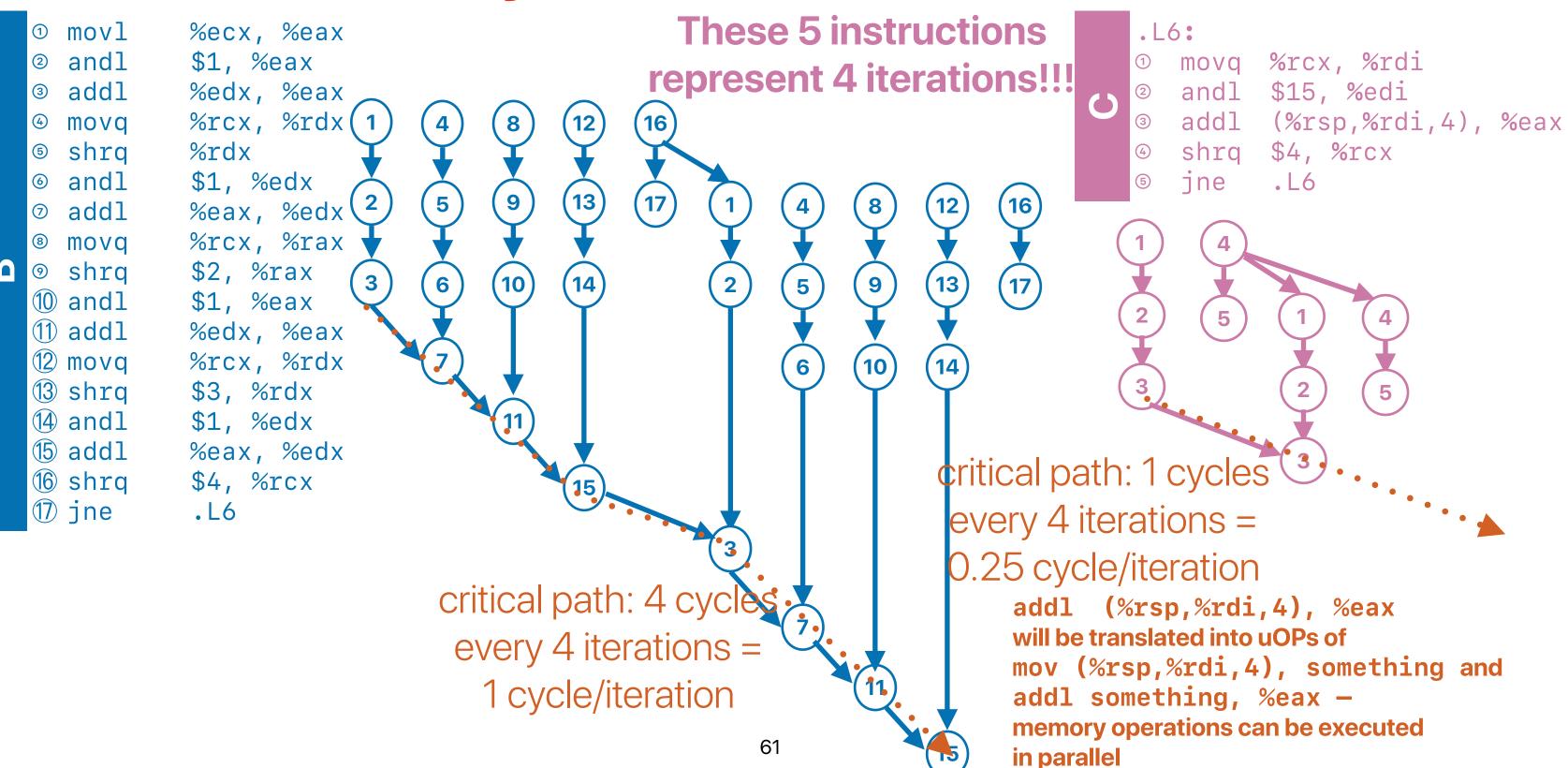
Takeaways: programming modern processors

- The key to efficient code is exploiting as much instruction-level parallelism (ILP) or say higher instructions per cycle (IPC) or lower cycles per instruction (CPI) as possible
- Loop unrolling is effective as control overhead is still significant despite we have branch predictors and OoO.



- How many of the following statements explains the reason why B outperforms C with compiler optimizations
 - ① C has lower dynamic instruction count than B
 - ② C has significantly lower branch mis-prediction rate than B
 - ③ C has significantly fewer branch instructions than B
 - 4 C has better CPI than B
 - A. 0
 - B. 1
 - C. 2
 - D. 3
 - E. 4

```
inline int popcount(uint64_t x) {
    int c = 0;
    int table[16] = {0, 1, 1, 2, 1,
    2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
    while(x) {
        c += table[(x & 0xF)];
        x = x >> 4;
    }
    return c;
}
```



 How many of the following statements explains the reason why B outperforms C with compiler optimizations

C has lower dynamic instruction count than B C only needs one load, one add, one shift, the same amount of iterations.

② C has significantly lower branch mis-prediction rate than B The same number being predicted.

The same number being predicted.

The same amount of branches

C has better CPI than B
 Probably not. In fact, the load may have negative

A. Oeffect without architectural supports

C. 2

D. 3

```
inline int popcount(uint64_t x) {
        int c = 0;
        int table[16] = \{0, 1, 1, 2, 1,
   2, 2, 3, 1, 2, 2, 3, 2, 3, 3, 4};
        while(x)
0
            c += table[(x & 0xF)];
            x = x \gg 4;
        return c;
```

```
inline int popcount(uint64_t x) {
   int c = 0;
   while(x)
     c += x & 1;
     x = x \gg 1;
     c += x & 1;
     x = x \gg 1;
     c += x & 1;
    x = x \gg 1;
     c += x & 1;
     x = x \gg 1;
   return c;
```

Takeaways: programming modern processors

- The key to efficient code is exploiting as much instruction-level parallelism (ILP) or say higher instructions per cycle (IPC) or lower cycles per instruction (CPI) as possible
 - Avoiding data dependent operations (e.g., pointer chasing)
 - Avoiding inter-iteration dependencies (e.g., linked list, trees)
- Loop unrolling is effective as control overhead is still significant despite we have branch predictors and OoO.
- With caches, we can potentially use small lookup tables to replace more expensive data dependent operations

Computer Science & Engineering

203



