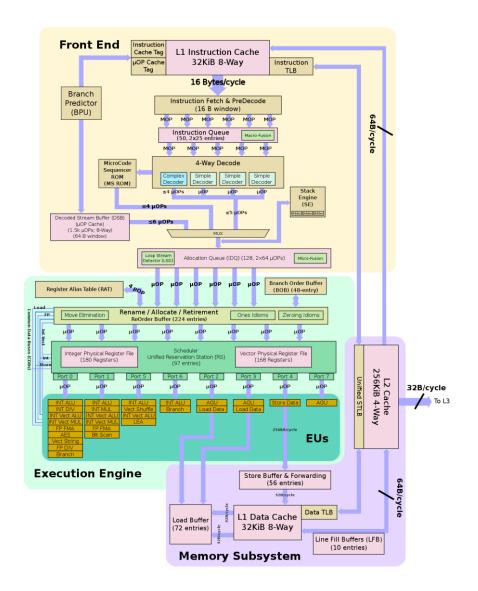
谢天

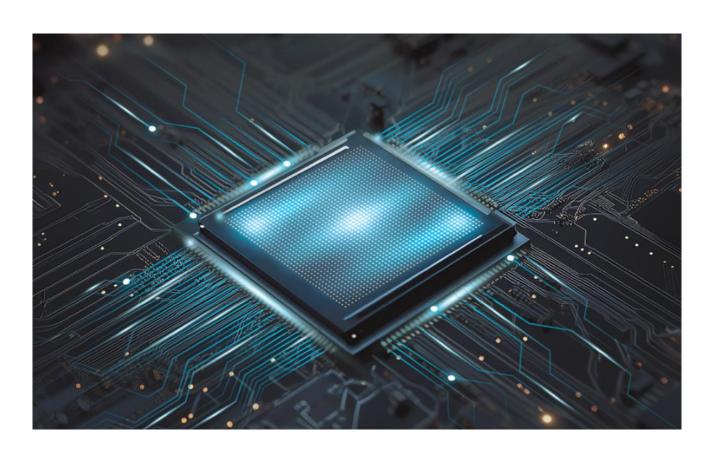
单核篇

CPU Performance



Disclaimer

声明



- 1. 分享内容基于个人的经验,测试数据都是特定情况下的数据,不具有通用性
- 2. Opinions are my own,我的观点不代表FF 引擎组 or 公司的观点
- 3. 时间有限,只能分享一些我觉得有趣的方面, 欢迎提问交流/会后交流

Performance Matters



Sebastian Aaltonen

@SebAaltonen

Example of modern user-generated content in HypeHype: This scene has thousands of skinned characters, thousands of physics objects and over 10,000 audio sources. It runs at 60 fps on 99\$ phone. It doesn't look fancy, but it would choke Unity even on high end PC.



Sebastian Aaltonen @SebAaltonen · Nov 29

Worth noting: Above example has no tricks at all. Each character's bone animation and skinning runs at 60Hz. There's no animation sharing. The trick is to optimize the code. Then you don't need to limit character count or run animation at 10 fps.

Q 12

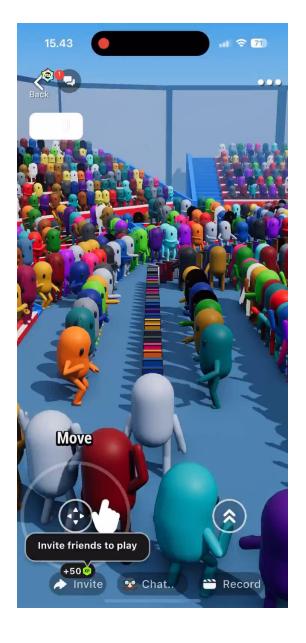
13

226

ılı 9.3K

 \Box

仚



Performance Tuning

Low-level optimizations (On Single Core)

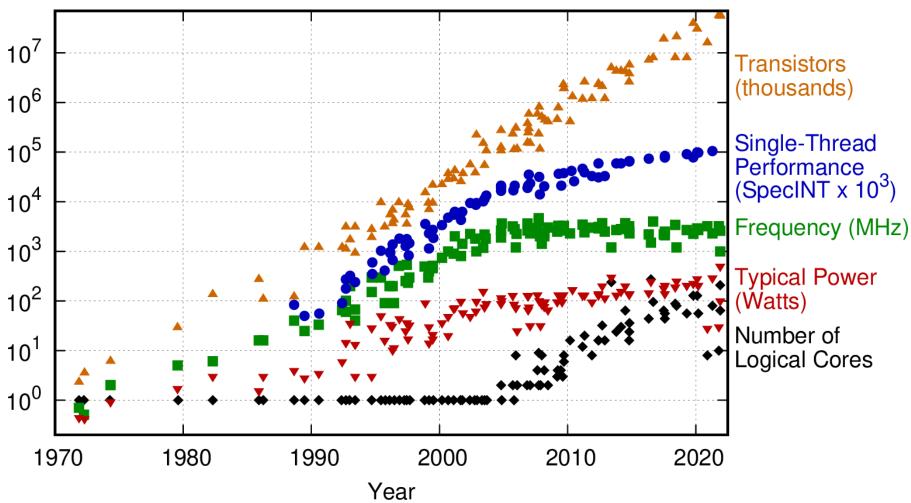
takes into account the details of the underlying hardware capabilities.

High-level optimizations

more about application-level logic, algorithms, and data structures.

The free lunch is over.

50 Years of Microprocessor Trend Data



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten New plot and data collected for 2010-2021 by K. Rupp

性能分析方法

责怪他人法

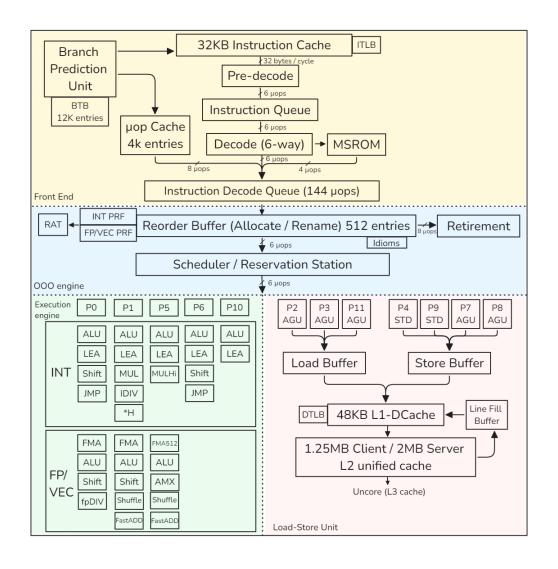
- 1.找到一个不是你负责的系统或环境的组件
- 2.假定问题是与那个组件相关的
- 3.把问题扔给负责恶个组件的团队
- 4.如果证明错了,返回步骤1

性能分析方法

Identifying CPU bottlenecks

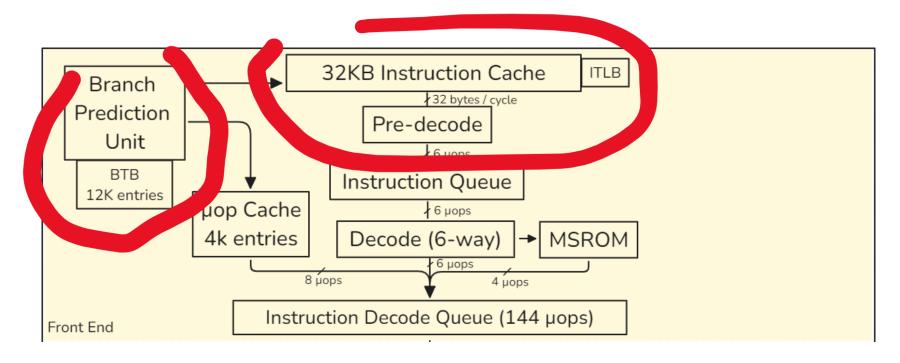
Top-down Microarchitecture Analysis Method

Microarchitecture: CPU simplified view



Front End

Fetch and decode instructions from memory



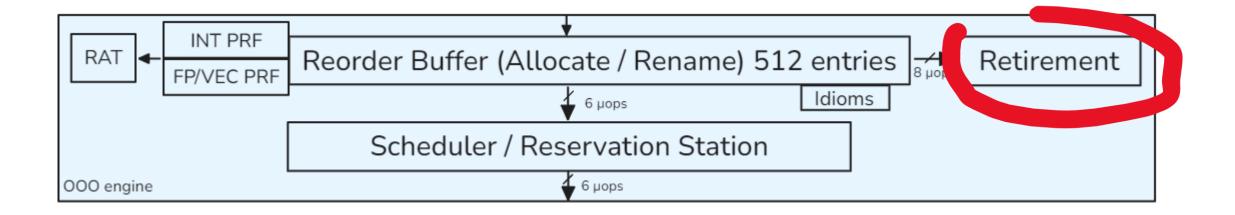
x86: translate CISC instructions into simple μ ops => TMAM based on μ ops/uop

The CPU Frontend **fetches** 32 bytes per cycle of x86 instructions from the L1 I-cache => **Potential stall!**

The BPU predicts the target of all branch instructions based on prediction => Potential stall!

Back End

an OOO engine that executes instructions and stores results

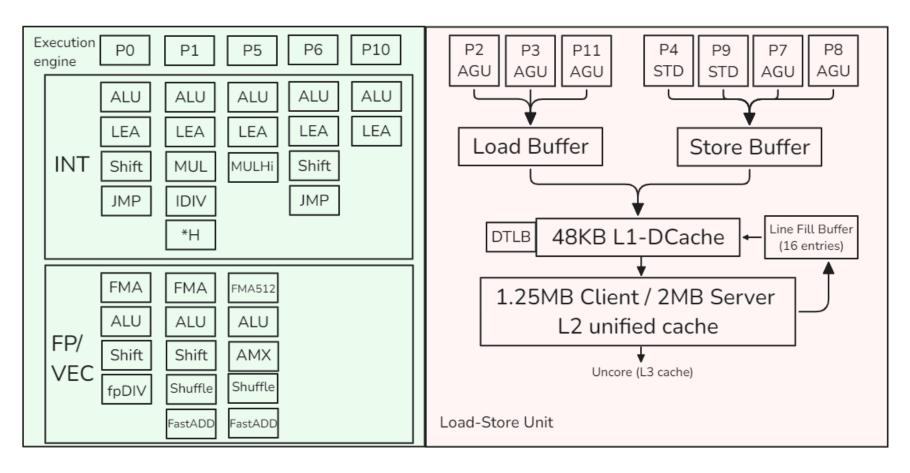


ReOrder Buffer: Register renaming, allocates execution resources, tracks speculative execution.

The Scheduler / Reservation Station: tracks the availability of all resources for a given μ op and dispatches the μ op to an execution port once it is ready.

Back End

The execution engine and the Load-Store unit



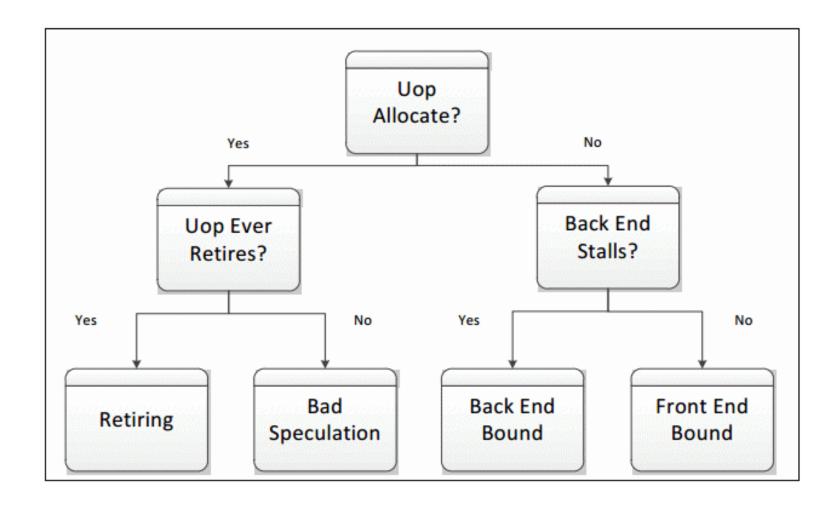
12 execution ports

When a scheduler has to dispatch two operations that require the same execution port, one of them will have to be delayed.

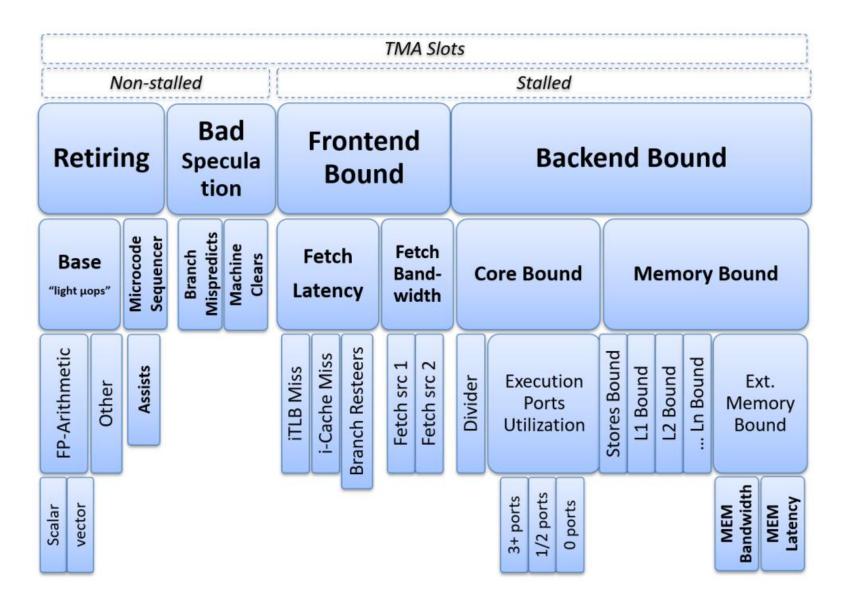
Potential stall!

Potential stall!

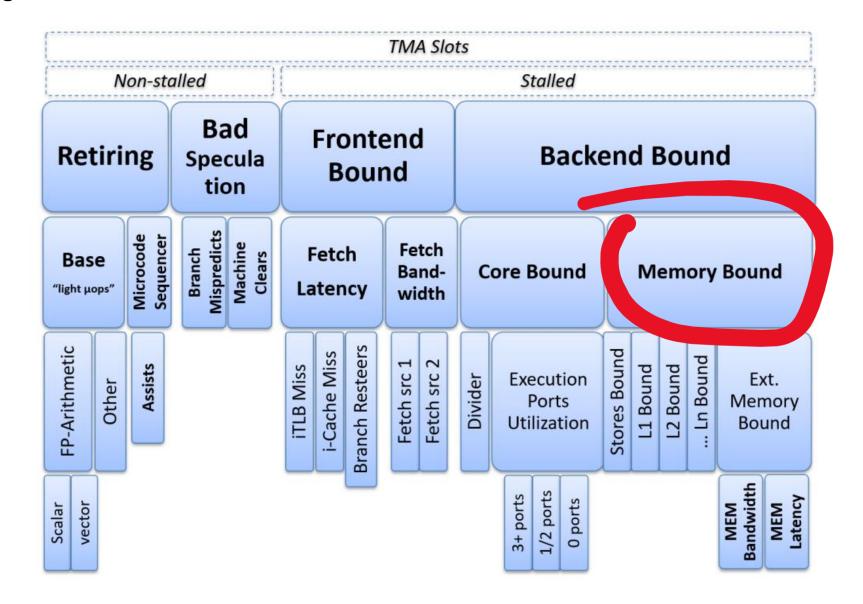
TMAM: Pipeline slot



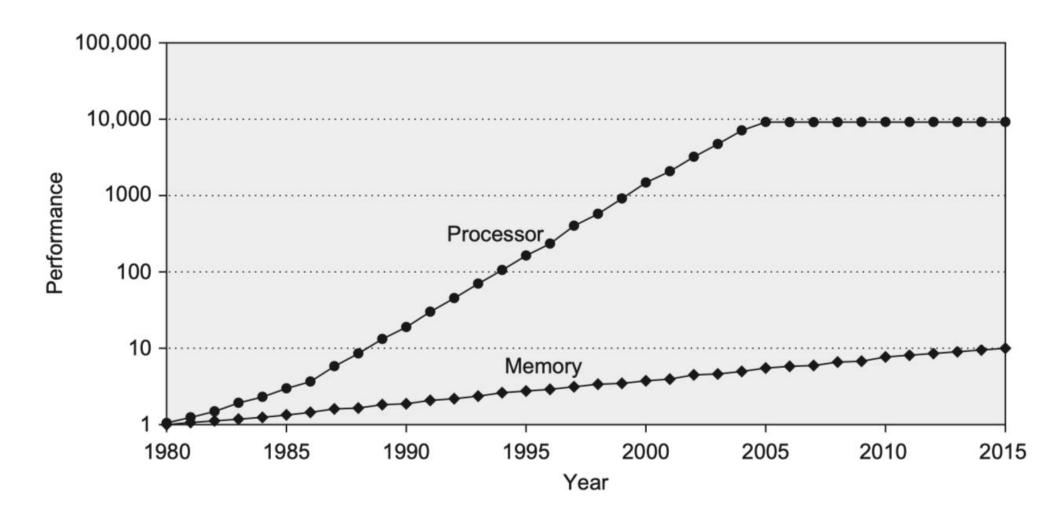
TMA hierarchy of performance bottlenecks



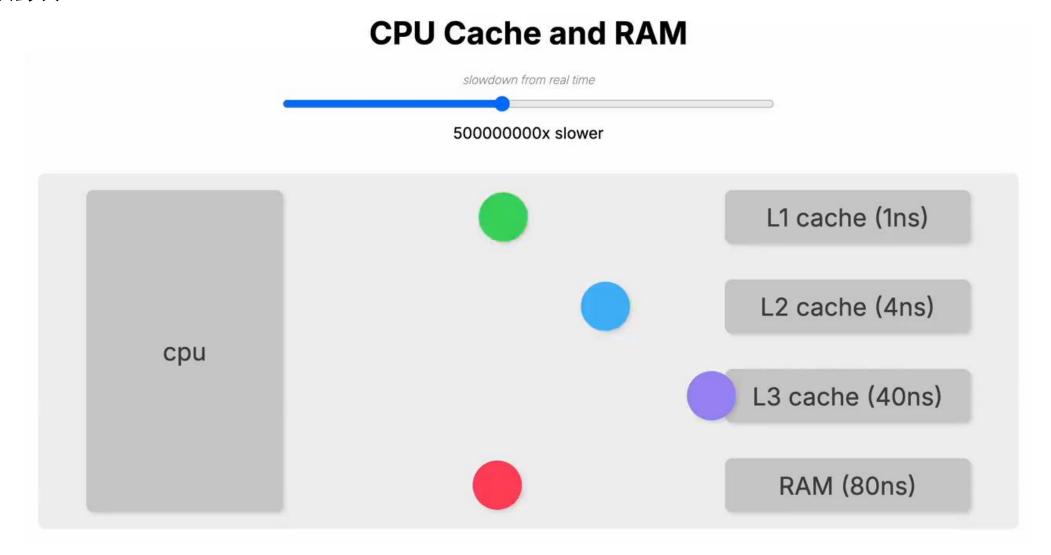
Four Corners



Processor Memory Gap



内存层次



延迟

 Table 2.2 Example Time Scale of System Latencies

Event	Latency	Scaled
1 CPU cycle	0.3 ns	1 s
Level 1 cache access	0.9 ns	3 s
Level 2 cache access	2.8 ns	9 s
Level 3 cache access	12.9 ns	43 s
Main memory access (DRAM, from CPU)	120 ns	6 min
Solid-state disk I/O (flash memory)	50–150 μs	2–6 days
Rotational disk I/O	1–10 ms	1–12 months
Internet: San Francisco to New York	40 ms	4 years
Internet: San Francisco to United Kingdom	81 ms	8 years
Internet: San Francisco to Australia	183 ms	19 years
TCP packet retransmit	1–3 s	105-317 years
OS virtualization system reboot	4 s	423 years
SCSI command time-out	30 s	3 millennia
Hardware (HW) virtualization system reboot	40 s	4 millennia
Physical system reboot	5 m	32 millennia

What Compilers Cannot Do



Sebastian Aaltonen @SebAaltonen

It's also important to emphasize that the compiler is not allowed to change your data layout. Modern CPUs running at 5 GHz with 6-wide ALU pipes and GPUs with dual float pipes can handle couple of extra ALUs. Memory accesses are the bottleneck, and compiler can't help with it.

CPU Love Array

Guidance

For data:

- Where practical, employ linear array traversals.
 - → "I don't know [data structure], but I know an array will beat it."
- Use as much of a cache line as possible.
 - ⇒ Bruce Dawson's antipattern (from reviews of video games):

Be alert for false sharing in MT systems.

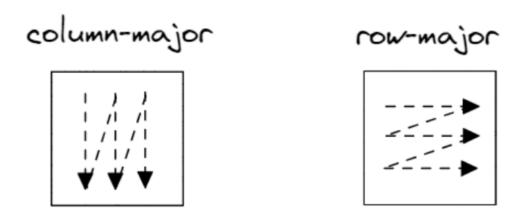
Scott Meyers, Software Development Consultant http://www.aristeia.com/

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Slide 33

Example: Loop interchange

矩阵乘法



Example: Loop interchange

矩阵乘法

```
// Multiply two square matrices
void multiply(Matrix &result, const Matrix &a,
  const Matrix &b) {
  zero(result);
  for (int i = 0; i < N; i++) {
    for (int j = 0; j < N; j++) {
      for (int k = 0; k < N; k++) {
        result[i][j] += a[i][k] * b[k][j];
```

矩阵乘法

Elapsed Time[®]: 0.604s

Olockticks:	2,768,832,000	
Instructions Retired:	2,773,056,000	
O CPI Rate ^② :	0.998	
MUX Reliability ②:	0.676	t
P-Core:		
Retiring ②:	28.6%	of Pipeline Slots
	14.3%	of Fipeline Slots
Bad Speculation ②:	0.0%	of Pipeline Slots
Back-End Bound ②:	69.6%	of Pipeline Slots

矩阵乘法

Backet	-End Bound ^② :	69.6%	of Pipeline Slots
	lemory Bound ^① :	23.2%	of Pipeline Slots
Q	L1 Bound ^③ :	24.3%	of Clockticks
		97.1%	of Clockticks
_	Loads Blocked by Store Forwarding ②:	0.0%	of Clockticks
	Lock Latency ^① :	0.0%	of Clockticks
	Split Loads ^② :	0.0%	of Clockticks
	4K Aliasing ^② :	0.0%	of Clockticks
	FB Full ^② :	0.0%	of Clockticks
	L2 Bound ^① :	0.0%	of Clockticks
(>) L3 Bound ^① :	0.9%	of Clockticks
()	DRAM Bound ①:	0.0%	of Clockticks
()) Store Bound ^① :	0.0%	of Clockticks
③ C	ore Bound ③:	46.4%	of Pipeline Slots

优化前

优化后

88% speed up

https://github.com/jsjtxietian/perf-ninja-solution/tree/master/labs/memory_bound/loop_interchange_1

Source		Back-End Bound Memory Bound			«	
					Core Bound	
	L1 Bound »	L2 Bound	L3 Bound »	DRAM Bound »	Store Bound »	Core Bouria
for (int i = 0; i < N; i++) {						
for (int j = 0; j < N; j++) {						
for (int $k = 0$; $k < N$; $k++$) {	0.0%	0.0%	0.0%	0.0%	0.0%	
result[i][j] += a[i][k] * b[k][j];	28.4%	0.0%	0.0%	0.0%	0.0%	100.0%
}						
}						
}						

Source	Back-End Bound				«	
		Memory Bound «			Core Bound	
	L1 Bound »	L2 Bound	L3 Bound »	DRAM Bound »	Store Bound »	Core Bouria
for (int i = 0; i < N; i++) {						
for (int $k = 0$; $k < N$; $k++$) {	0.0%	0.0%	0.0%	0.0%	0.0%	0.0%
for (int $j = 0; j < N; j++) {$	0.0%	0.0%	0.0%	0.0%	0.0%	0.0%
result[i][j] += a[i][k] * b[k][j];	0.0%	0.0%	0.0%	0.0%	0.0%	
}						
}						
}						
	II					

Huge Page

Support 16 KB page sizes



Benefits and performance gains

Devices configured with 16 KB page sizes use slightly more memory on average, but also gain various performance improvements for both the system and apps:

- Lower app launch times while the system is under memory pressure: 3.16% lower on average, with more significant improvements (up to 30%) for some apps that we tested
- Reduced power draw during app launch: 4.56% reduction on average
- Faster camera launch: 4.48% faster hot starts on average, and 6.60% faster cold starts on average
- Improved system boot time: improved by 8% (approximately 950 milliseconds) on average

These improvements are based on our initial testing, and results on actual devices will likely differ. We'll provide additional analysis of potential gains for apps as we continue our testing.

Hardware Effects

Memory Order Violation

```
std::array<uint32_t, 256> hist;
hist.fill(0);
for (int i = 0; i < image.width * image.height; ++i)
  hist[image.data[i]]++;
return hist;</pre>
```

求灰度图的直方图

OxFF OxFF OxFF OxFF OxFF ...

Then all updates to hist[0xFF] will be serialized.

Hardware Effects

Memory Order Violation

```
for (int i = 0; i < image.width * image.height; ++i)
  hist[image.data[i]]++;</pre>
```

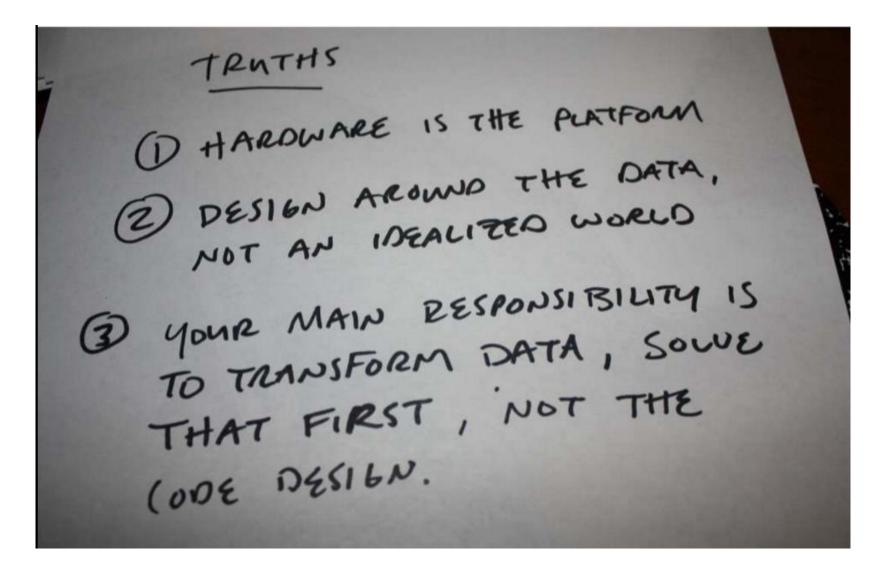


```
for (; i + 3 < image.width * image.height; i += 4) {
   hist1[image.data[i+0]]++;
   hist2[image.data[i+1]]++;
   hist3[image.data[i+2]]++;
   hist4[image.data[i+3]]++;
}</pre>
```

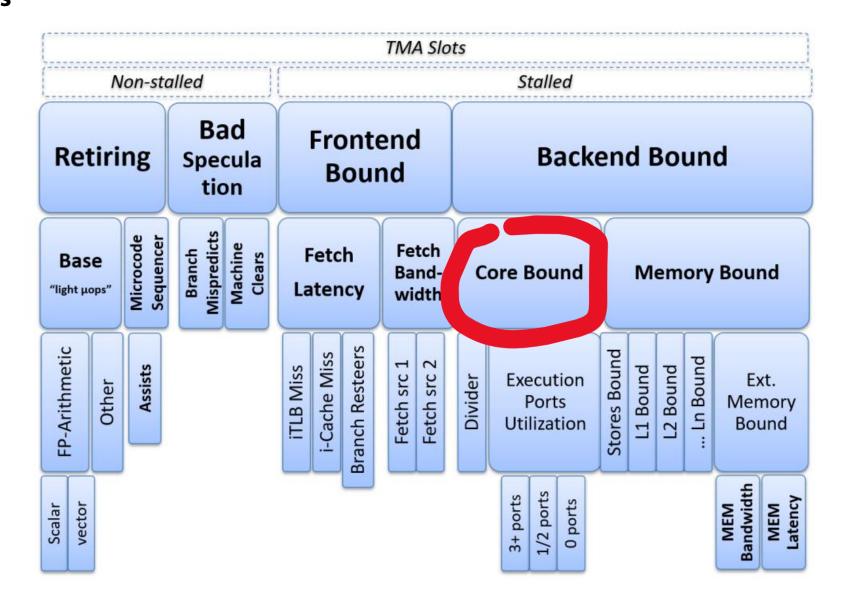
0-60% speed up

https://github.com/jsjtxietian/perf-ninja-solution/tree/master/labs/memory_bound/mem_order_violation_1

Data Oriented Design



Four Corners



Linked List

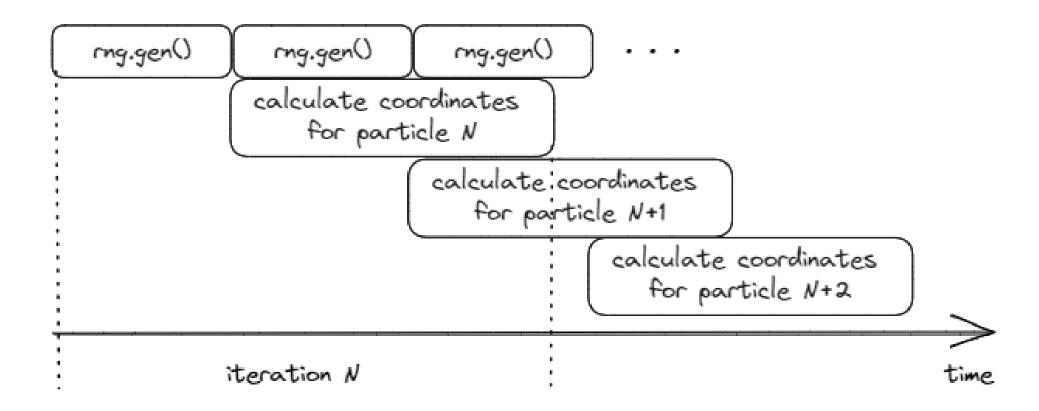
Pointer chasing does not benefit from OOO execution and thus will run at the speed of an in-order CPU.

Simulate random particle movement

```
struct Particle {
 float x; float y; float velocity;
};
class XorShift32 {
 uint32_t val;
public:
 XorShift32 (uint32_t seed) : val(seed) {}
 uint32_t gen() {
   val ^= (val << 13):</pre>
   val ^= (val >> 17);
   val ^= (val << 5);</pre>
   return val:
static float sine(float x) {
  const float B = 4 / PI_F;
  const float C = -4 / (PI_F * PI_F);
  return B * x + C * x * std::abs(x);
static float cosine(float x) {
  return sine(x + (PI_F / 2));
```

```
/* Map degrees [0;UINT32_MAX) to radians [0;2*pi)*/
float DEGREE_TO_RADIAN = (2 * PI_D) / UINT32_MAX;
void particleMotion(vector<Particle> &particles,
                    uint32 t seed) {
 XorShift32 rng(seed);
 for (int i = 0; i < STEPS; i++)</pre>
  for (auto &p : particles) {
   uint32_t angle = rng.gen();
   float angle_rad = angle * DEGREE_TO_RADIAN;
   p.x += cosine(angle_rad) * p.velocity;
  p.y += sine(angle_rad) * p.velocity;
```

Visualization of dependent execution



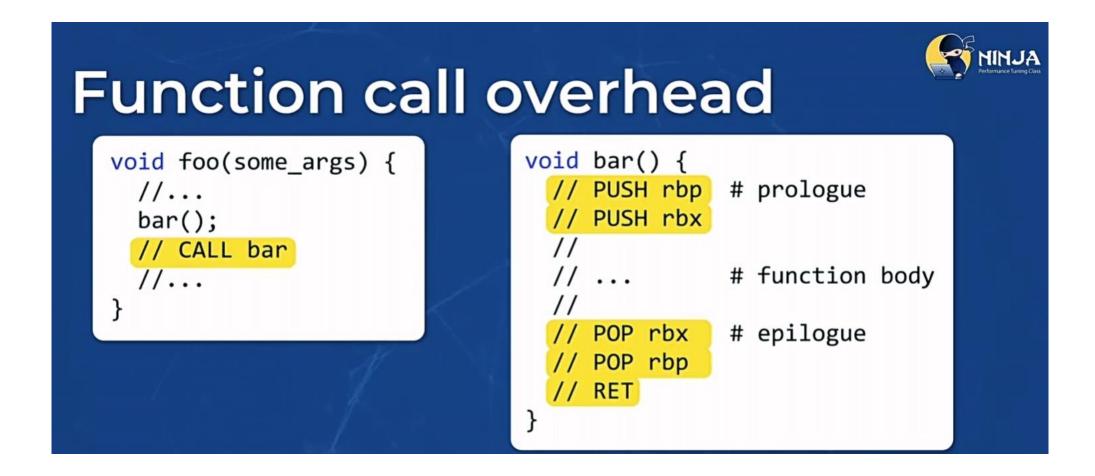
Solution

```
void particleMotion(vector<Particle> &particles,
                    uint32_t seed1, uint32_t seed2) {
 XorShift32 rng1(seed1);
 XorShift32 rng2(seed2);
 for (int i = 0; i < STEPS; i++) {
   for (int j = 0; j + 1 < particles.size(); j += 2) {</pre>
     uint32_t angle1 = rng1.gen();
     float angle_rad1 = angle1 * DEGREE_TO_RADIAN;
     particles[j].x += cosine(angle_rad1) * particles[j].velocity;
     particles[j].y += sine(angle_rad1) * particles[j].velocity;
     uint32_t angle2 = rng2.gen();
     float angle_rad2 = angle2 * DEGREE_TO_RADIAN;
     particles[j+1].x += cosine(angle_rad2) * particles[j+1].velocity;
     particles[j+1].y += sine(angle_rad2) * particles[j+1].velocity;
    // remainder (not shown)
```

Once you do this transformation, the compiler starts autovectorizing the body of the loop.

55% speed up

Inline



Inline

```
static int compare(const void *lhs, const void *rhs) {
  auto &a = *reinterpret_cast<const S *>(lhs);
  auto &b = *reinterpret_cast<const S *>(rhs);
  if (a.key1 < b.key1)</pre>
    return -1;
  if (a.key1 > b.key1)
    return 1;
  if (a.key2 < b.key2)</pre>
    return -1;
  if (a.key2 > b.key2)
    return 1;
  return 0;
void solution(std::array<S, N> &arr) {
  qsort(arr.data(), arr.size(), sizeof(S), compare);
```

```
void solution(std::array<S, N> &arr) {
    std::sort(arr.begin(),arr.end(),[](S& a, S& b)
    {
        return a.key1 < b.key1 ||
        (a.key1 == b.key1) && (a.key2 < b.key2);
    });
}</pre>
```

47% speed up

https://github.com/jsjtxietian/perf-ninja-solution/tree/master/labs/core_bound/function_inlining_1

Auto vectorization: Rely on Compiler

Does the following loop vectorize?

```
void daxpy4(double *__restrict z, double a,
            const double *__restrict x,
            const double *__restrict y,
            size t n) {
    for (size_t i = 0; i < n; i += 4) {</pre>
        z[i] = a * x[i] + y[i];
        z[i+1] = a * x[i+1] + y[i+1];
        z[i+2] = a * x[i+2] + y[i+2];
        z[i+3] = a * x[i+3] + y[i+3];
```

自动向量化失败

```
remark: loop not vectorized: could not determine number of
loop iterations [-Rpass-analysis=loop-vectorize] x86-64 clang
12.0.0 #2
remark: loop not vectorized [-Rpass-missed=loop-
vectorize] x86-64 clang 12.0.0 #2
No quick fixes available
for (size_t i = 0; i < n; i += 4) {</pre>
    z[i] = a * x[i] + y[i];
    z[i+1] = a * x[i+1] + y[i+1];
    z[i+2] = a * x[i+2] + y[i+2];
    z[i+3] = a * x[i+3] + y[i+3];
```

编译器的限制(bug)

```
void daxpy4(double * restrict z, double a,
               unsigned __restrict x,
            con int 64 __restrict
                                         n/4 or infinity
                                           iterations
            size_t n) {
   for (size_t i = 0; i < n; i += 4) {</pre>
        z[i] = a * x[i] + y[i];
        z[i+1] = a * x[i+1] + y[i+1];
        z[i+2] = a * x[i+2] + y[i+2];
        z[i+3] = a * x[i+3] + y[i+3];
```

PROBLEM: In C, the behavior of unsigned-integer overflow is defined to wrap around.

自动向量化

```
#inc remark: the cost-model indicates that interleaving is not
#inc beneficial [-Rpass-analysis=loop-vectorize] x86-64 clang
      12.0.0 #2
void
      remark: vectorized loop (vectorization width: 2, interleaved
      count: 1) [-Rpass=loop-vectorize] x86-64 clang 12.0.0 #2
      No quick fixes available
    for (int64_t i = 0; i < n; i += 4) {</pre>
         z[i] = a * x[i] + y[i];
          [i+1] = a * x[i+1] + y[i+1];
int64_t
         z[i+2] = a * x[i+2] + y[i+2];
         z[i+3] = a * x[i+3] + y[i+3];
```

SOLUTION: Use signed integer types, signedinteger overflow has undefined behavior.

Or upgrade clang

float

```
float calcSum(float* a, unsigned N) {
   float sum = 0.0f;
   for (unsigned i = 0; i < N; i++) {
      sum += a[i];
   }
   return sum;
}</pre>
```

SOLUTION:

-ffast-math

remark: loop not vectorized: cannot prove it is safe to reorder floating-point operations; allow reordering by specifying '#pragma clang loop vectorize(enable)' before the loop or by providing the compiler option '-ffast-math' [-Rpass-analysis=loop-vectorize] x86-64 clang 19.1.0 (assertions) #2

Compiler Intrinsics

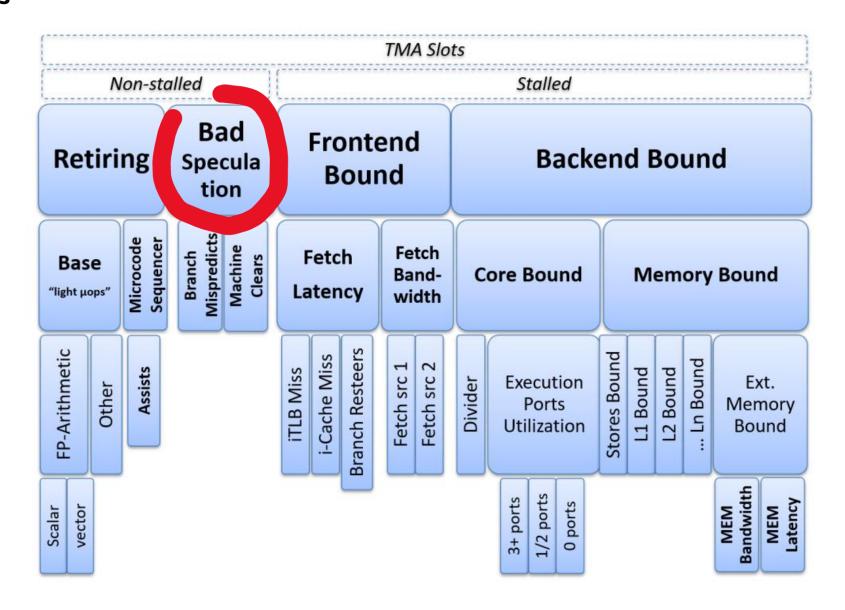
When the compiler fails

```
// a.cpp
float calcSum(float* a, unsigned N) {
  float sum = 0.0f;
  for (unsigned i = 0; i < N; i++) {
     sum += a[i];
  }
  return sum;
}</pre>
```



```
#include <immintrin.h>
float calcSum(float* a, unsigned N) {
  __m128 sum = _mm_setzero_ps(); // init sum with zeros
 unsigned i = 0;
 for (; i + 3 < N; i += 4) {
   __m128 vec = _mm_loadu_ps(a + i); // load 4 floats from array
   sum = _mm_add_ps(sum, vec); // accumulate vec into sum
 // Horizontal sum of the 128-bit vector
  __m128 shuf = _mm_movehdup_ps(sum); // broadcast elements 3,1 to 2,0
  sum = _mm_add_ps(sum, shuf);  // partial sums [0+1] and [2+3]
  shuf = _mm_movehl_ps(shuf, sum);  // high half -> low half
  sum = _mm_add_ss(sum, shuf);  // result in the lower element
 float result = _mm_cvtss_f32(sum); // nop (compiler eliminates it)
 // Process any remaining elements
 for (; i < N; i++)</pre>
     result += a[i];
 return result;
```

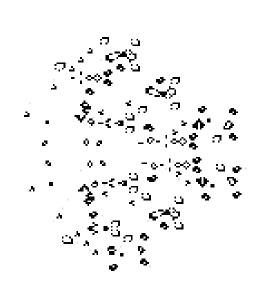
Four Corners



生命游戏

规则:

- 1. 每个细胞有两种状态 <u>存活</u>或<u>死亡</u>,每 个细胞与以自身为中心的周围八格细胞 产生互动
- 2. 当前细胞为存活状态时,当周围的存活 细胞低于2个时(不包含2个),该细胞 变成死亡状态。
- 3. 当前细胞为存活状态时,当周围有2个 或3个存活细胞时,该细胞保持原样。
- 4. 当前细胞为存活状态时,当周围有超过 3个存活细胞时,该细胞变成死亡状态。
- 5. 当前细胞为死亡状态时,当周围有3个 存活细胞时,该细胞变成存活状态。



生命游戏

```
switch(aliveNeighbours) {
    // 1. Cell is lonely and dies
   case 0:
   case 1:
       future[i][j] = 0;
       break;
    // 2. Remains the same
   case 2:
       future[i][j] = current[i][j];
       break;
    // 3. A new cell is born
   case 3:
       future[i][j] = 1;
       break;
    // 4. Cell dies due to over population
   default:
       future[i][j] = 0;
```

P-Core:

Retiring ①:	18.2%	of Pipeline Slots
	13.8%	of Pipeline Slots
	58.9% ▶	of Pipeline Slots
Branch Mispredict ®:	51.6% 🖪	of Pipeline Slots
Machine Clears ⁽²⁾ :	7.3%	of Pipeline Slots
Back-End Bound ②:	9.1%	of Pipeline Slots

Branch => cmove

```
switch(aliveNeighbours) {
    // 1. Cell is lonely and dies
    case 0:
    case 1:
        future[i][j] = 0;
        break;
    // 2. Remains the same
    case 2:
        future[i][j] = current[i][j];
        break;
    // 3. A new cell is born
    case 3:
        future[i][j] = 1;
        break;
    // 4. Cell dies due to over population
    default:
        future[i][j] = 0;
```



```
int cell = current[i][j];
if (__builtin_unpredictable(aliveNeighbours ≠ 2))
   cell = 0;
if (__builtin_unpredictable(aliveNeighbours == 3))
   cell = 1;
future[i][j] = cell;
```

49% speed up

另一个热点

边界判断

```
// finding the number of pointings that are alive
for(int p = -1; p ≤ 1; 消除这4个
                                          // row-offet (-1,0,1)
                           判断
   for(int q = -1; q > 1
                                          // col-offset (-1,0,1)
       if((i + p < 0) ||
                                          // if row offset less than UPPER boundary
          (i + p > M - 1) ||
                                 // if row offset more than LOWER boundary
          (j + q < 0) | |
                                         // if column offset less than LEFT boundary
          (j + q > N - 1))
                                          // if column offset more than RIGHT boundary
           continue;
       aliveNeighbours += current[i + p][j + q];
```

Solution: 上下左右的边界各往外扩一格即可

93% speed up

Lookup table

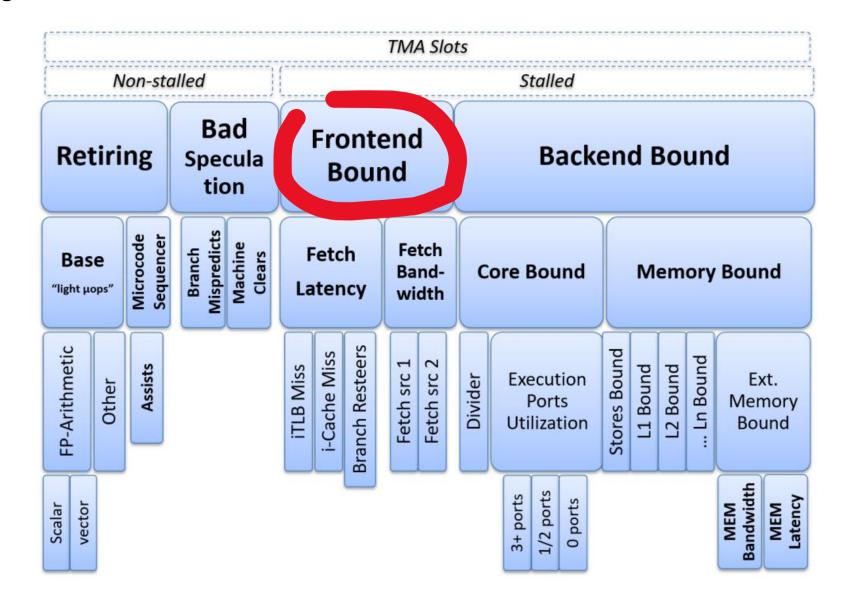
```
const static int buckets[101] = {
static std::size t mapToBucket(std::size t v) {
                                               0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, // thirteen 0s
                       // size of a bucket
                                               if (v < 13) return 0; //
                                               2, 2, 2, 2, 2, 2, 2, 2, 2, 2, // twelve 2s
 else if (v < 29) return 1; //
                                               3, 3, 3, 3, 3, 3, 3, 3, 3, 3, // twelve 3s
 else if (v < 41) return 2; //
                                               else if (v < 53) return 3; //
                                               5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 5, 1/ twelve 5s
 else if (v < 71) return 4; //
                                               else if (v < 83) return 5; // 12
                                               DEFAULT BUCKET
 else if (v < 100) return 6; // 17
                                            };
 return DEFAULT BUCKET;
                                             static std::size t mapToBucket(std::size t v) {
                                              constexpr auto Nelements = sizeof (buckets) / sizeof (int);
                                              return buckets[std::min(v, Nelements - 1)];
```

88% speed up

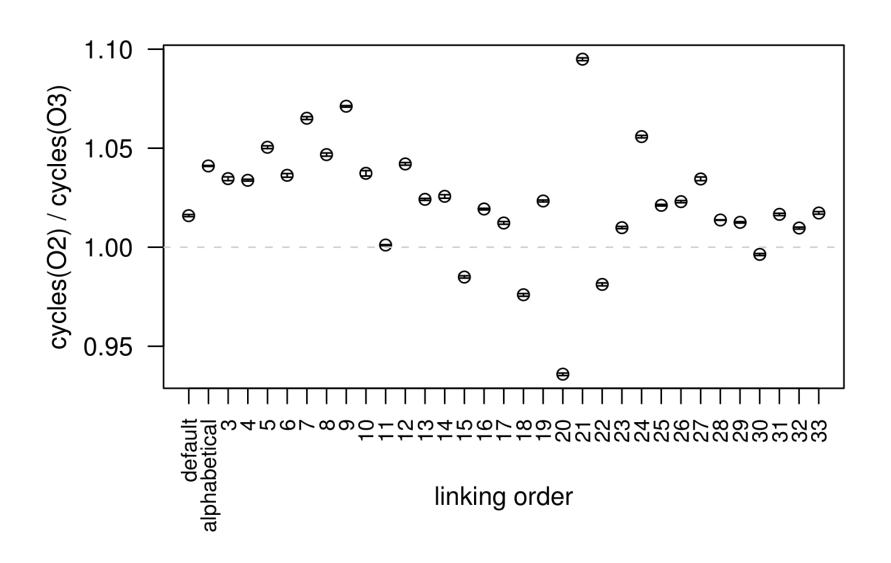
 $https://github.com/jsjtxietian/perf-ninja-solution/tree/master/labs/bad_speculation/lookup_tables_1$

Note: always measure, 右边的增加了cache的压力

Four Corners



Machine Code Layout Causes Noise



Machine Code Layout Causes Noise

Layout biases measurement

Mytkowicz et al. (ASPLOS'09)

Link Order

Changes function addresses

Larger than the impact of -O3

Environment Variable Size

Moves the program stack

Machine Code Layout

抖音研发实践:基于二进制文件重排的解决方案 APP启动速度提升超15%

原创 Leo 字节跳动技术团队 2019年08月09日 19:43

背景

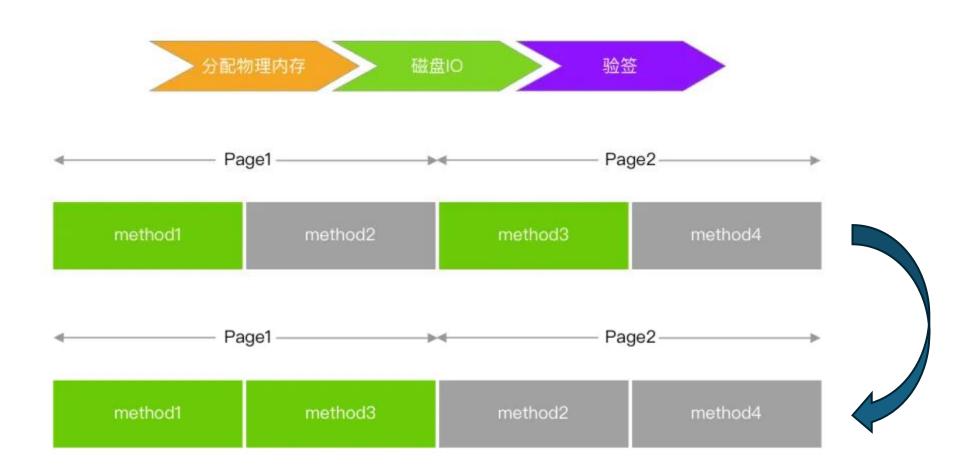
启动是App给用户的第一印象,对用户体验至关重要。抖音的业务迭代迅速,如果放任不管,启动速度会一点点劣化。为此抖音iOS客户端团队做了大量优化工作,除了传统的修改业务代码方式,我们还做了些开拓性的探索,发现修改代码在二进制文件的布局可以提高启动性能,方案落地后在抖音上启动速度提高了约15%。

本文从原理出发,介绍了我们是如何通过静态扫描和运行时trace找到启动时候调用的函数,然后修改编译参数完成二进制文件的重新排布。

抖音研发实践:基于二进制文件重排的解决方案 APP启动速度提升超15%

Machine Code Layout

优化一个Page Fault,启动速度提升0.6~0.8ms



			7222			TM	A Slo	ts							
Non-stalled								Stalled							
Retiring Bad Specula tion				Frontend Bound			Backend Bound								
Base	Microcode Sequencer	Branch Mispredicts Machine Clears		etc		Fetch Band- width		Co	Core Bound			Memory Bound			
FP-Arithmetic Other	Assists		iTLB Miss	i-Cache Miss	Branch Resteers	Fetch src 1	Fetch src 2	Divider	F	ecution Ports lization	Stores Bound	L1 Bound	L2 Bound	Ln Bound	Ext. Memory Bound
Scalar	_							_	3+ ports	1/2 ports 0 ports					MEM Bandwidth MEM

Final

Always Measure!

- 1. Mental model can never be as accurate as the actual microarchitecture design of a CPU. Always measure!
- 2. When measuring performance, understand the underlying technical reasons for the performance results.

More

Benchmark



Perf

