```
at a = nt - nc, b
efl + refr)) && (depth < MAX
(AXDEPTH)
survive = SurvivalProbability( diff.
radiance = SampleLight( &rand, I, &L,
e.x + radiance.y + radiance.z) > 0) &
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely followi
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, Apo
ırvive;
```

1 = E \* brdf \* (dot( N, R ) / pdf);

3

# Ray Tracing for Games

Dr. Jacco Bikker - IGAD/BUAS, Breda, January 31

# Welcome!







## Agenda:

- State of Affairs
- Optimization Introduction
- Profiling
- Low-level: Rules of Engagement
- The Cache









Thursday 09:00 - 14:00

advanced Whitted audio, AI & physics faster Whitted Heaven7

LAB 2

work @ home

End result day 2:

A solid Whitted-style ray tracer, as a basis for subsequent work.

Friday 09:00 - 17:00

YOU ARE HERE

profiling, rules of engagement threading



LAB<sub>3</sub>

SIMD applied SIMD SIMD triangle SIMD AABB

LAB 4

GAME JAM Monday 09:00 - 17:00

acceleration grid, BVH, kD-tree SAH binning



LAB 5

refitting top-level BVH threaded building

LAB 6

Tuesday 09:00 - 17:00

Monte-Carlo Cook-style glossy, AA area lights, DOF



LAB 7

path tracing



LAB8

Thursday 09:00 - 17:00

random numbers stratification blue noise



LAB9

importance sampling next event estimation

**LAB 10** 

Friday 09:00 - 17:00

future work



**LAB 11** 

path guiding



**LAB 10** 



End result day 3:

A 5x faster tracer.

End result day 4:

A real-time tracer.

End result day 5:

Cook or Kajiya.

End result day 6:

Efficiency.

End result day 6:

Great product.

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, )

n = E \* brdf \* (dot( N, R ) / pdf);

## YOU ARE HERE

### Towards the End product:

1. Path tracer that produces pretty images in a few minutes.

You have a clean ray tracer with a solid API, you implemented most or all of the Whitted-style features.

2. Real-time ray tracer on the CPU or GPU.

You have finished the functionality that you want to run in real-time, graphicswise. Animation is still to be done.

3. Raytraced game or demo.

You have a minimalistic game engine that allows you to build the game, while the engine is being completed.

RTX port of an existing game.

You have basic output from the original game engine using the custom ray tracing renderer.

Thursday 09:00 - 14:00

advanced Whitted audio, Al & physics faster Whitted

LAB 2



work @ home

End result day 2:

A solid Whitted-style ray tracer, as a basis for subsequent work. Friday 09:00 - 17:00

optimization profiling, rules of engagement threading



LAB<sub>3</sub>

SIMD applied SIMD SIMD triangle SIMD AABB

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End result day 3:

A 5x faster tracer.

andom walk - done properly, closely foll at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R 1 = E \* brdf \* (dot( N, R ) / pdf);

ef1 + refr)) && (dept)

= true;

## Agenda:

- State of Affairs
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- Profiling
- Low-level: Rules of Engagement
- The Cache





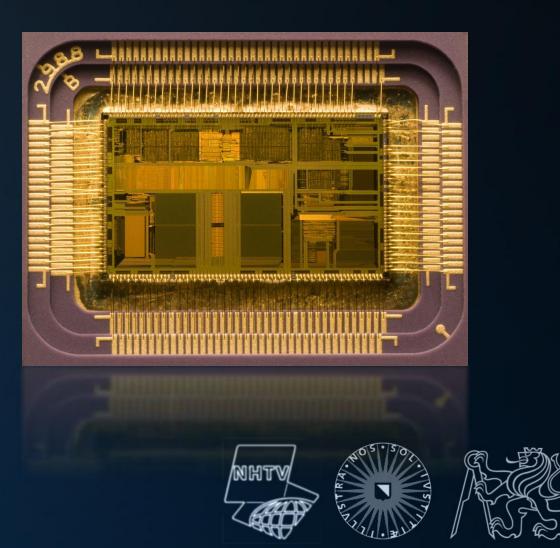




#### Think like a CPU

- Instruction pipelines
- versus integer

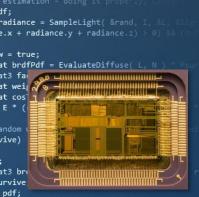
3)	mstruction pr
at a = nt - nc, b = nt - n	Latencies
at Tr = 1 - (R0 + (1 - R0 Tr) R = (D * nnt - N * (ddd)	Dependencies
E * diffuse; = true;	D 1 111
efl+ refr)) && (depth < MAXDEROOD	Cycles
D, N ); refl * E * diffuse;	 Floating point
= true;	SIMD
MAXDEPTH)	
<pre>survive = SurvivalProbability( diffuse estimation - doing it properly, class if; radiance = SampleLight( &amp;rand, I, &amp;L, &amp; e.x + radiance.y + radiance.z) &gt; 0) &amp;&amp;</pre>	
v = true; at brdfPdf = EvaluateDiffuse( L, N ) at3 factor = diffuse * INVPI; at weight = Mis2( directPdf, brdfPdf ); at cosThetaOut = dot( N, L ); E * ((weight * cosThetaOut) / directPd	
andom walk - done properly, closely fol vive)	
; at3 brdf = SampleDiffuse( diffuse, N, r urvive; pdf;	
pat; 1 = E * brdf * (dot( N. R ) / pdf);	



Work smarter, not harder: algorithm scalability

- Big 0
- Research: not reinventing the wheel
- Data characteristics & algorithm choice
- STL, Boost: Trust No One
- As accurate as necessary (but not more)
- Balancing accuracy, speed and memory

- Instruction pipelines
- Latencies
- Dependencies
- Bandwidth
- Cycles
- Floating point versus integer
- SIMD



1 = E \* brdf \* (dot( N, R ) / pdf);

survive = SurvivalProbability( diff

(AXDEPTH)

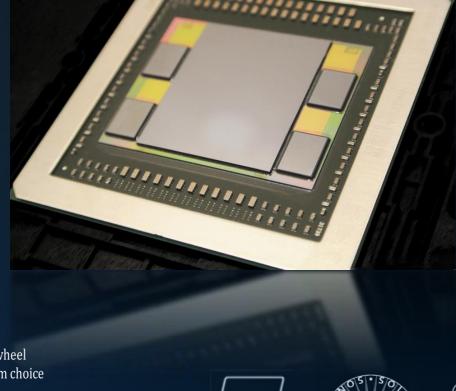


#### Memory hierarchy: caches

- Cache architecture
- Cache lines
- Hits, misses and collisions
- **Eviction policies**
- Prefetching
- Cache-oblivious
- Data-centric programming

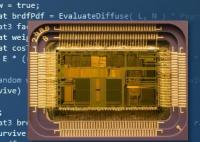
- Instruction pipelines
- Latencies
- Dependencies
- Bandwidth
- Cycles
- Floating point versus integer
- SIMD







- Research: not reinventing the wheel
- Data characteristics & algorithm choice
- STL: Trust No One
- As accurate as necessary (but not more)
- Balancing accuracy, speed and memory



pdf; n = E \* brdf \* (dot( N, R ) / pdf);

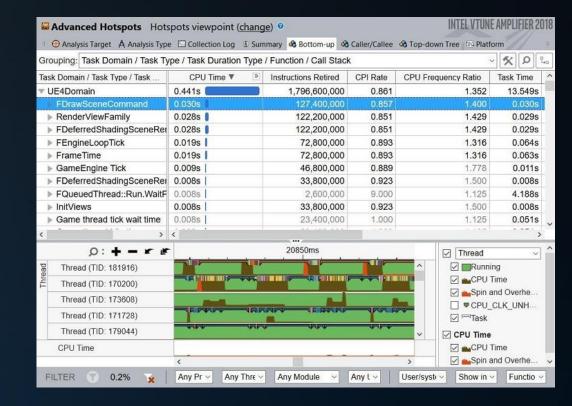
survive = SurvivalProbability( dif

e.x + radiance.y + radiance.z) > @

(AXDEPTH)

Don't assume, measure

- **Profilers**
- Interpreting profiling data
- Instrumentation
- **Bottlenecks**
- Steering optimization effort

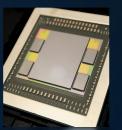




- Latencies
- Dependencies
- Bandwidth
- Cycles
- Floating point versus integer
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- Big 0
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- Cache architecture
- Cache lines
- Hits, misses and collisions
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- Cache-oblivious
- Data-centric programming



pdf; n = E \* brdf \* (dot( N, R ) / pdf);

fl + refr)) && (dept

survive = SurvivalProbability( dif

radiance = SampleLight( &rand, e.x + radiance.y + radiance.z)

), N );

(AXDEPTH)

v = true;

/ive)

at3 br

#### What is optimization? – Project Management

#### Keeping code maintainable

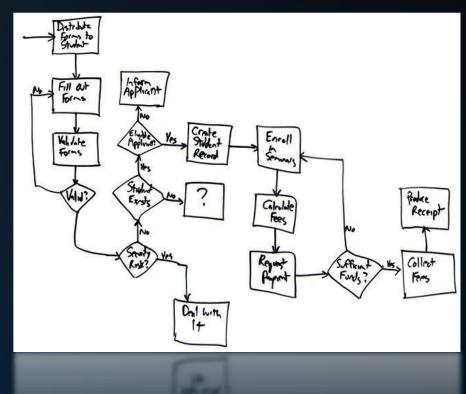
- Pareto principle / 80-20 rule: roughly 80% of the effects are caused by 20% of the causes.
- 1% of the code takes 99% of the time.

#### "The curse of premature optimization"

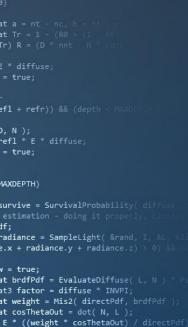
- Optimization, rule 1: "Don't do it".
- Rule 2 (for experts only!), "Don't do it yet".

#### Optimization as a deliberate process

• Get predictable gains using a consistent approach.







andom walk - done properly, closely follo

n = E \* brdf \* (dot( N, R ) / pdf);

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, A

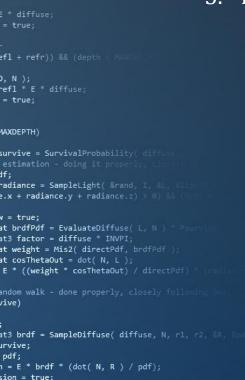
What is optimization?

"Perceived Performance"

- 1. Wait for user input
- 2. Respond to user input as quickly as possible
- 3. Execute requested operation.







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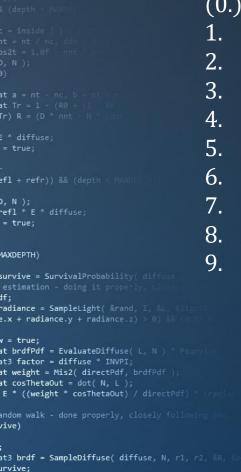


- (0.) Determine optimization requirements
- 1. Profile: determine hotspots
- 2. Analyze hotspots: determine scalability
- 3. Apply high level optimizations to hotspots
- 4. Profile again.
- 5. Parallelize / vectorize / use GPGPU
- 6. Profile again.
- 7. Apply low level optimizations to hotspots
- 8. Repeat step 6 and 7 until time runs out
- 9. Report.









1 = E \* brdf \* (dot( N, R ) / pdf);

#### (0.) Determine optimization requirements

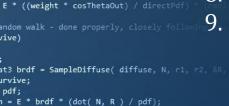
- Target hardware (or range of hardware)
- Target performance
- Time available for optimization
- Constraints related to maintainability / portability
- ...
- 1. Profile: determine hotspots
- 2. Analyze hotspots: determine scalability
- 3. Apply high level optimizations to hotspots
- 4. Profile again.
- 5. Parallelize / vectorize / use GPGPU
- 6. Profile again.
- 7. Apply low level optimizations to hotspots
- 8. Repeat steps 6 and 7 until time runs out
- 9. Report.

#### From here on, we will assume that:

- the code is 'done' (feature complete);
- a speed improvement is required;
- we have a finite amount of time for this.







at weight = Mis2( directPdf, brdfPdf

at cosThetaOut = dot( N, L );

efl + refr)) && (depth

refl \* E \* diffuse;

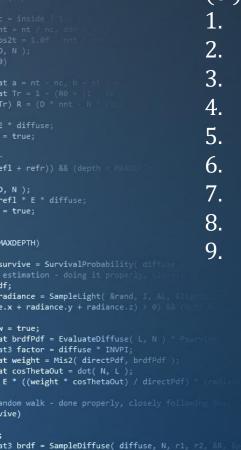
), N );

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- (0.) Determine optimization requirements
- Profile: determine hotspots
- Analyze hotspots: determine scalability
- Apply high level optimizations to hotspots
- Profile again.
- Parallelize / vectorize / use GPGPU
- Profile again.
- Apply low level optimizations to hotspots
  - caching, data-centric programming,
  - removing superfluous functionality and precision,
  - aligning data to cache lines, vectorization,
  - checking compiler output, fixed point arithmetic,
- Repeat steps 6 and 7 until time runs out
- Report.







), N );

(AXDEPTH)

v = true;

survive = SurvivalProbability( di

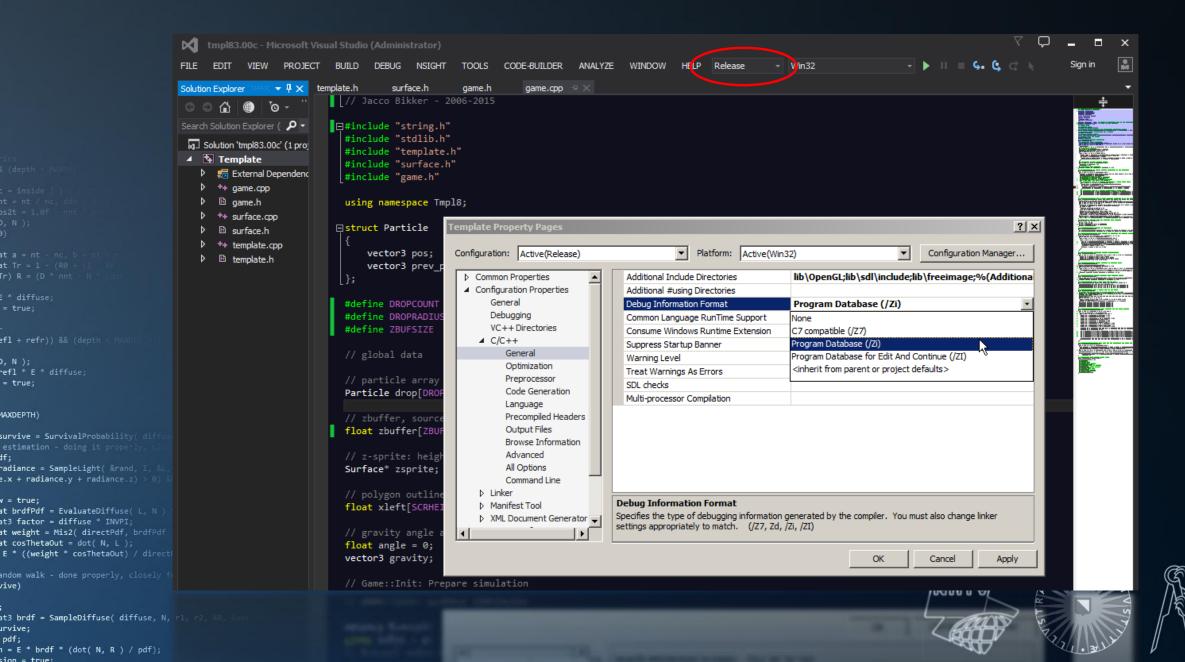
radiance = SampleLight( &rand, I, .x + radiance.y + radiance.z) > 0

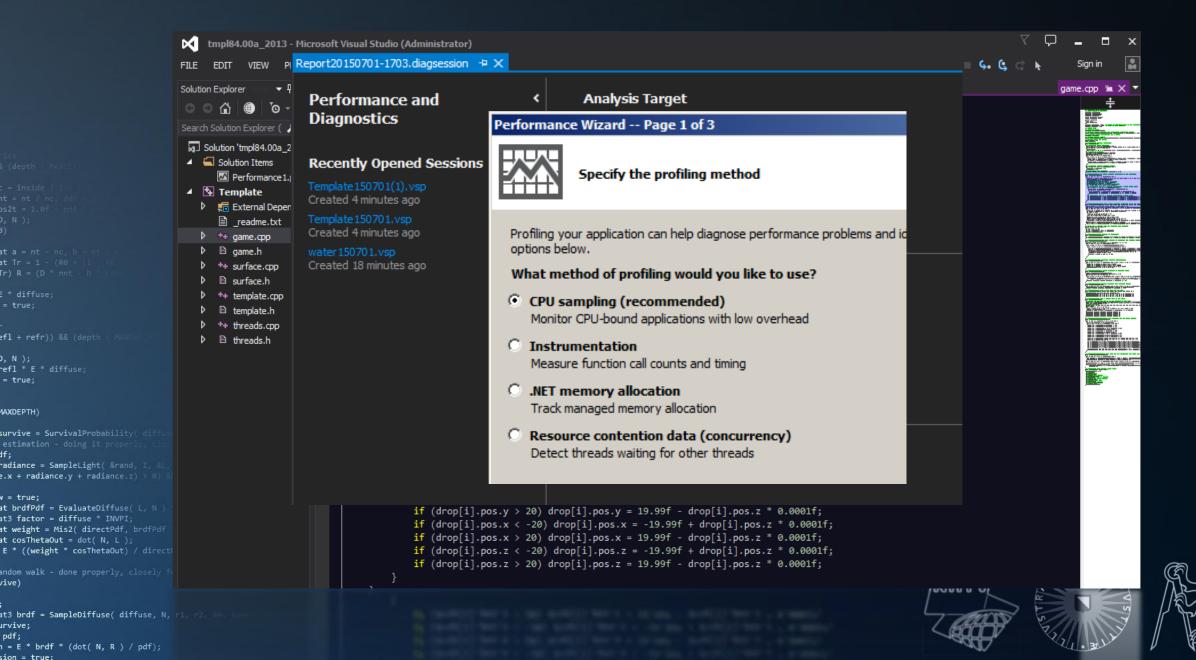
at brdfPdf = EvaluateDiffuse( L, N at3 factor = diffuse \* INVPI;

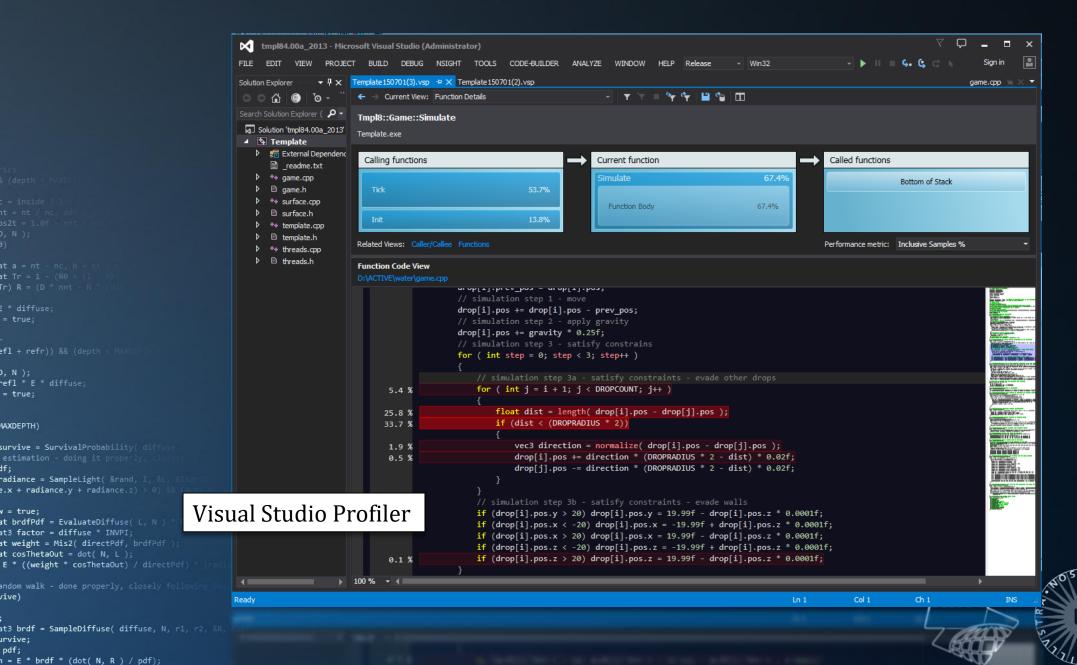
at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );

E \* ((weight \* cosThetaOut) / directPdf)

andom walk - done properly, closely foll







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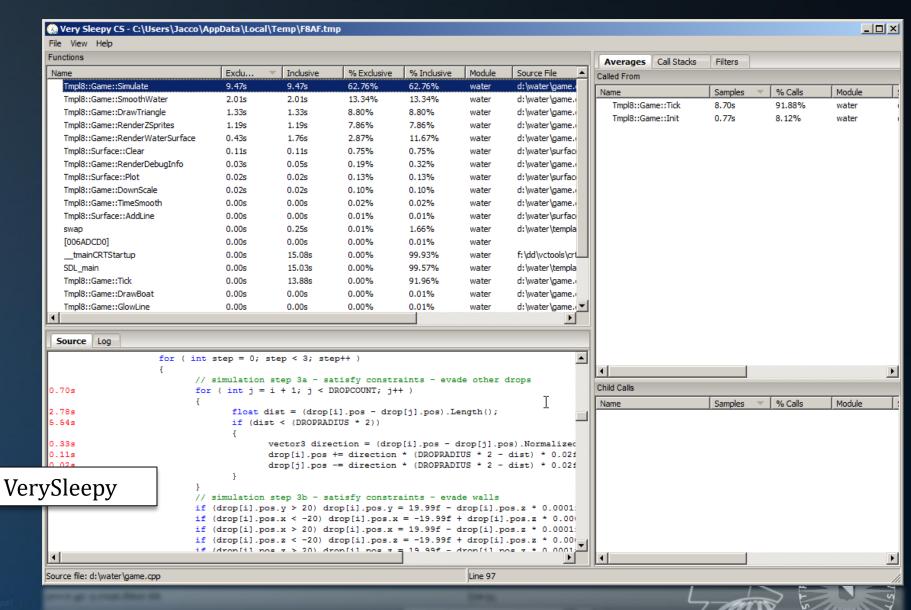
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, Apo

at3 factor = diffuse \* INVPI;

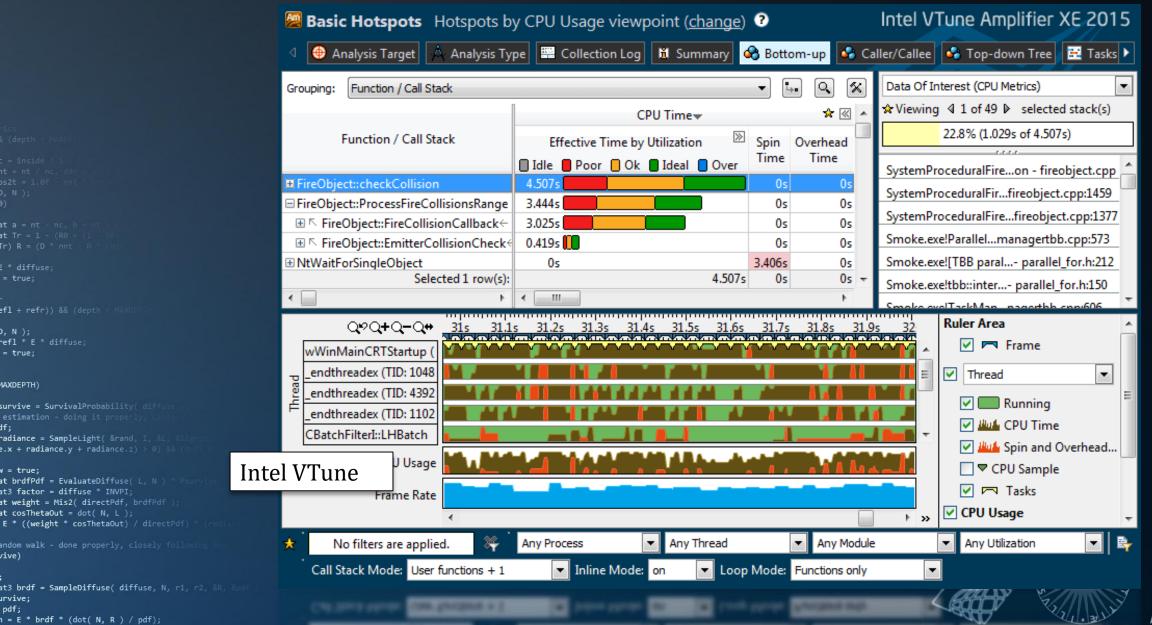
at cosThetaOut = dot( N, L );

e.x + radiance.y + radiance.z) > 0) &

refl \* E \* diffuse;









at a = nt - nc,

(AXDEPTH)

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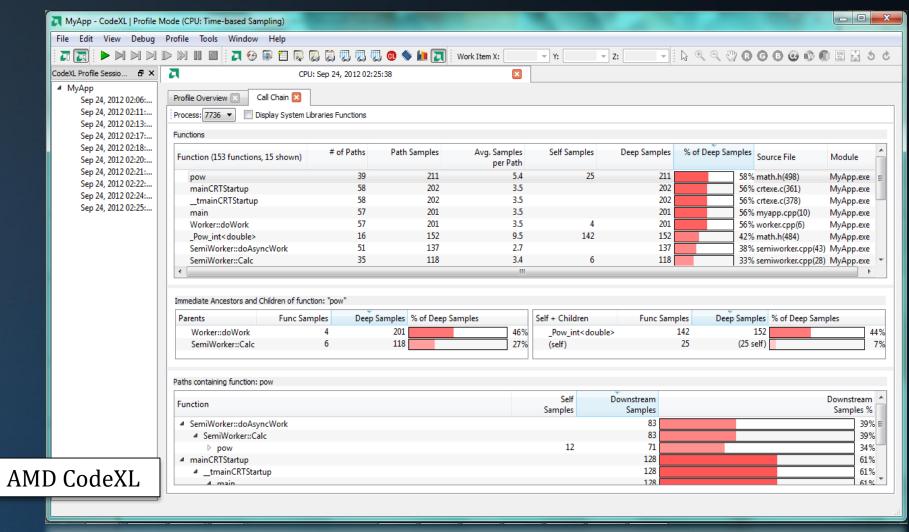
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E \* ((weight \* cosThetaOut) / directPdf)

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, A;







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#### What is the 'cost' of a multiply?

```
starttimer();
float x = 0;
for( int i = 0; i < 1000000; i++ ) x *= y;
stoptimer();</pre>
```

- Actual measured operations:
  - timer operations;
  - initializing 'x' and 'i';
  - comparing 'i' to 1000000 (x 1000000);
  - increasing 'i' (x 1000000);
  - jump instruction to start of loop (x 1000000).
- Compiler outsmarts us!
  - No work at all unless we use x
  - x += 1000000 \* y

#### Better solution:

- Create an arbitrary loop
- Measure time with and without the instruction we want to time





refl \* E \* diffuse;

survive = SurvivalProbability( dif

radiance = SampleLight( &rand, I,

e.x + radiance.y + radiance.z) > 0)

at brdfPdf = EvaluateDiffuse( L, N ) \* at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf )

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n = E \* brdf \* (dot( N, R ) / pdf);

E \* ((weight \* cosThetaOut) / directPdf)
andom walk - done properly, closely follow

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, Apo

(AXDEPTH)

v = true;

What is the 'cost' of a multiply?

```
float x = 0, y = 0.1f;
unsigned int i = 0, j = 0x28929227;
for( int k = 0; k < ITERATIONS; k++ )</pre>
   // ensure we feed our line with fresh data
   x += y, y *= 1.01f;
  // integer operations to free up fp execution units
   i += j, j ^= 0x17737352, i >>= 1, j /= 28763;
   // operation to be timed
   if (with) x *= y;
   // integer operations to free up fp execution units
   i += j, j ^= 0x17737352, i >>= 1, j /= 28763;
dummy = x + (float)i;
```

	Generate Graph of Include Files	
X	Show Call Stack on Code Map	Ctrl+Shift+`
to	Insert Snippet	Ctrl+K, Ctrl+X
10	Surround With	Ctrl+K, Ctrl+S
I	Peek Definition	Alt+F12
9	Go To Definition	F12
⇒≣	Go To Declaration	Ctrl+Alt+F12
	Find All References	
$\mathbb{Z}$	View Call Hierarchy	Ctrl+K, Ctrl+T
	Toggle Header / Code File	Ctrl+K, Ctrl+O
	Intel Advisor XE 2015	•
	Breakpoint	•
60	Add Watch	
60	Add Parallel Watch	
↔	QuickWatch	Shift+F9
	Pin To Source	
	View Array	
→	Show Next Statement	Alt+Num *
k	Run To Cursor	Ctrl+F10
ŀ	Run Flagged Threads To Cursor	
<b>≟</b>	Set Next Statement	Ctrl+Shift+F10
<b>Ģ</b> ≣	Go To Disassembly	
Ж	Cut	Ctrl+X
Ð	Сору	Ctrl+C
â	Paste	Ctrl+V
	Outlining	•
	Intel Compiler	•
0	Options	Ctrl+1
	Source Control	•
R		The Col
したに		1 1800

#### x86 assembly in 5 minutes

Modern CPUs still run x86 machine code, based on Intel's 1978 8086 processor. The original processor was 16-bit, and had 8 'general purpose' 16-bit registers\*:

AX ('accumulator register')	AH, AL (8-bit)	EAX (32-bit)	RAX (64-bit)
BX ('base register')	BH, BL	EBX	RBX
CX ('counter register')	CH, CL	ECX	RCX
DX ('data register')	DH, DL	EDX	RDX
BP ('base pointer')		EBP	RBP
SI ('source index')		ESI	RSI
DI ('destination index')		EDI	RDI
SP ('stack pointer')		ESP	RSP

\* More info: <a href="http://www.swansontec.com/sregisters.html">http://www.swansontec.com/sregisters.html</a>







R8..R15

st0..st7

XMM0..XMM7

n = E \* brdf \* (dot( N, R ) / pdf);

survive = SurvivalProbability( diff.

radiance = SampleLight( &rand, I,

at brdfPdf = EvaluateDiffuse( L, N

E \* ((weight \* cosThetaOut) / directPdf)

andom walk - done properly, closely foll

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R

at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf

at cosThetaOut = dot( N, L );

efl + refr)) && (depth <

), N );

(AXDEPTH)

v = true;

```
Typical assembler:
                    loop:
                        mov eax, [0x1008FFA0]
                                                            // read from address into register
at a = nt - nc, b
                                                            // shift eax 5 bits to the right
                        shr eax, 5
                                                                add registers, store in eax
                        add eax, edx
                                                                decrement ecx
                        dec ecx
efl + refr)) && (depth < MAX
                        jnz loop
                                                            // jump if not zero
refl * E * diffuse;
                                                            // load from address [esi] onto FPU
                        fld [esi]
(AXDEPTH)
                        fld st0
                                                            // duplicate top float
survive = SurvivalProbability( diff
                        faddp
                                                                add top two values, push result
radiance = SampleLight( &rand, I, &L
e.x + radiance.y + radiance.z) > 0) 8
```

x86 assembly in 5 minutes:

More on x86 assembler: <a href="http://www.cs.virginia.edu/~evans/cs216/guides/x86.html">http://www.cs.virginia.edu/~evans/cs216/guides/x86.html</a>
A bit more on floating point assembler: <a href="https://www.cs.uaf.edu/2007/fall/cs301/lecture/11\_12\_floating\_asm.html">https://www.cs.uaf.edu/2007/fall/cs301/lecture/11\_12\_floating\_asm.html</a>

```
prvive;
pdf;
1 = E * brdf * (dot( N, R ) / pdf);
sion = true:
```

at brdfPdf = EvaluateDiffuse( L, N ) at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );

E \* ((weight \* cosThetaOut) / directPdf

andom walk - done properly, closely fol

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &pd

v = true;

/ive)

1 = E \* brdf \* (dot( N, R ) / pdf);

```
xor ecx, ecx
                                                                                                fld dword ptr ds:[405290h]
                       What is the 'cost' of a multiply?
                                                                                               mov edx, 28929227h
                                                                                                fld dword ptr ds:[40528Ch]
            float x = 0, y = 0.1f;
                                                                                                push esi
                                                                                                mov esi, (0C350h) = 50000
            unsigned int i = 0, j = 0x28929227;
             for( int k = 0; k < ITERATIONS; k++ )</pre>
                                                                                                add ecx, edx
                                                                                                mov eax. 91D2A969h
                                                                                               xor edx, 1773/352h
                                                                                               shr ecx, 1
                 x += y, y *= 1.01f; <
                                                                                                mul eax, edx
                                                                                                fld st(1)
                 i += j, j ^= 0x17737352, i >>= 1, j /= 28763;
                                                                                                faddp st(3), st
                                                                                               mov eax, 91D2A969h
                 if (with) x *= y;
                                                                                                shr edx, 0Eh
survive = SurvivalProbability
                                                                                                add ecx. edx
radiance = SampleLight( &rand,
                                                                                                fmul st(1),st
                 i += j, j ^= 0x17737352, i >>= 1, j /= 28763;
e.x + radiance.y + radiance.z)
                                                                                                xor edx, 17737352h
at brdfPdf = EvaluateDiffus
                                                                                                shr ecx, 1
at weight = Mis2( directPdd browsom y = x + (float)i;
at cosThetaOut = dot( N, dummy = x + (float)i;
                                                                                                mul eax, edx
E * ((weight * cosThetaOut) / directP
                                                                                                shr edx AFh
andom walk - done properly, closely follow
                                                                                                dec esi
                                                                                                jne tobetimed<0>+1Fh
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
```

fldz

#### What is the 'cost' of a multiply?

#### Observations:

- Compiler reorganizes code
- Compiler cleverly evades division
- Loop counter decreases
- Presence of integer instructions affects timing (to the point where the mul is free)

#### But also:

It is really hard to measure the cost of a line of code.

```
AXDEPTH)

survive = SurvivalProbability( diffuse )
estimation - doing it properly, closely
if;
radiance = SampleLight( &rand, I, &L, &lighton
e.x + radiance.y + radiance.z) > 0) && (doton
e.x + radiance.y + radiance.z) > 0) && (doton
ex = true;
but brdfPdf = EvaluateDiffuse( L, N ) * Psurvive
at3 factor = diffuse * INVPI;
but weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf) * (radiance)
andom walk - done properly, closely following securive)

int3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &purvive;
pdf;
n = E * brdf * (dot( N, R ) / pdf);
sion = true:
```

at a = nt - nc,

), N );

refl \* E \* diffuse;

What is the 'cost' of a single instruction?

Cost is highly dependent on the surrounding instructions, and many other factors. However, there is a 'cost ranking':

```
<< >> bit shifts
+ - & | ^ simple arithmetic, logical operands
* multiplication
/ division
sqrt
sin, cos, tan, pow, exp
```

This ranking is generally true for any processor (including GPUs).

```
e.x + radiance.y + radiance.z) > 0) 88 (doi: 10)

v = true;
at brdfPdf = EvaluateDiffuse( L, N ) * Psurvive
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf) * (radiance)
andom walk - done properly, closely following securive)

;
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &pdf
urvive;
pdf;
n = E * brdf * (dot( N, R ) / pdf);
sion = true:
```

efl + refr)) && (depth

survive = SurvivalProbability( diff)

radiance = SampleLight( &rand, I,

refl \* E \* diffuse;

), N );

(AXDEPTH)

#### **RULE 1: Avoid Costly Operations**

- Replace multiplications by bitshifts, when possible
- Replace divisions by (reciprocal) multiplications
- Avoid sin, cos, sqrt

```
efl + refr)) && (depth < MA
(AXDEPTH)
survive = SurvivalProbability( diff.
radiance = SampleLight( &rand, I, &L, )
e.x + radiance.y + radiance.z) > 0) 88
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely follow
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
1 = E * brdf * (dot( N, R ) / pdf);
```

#### RULE 2: Precalculate

- Reuse (partial) results
- Adapt previous results (interpolation, reprojection, ...)
- Loop hoisting
- Lookup tables

```
at a = nt - nc, b
(AXDEPTH)
survive = SurvivalProbability( diff)
radiance = SampleLight( &rand, I, &L, )
e.x + radiance.y + radiance.z) > 0) &&
v = true;
at brdfPdf = EvaluateDiffuse( L, N ) | |
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely followi
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
pdf;
n = E * brdf * (dot( N, R ) / pdf);
```

#### RULE 3: Pick the Right Data Type

- Avoid byte, short, double
- Use each data type as a 32/64 bit container that can be used at will
- Avoid conversions, especially to/from float
- Blend integer and float computations
- Combine calculations on small data using larger data

```
), N );
refl * E * diffuse;
(AXDEPTH)
survive = SurvivalProbability( diff.
radiance = SampleLight( &rand, I, &L.
e.x + radiance.y + radiance.z) > 0) &
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf ):
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely follow
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
1 = E * brdf * (dot( N, R ) / pdf);
```

#### **RULE 4: Avoid Conditional Branches**

- if, while, ?, MIN/MAX
- Try to split loops with conditional paths into multiple unconditional loops
- Use lookup tables to prevent conditional code
- Use loop unrolling
- If all else fails: make conditional branches predictable

```
), N );
(AXDEPTH)
survive = SurvivalProbability( diff.
radiance = SampleLight( &rand, I, &L,
e.x + radiance.y + radiance.z) > 0) &
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf ):
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely follow
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &
1 = E * brdf * (dot( N, R ) / pdf);
```

1 = E \* brdf \* (dot( N, R ) / pdf);

#### Common Opportunities in Low-level Optimization

**RULE 5: Early Out** 

```
char a[] = "abcdfghijklmnopqrstuvwxyz";
                         char c = 'p';
                         int position = -1;
                         for ( int t = 0; t < strlen( a ); \overline{t++} )
efl + refr)) && (depth
                                if (a[t] == c)
refl * E * diffuse;
(AXDEPTH)
                                        position = t;
survive = SurvivalProbability( dit
radiance = SampleLight( &rand, I, 🔾
e.x + radiance.y + radiance.z) >
v = true;
at brdfPdf = EvaluateDiffuse( L, N ) | |
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf ):
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely follow
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &bd
```

```
char a[] = "abcdfghijklmnopqrstuvwxyz";
char c = 'p';
int position = -1, len = strlen( a );
for ( int t = 0; t < len; t++ )
{
    if (a[t] == c)
    {
        position = t;
        break;
    }
}</pre>
```

efl + refr)) && (depth

survive = SurvivalProbability( d

radiance = SampleLight( &rand, :

st brdfPdf = EvaluateDiffuse( L, N )
st3 factor = diffuse \* INVPI;
st weight = Mis2( directPdf, brdfPdf
st cosThetaOut = dot( N, L );

e.x + radiance.y + radiance.z) > (

E \* ((weight \* cosThetaOut) / directPdf

1 = E \* brdf \* (dot( N, R ) / pdf);

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, )

refl \* E \* diffuse;

), N );

#### Common Opportunities in Low-level Optimization

RULE 6: Use the Power of Two

- A multiplication / division by a power of two is a (cheap) bitshift
- A 2D array lookup is a multiplication too make 'width' a power of 2
- Dividing a circle in 256 or 512 works just as well as 360 (but it's faster)
- Bitmasking (for free modulo) requires powers of 2

1-2-4-8-16-32-64-128-256-512-1024-2048-4096-8192-16384-32768-65536

Be fluent with powers of 2 (up to  $2^16$ ); learn to go back and forth for these:  $2^9 = 512 = 2^9$ . Practice counting from 0..31 on one hand in binary.

#### Common Opportunities in Low-level Optimization

#### **RULE 7: Do Things Simultaneously**

- Use those cores
- An integer holds four bytes; use these for instruction level parallelism
- More on this later.

```
at a = nt - nc, b
(AXDEPTH)
survive = SurvivalProbability( diff.
radiance = SampleLight( &rand, I, &L, )
e.x + radiance.y + radiance.z) > 0) &&
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely followi
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
pdf;
n = E * brdf * (dot( N, R ) / pdf);
```

#### Common Opportunities in Low-level Optimization

- 1. Avoid Costly Operations
- 2. Precalculate
- 3. Pick the Right Data Type
- 4. Avoid Conditional Branches
- 5. Early Out
- 6. Use the Power of Two
- 7. Do Things Simultaneously

```
at a = nt - nc, b
(AXDEPTH)
survive = SurvivalProbability( diff)
radiance = SampleLight( &rand, I, &L, &
e.x + radiance.y + radiance.z) > 0) &&
v = true;
at brdfPdf = EvaluateDiffuse( L, N )
at3 factor = diffuse * INVPI;
at weight = Mis2( directPdf, brdfPdf );
at cosThetaOut = dot( N, L );
E * ((weight * cosThetaOut) / directPdf)
andom walk - done properly, closely followi
/ive)
at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p
ırvive;
1 = E * brdf * (dot( N, R ) / pdf);
```

## Agenda:

- State of Affairs
- Optimization Introduction
- Profiling
- Low-level: Rules of Engagement
- The Cache









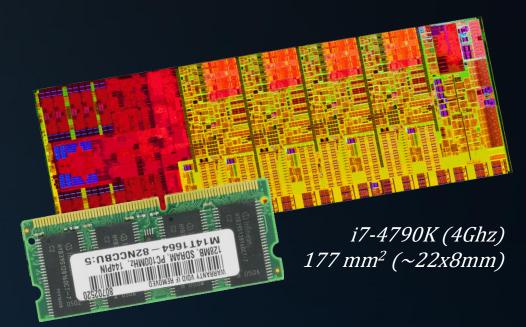
#### Feeding the Beast

Let's assume our CPU runs at 4Ghz. What is the maximum physical distance between memory and CPU if we want to retrieve data every cycle?

Speed of light (vacuum): 299,792,458 m/s
Per cycle: ~0.075 m

→ ~3.75cm back and forth.

In other words: we cannot physically query RAM fast enough to keep a CPU running at full speed.





E \* ((weight \* cosThetaOut) / directPdf)
andom walk - done properly, closely follo

1 = E \* brdf \* (dot( N, R ) / pdf);

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &

#### Feeding the Beast

Sadly, we can't just divide by the physical distance between CPU and RAM to get the cycles required to query memory.

Factors include (stats for DDR4-3200/PC4-25600):

- RAM runs at a much lower clock speed than the CPU
  - 25600 here means: theoretical bandwidth in MB/s
  - 3200 is the number of transfers per second (1 transfer=64bit)
  - We get two transfers per cycle, so actual I/O clock speed is 1600Mhz
  - DRAM cell array clock is  $\sim 1/4$ th of that: 400Mhz.
- Latency between query and response: 20-24 cycles.



E \* ((weight \* cosThetaOut) / directPdf) \* (radian
andom walk - done properly, closely following Swall
vive)
;
st3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &ps
urvive;
pdf;
n = E \* brdf \* (dot( N, R ) / pdf);
sion = true:

efl + refr)) && (depth

survive = SurvivalProbability( di

at weight = Mis2( directPdf, brdfPdf at cosThetaOut = dot( N, L );

refl \* E \* diffuse;

), N );

(AXDEPTH)

#### Feeding the Beast

Sadly, we can't just divide by the physical distance between CPU and RAM to get the cycles required to query memory.

Additional delays may occur when:

- Other devices than the CPU access RAM;
- DRAM must be refreshed every 64ms due to leakage.

is roughly 110-140 CPU cycles.

For a processor running at 2.66GHz, latency



Details in: "What Every Programmer Should Know About Memory", chapter 2.

1 = E \* brdf \* (dot( N, R ) / pdf);

E \* ((weight \* cosThetaOut) / directPdf andom walk - done properly, closely foll

at3 brdf = SampleDiffuse( diffuse, N, r1

), N );

(AXDEPTH)

refl \* E \* diffuse;

survive = SurvivalProbability

radiance = SampleLight( &rand

at weight = Mis2( directPdf at cosThetaOut = dot( N, L )

#### Feeding the Beast

"We cannot physically query RAM fast enough to keep a CPU running at full speed."

How do we overcome this?

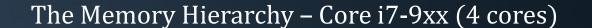
We keep a copy of frequently used data in fast memory, close to the CPU: the *cache*.

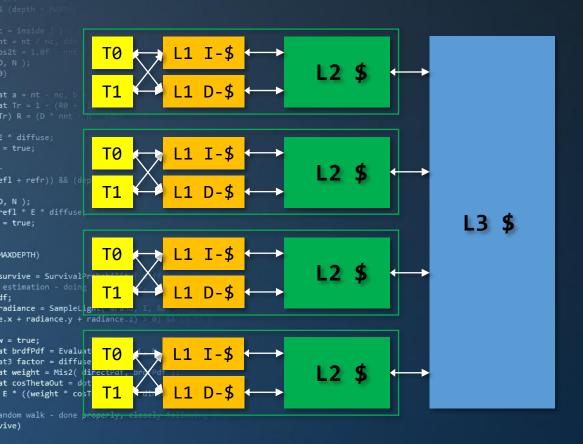












32KB I / 32KB D per core

256KB per core

8MB

x GB

registers: 0 cycles

level 1 cache: 4 cycles

level 2 cache: 11 cycles

level 3 cache: 39 cycles

RAM: 100+ cycles





; at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &pdf urvive; pdf; n = E \* brdf \* (dot( N, R ) / pdf);

#### Caches and Optimization

Considering the cost of RAM vs L1\$ access, it is clear that the cache is an important factor in code optimization:

- Fast code communicates mostly with the caches
- We still need to get data into the caches
- But ideally, only once.

#### Therefore:

- The working set must be small;
- Or we must maximize *data locality*.



```
et cosThetaOut = dot( N, L );

E * ((weight * cosThetaOut) / directPdf) * (radian);

andom walk - done properly, closely following series

/ive)

;

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p

urvive;

pdf;

n = E * brdf * (dot( N, R ) / pdf);

sion = true:
```

efl + refr)) && (depth <

survive = SurvivalProbability( diff

radiance = SampleLight( &rand, I, &L e.x + radiance.y + radiance.z) > 0)

at brdfPdf = EvaluateDiffuse( L, N ) at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf )

(AXDEPTH)

v = true;

#### **Data Locality**

#### Wikipedia:

**Temporal Locality** – "If at one point in time a particular memory location is referenced, then it is likely that the same location will be referenced again in the near future."

**Spatial Locality** – "If a particular memory location is referenced at a particular time, then it is likely that nearby memory locations will be referenced in the near future."

\* More info: <a href="http://gameprogrammingpatterns.com/data-locality.html">http://gameprogrammingpatterns.com/data-locality.html</a>



efl + refr

(AXDEPTH)

survive = SurvivalProbability( diff

radiance = SampleLight( &rand, I, & e.x + radiance.y + radiance.z) > 0)

at brdfPdf = EvaluateDiffuse( L, N

at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );



#### Data Locality

How do we increase data locality?

**Linear access** – Sometimes as simple as swapping for loops \*

**Tiling** – Example of working on a small subset of the data at a time.

**Streaming** – Operate on/with data until done.

**Reducing data size** – Smaller things are closer together.

How do trees/linked lists/hash tables fit into this?

\* For an elaborate example see <a href="https://www.cs.duke.edu/courses/cps104/spring11/lects/19-cache-sw2.pdf">https://www.cs.duke.edu/courses/cps104/spring11/lects/19-cache-sw2.pdf</a>



efl + refr)) && (depth

survive = SurvivalProbability( dif

radiance = SampleLight( &rand, I

at weight = Mis2( directPdf, brdfPdf at cosThetaOut = dot( N, L );

E \* ((weight \* cosThetaOut) / directPdf

refl \* E \* diffuse;

), N );

(AXDEPTH)

v = true;

Two more issues:

1. Cache deals in lines of 64 bytes.

2. Mind 'false sharing'.

```
AXXDEPTH)

survive = SurvivalProbability( diffuse a sestimation - doing it properly, classed if;
radiance = SampleLight( &rand, I, &L, &lighthouse.x + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.y + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0) && (dot in a sex + radiance.z) > 0)
```



), N );

(AXDEPTH)

v = true;

survive = SurvivalProbability( dif

radiance = SampleLight( &rand, I, . e.x + radiance.y + radianc<u>e.z) > 0</u>

at brdfPdf = EvaluateDiffuse( L, N ) at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );

1 = E \* brdf \* (dot( N, R ) / pdf);

E \* ((weight \* cosThetaOut) / directPdf)
andom walk - done properly, closely follow

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &

How to Please the Cache

Or: "how to evade RAM"

1. Keep your data in registers

Use fewer variables
Limit the scope of your variables
Pack multiple values in a single variable
Use floats and ints (they use different registers)
Compile for 64-bit (more registers)
Arrays will never go in registers
Unions will never go in registers

# Liefde is...



(AXDEPTH)

v = true;

survive = SurvivalProbability( diff.

radiance = SampleLight( &rand, I, &L, e.x + radiance.y + radiance.z) > 0) &

et brdfPdf = EvaluateDiffuse( L, N ) \* at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );

1 = E \* brdf \* (dot( N, R ) / pdf);

E \* ((weight \* cosThetaOut) / directPdf)

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p

How to Please the Cache

Or: "how to evade RAM"

2. Keep your data local

Read sequentially
Keep data small
Use tiling / Morton order
Fetch data once, work until done (streaming)
Reuse memory locations

# Liefde is...



(AXDEPTH)

v = true;

survive = SurvivalProbability( diff.

radiance = SampleLight( &rand, I, &L, e.x + radiance.y + radiance.z) > 0) &

et brdfPdf = EvaluateDiffuse( L, N ) \* at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf ) at cosThetaOut = dot( N, L );

n = E \* brdf \* (dot( N, R ) / pdf);

E \* ((weight \* cosThetaOut) / directPdf)

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &p

How to Please the Cache

Or: "how to evade RAM"

3. Respect cache line boundaries

Use padding if needed
Don't pad for sequential access
Use aligned malloc / \_\_declspec align
Assume 64-byte cache lines

## Liefde is...





How to Please the Cache

Or: "how to evade RAM"

4. Advanced tricks

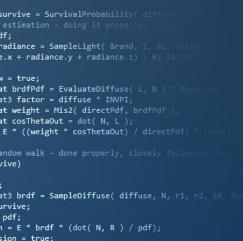
Prefetch
Use a prefetch thread (theoretical...)
Use *streaming writes*Separate mutable / immutable data

## Liefde is...



... hem het cadeau geven dat hij écht wil.





(AXDEPTH)

(AXDEPTH)

v = true;

survive = SurvivalProbability( diffu

radiance = SampleLight( &rand, I, &L, & e.x + radiance.y + radiance.z) > 0) &&

at brdfPdf = EvaluateDiffuse( L, N ) \* / at3 factor = diffuse \* INVPI; at weight = Mis2( directPdf, brdfPdf ); at cosThetaOut = dot( N, L );

E \* ((weight \* cosThetaOut) / directPdf) = andom walk - done properly, closely followi

1 = E \* brdf \* (dot( N, R ) / pdf);

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, &pd

How to Please the Cache

Or: "how to evade RAM"

5. Be informed

Use the profiler!

### Liefde is...





## Agenda:

- State of Affairs
- Optimization Introduction
- Profiling
- Low-level: Rules of Engagement
- The Cache









Thursday 09:00 - 14:00

advanced Whitted audio, AI & physics faster Whitted

LAB 2

Heaven7

work @ home

End result day 2:

A solid Whitted-style ray tracer, as a basis for subsequent work.

Friday 09:00 - 17:00

YOU ARE HERE

profiling, rules of engagement threading



LAB<sub>3</sub>

SIMD applied SIMD SIMD triangle SIMD AABB

LAB 4

GAME JAM Monday 09:00 - 17:00

acceleration grid, BVH, kD-tree SAH binning



LAB 5

refitting top-level BVH threaded building

LAB 6

Tuesday 09:00 - 17:00

Monte-Carlo Cook-style glossy, AA area lights, DOF



LAB 7

path tracing



LAB8

Thursday 09:00 - 17:00

random numbers stratification blue noise



**LAB 11** 

importance sampling next event estimation

**LAB 10** 

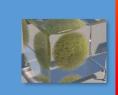
LAB9

path guiding

Friday

future work

09:00 - 17:00



**LAB 10** 



End result day 3:

A 5x faster tracer.

End result day 4:

A real-time tracer.

End result day 5:

Cook or Kajiya.

End result day 6:

Efficiency.

End result day 6:

Great product.

at3 brdf = SampleDiffuse( diffuse, N, r1, r2, &R, )

n = E \* brdf \* (dot( N, R ) / pdf);

Take some time to speed up your ray tracer.

#### Low level:

Don't do more sqrt/sin/pow than you absolutely have to.

Don't trust stl, write your own code.

Limit conditionals.

Don't write values that you will later overwrite.

Rule of thumb: a single-threaded ray tracer for 3 spheres and a plane runs at 30+fps.

#### Cache / memory:

Reduce the amount of data you touch

Don't new/delete anything after initialization.

Reuse the ray.

Improve data locality

Operate on tiles.

#### General guidelines:

Clean code is fast code.

It can always be made faster.

Speedups do not add up, they multiply.

## End of PART 3.









