

## Optimizing smallpt

Davean Scies, Siddharth Bhat

## Haskell Exchange

November 4th, 2020

## What is smallpt anyway?

## Optimizing smallpt

What is smallpt anyway?

2020-11-05

└ What is smallpt anyway?

1. **S**
2. 99 LoC C++: **small** path tracer.
3. Ported to many languages, including Haskell!
4. Haskell port was by Vo Minh Thu. Thanks a ton!
5. Start from noteed's original source; SHA the output image from the Haskell source for baseline.
6. Perfect for an optimization case study.
7. Plan: Quick walk through Haskell code, end up at C++ (clang++) performance.

# What is smallpt anyway?

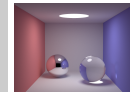


- ▶ 99 LoC C++: **small path tracer**.
- ▶ Ported to many languages, including Haskell! (Thanks to Vo Minh Thu/noteed).
- ▶ Start from noteed's original source; SHA the output image from the Haskell source for baseline.

## Optimizing smallpt

2020-11-05

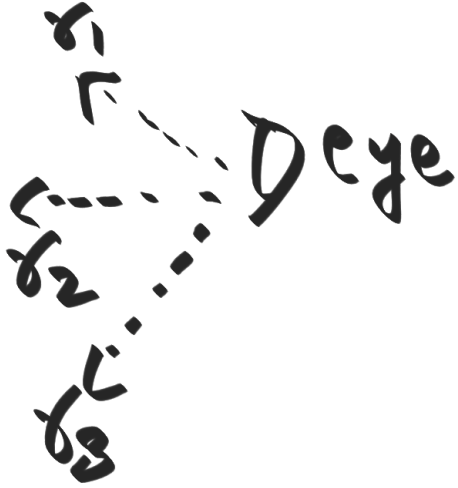
### What is smallpt anyway?



- ▶ 99 LoC C++: **small path tracer**.
- ▶ Ported to many languages, including Haskell! (Thanks to Vo Minh Thu/noteed).
- ▶ Start from noteed's original source; SHA the output image from the Haskell source for baseline.

1. **S**
2. 99 LoC C++: **small path tracer**.
3. Ported to many languages, including Haskell!
4. Haskell port was by Vo Minh Thu. Thanks a ton!
5. Start from noteed's original source; SHA the output image from the Haskell source for baseline.
6. Perfect for an optimization case study.
7. Plan: Quick walk through Haskell code, end up at C++ (clang++) performance.

## A TL;DR of a path tracer



## Optimizing smallpt

2020-11-05

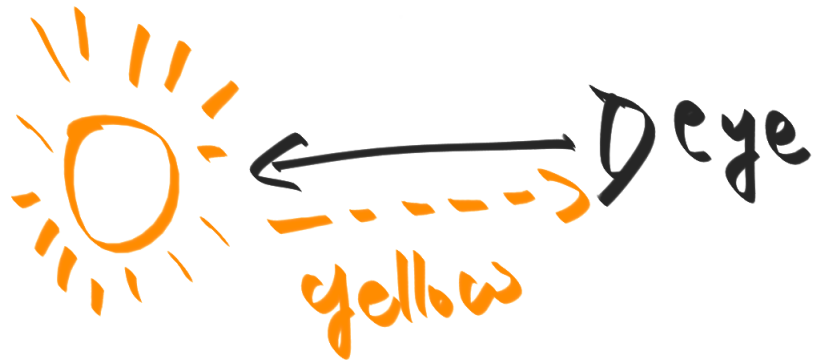
└ A TL;DR of a path tracer

A TL;DR of a path tracer



1. **S**
2. Brief spiritually correct description of how a path tracer works
3. Main problem: what light ray hits the eye?
4. Idea: trace backwards; start from the eye, hypothesize light came from a direction
5. Follow the direction, and see if light did indeed come from this direction
6. Hypothesize light came from direction  $r_1$ . Follow and see what happens
7. Similarly for  $r_2$ ,  $r_3$

## A TL;DR of a path tracer



## Optimizing smallpt

2020-11-05

└ A TL;DR of a path tracer

A TL;DR of a path tracer



1. Let's say our ray hits a light source
2. Then we know that the ray came from the light source
3. Set color to color of light source

## A TL;DR of a path tracer

## Optimizing smallpt

2020-11-05

- └ A TL;DR of a path tracer

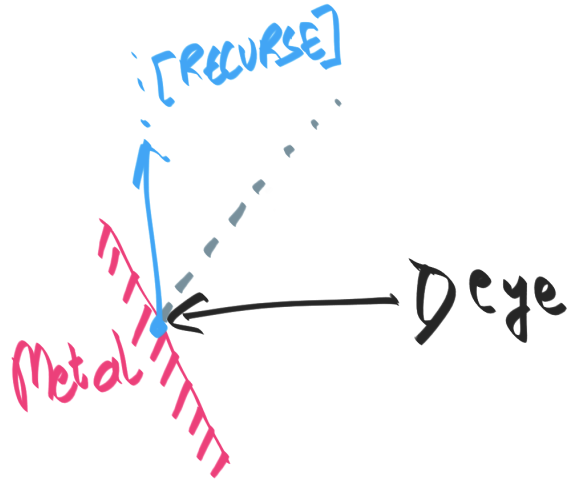
### A TL:DR of a path tracer

VOID ← D  
black(0,0,0)

void ← D  
-----  
black(0,0,0)

1. Let's say our ray hits nothing
2. Then we know that nothing could have produced this ray.
3. Set color to zero

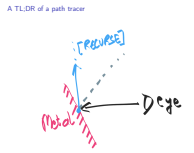
## A TL;DR of a path tracer



## Optimizing smallpt

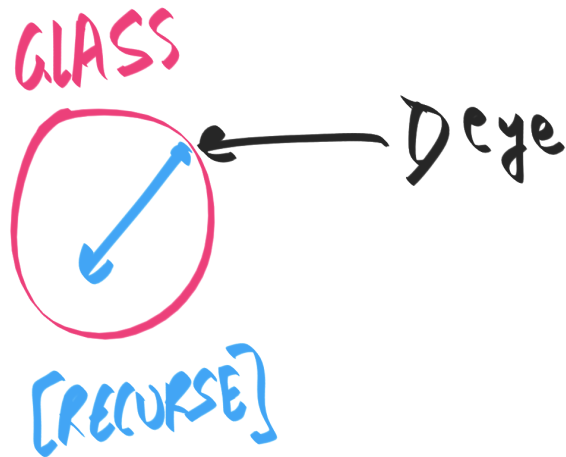
2020-11-05

└ A TL;DR of a path tracer



1. Let's say our ray hit a metallic object. This is neither a light source, nor nothing
2. We want to find light rays, which on striking the metal, produce our black right ray
3. Use reflection: angle of incidence equals angle of reflection
4. Perform math, find light ray that lead to black right ray
5. candidate blue ray is shown
6. recurse

## A TL;DR of a path tracer

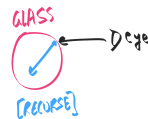


## Optimizing smallpt

2020-11-05

└ A TL;DR of a path tracer

A TL;DR of a path tracer



1. Let's say our ray hit a glass object. This is different from all the previous cases
2. Here, refraction comes into play
3. Perform math, find light ray that lead to black right ray
4. candidate blue ray is shown
5. recurse



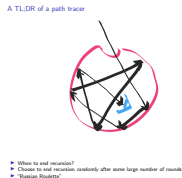
A hand-drawn diagram of a complete graph  $K_5$ . It consists of 5 vertices arranged in a regular pentagon pattern. Every vertex is connected to every other vertex by a straight line edge, resulting in a total of 10 edges. The entire graph is circled with a thick pink line. A blue letter 'A' is written in the center of the graph.

- A set of small navigation icons typically found in Beamer presentations, including symbols for back, forward, search, and other slide controls.

## 2020-11-05

- └ A TL;DR of a path tracer

1. Consider a difficult scene like this one, where light can only enter from the top
2. Light may need to bounce many times before it enters the eye
3. How many bounces do we consider?
4. Make longer bounces more unlikely
5. Setup a russian roulette system, where the longer a ray has bounced, the more likely it is to die (stop recursing)
6. increase number of bullets in the gun as number of bounces increase



# A TL;DR of a path tracer

- ▶ Recursive (recursively send more light rays)
- ▶ Branching (hit an object? is it a light source? what material?)
- ▶ Number crunching (reflection, refraction, sphere-ray-intersection)
- ▶ Randomness (when do we stop a light ray)

### A TL;DR of a path tracer

- ▶ Recursive (recursively send more light rays)
- ▶ Branching (hit an object? is it a light source? what material?)
- ▶ Number crunching (reflection, refraction, sphere-ray-intersection)
- ▶ Randomness (when do we stop a light ray)

# What is smallpt anyway?

```
struct Vec {
    double x, y, z; // position, also color (r,g,b)
    ... methods...
};

struct Ray { Vec o, d; Ray(Vec o_, Vec d_) : o(o_), d(d_) {} };

enum Refl_t { DIFF, SPEC, REFR }; // material types, used in radiance()

struct Sphere {
    double rad; // radius
    Vec p, e, c; // position, emission, color
    Refl_t refl; // reflection type (DIFFuse, SPECular, REFRactive)
    ... methods ...
    double intersect(const Ray &r) const // returns distance, 0 if nohit
};

Sphere spheres[] = { //Scene: radius, position, emission, color, material
    Sphere(1e5, Vec( 1e5+1,40.8,81.6), Vec(),Vec(.75,.25,.25),DIFF), //Left
    ... initialization ...
};
```

## Optimizing smallpt

2020-11-05

### What is smallpt anyway?

1. S
2. Has geometric primitives: vectors, spheres, materials
3. Entirely numeric-based, no real “data structures” to speak of

```
What is smallpt anyway?

struct Vec {
    double x, y, z; // position, also color (r,g,b)
    ... methods...
};

struct Ray { Vec o, d; Ray(Vec o_, Vec d_) : o(o_), d(d_) {} };

enum Refl_t { DIFF, SPEC, REFR }; // material types, used in radiance()

struct Sphere {
    double radi; // radius
    Vec p, e, c; // position, emission, color
    Refl_t refl; // reflection type (DIFFuse, SPECular, REFRactive)
    ... methods ...
    double intersect(const Ray &r) const // returns distance, 0 if nohit
};

Sphere spheres[] = { //Scene: radius, position, emission, color, material
    Sphere(1e5, Vec( 1e5+1,40.8,81.6), Vec(),Vec(.75,.25,.25),DIFF), //Left
    ... initialization ...
};
```

# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

1. **S**
2. Most of the compute cost is spent in the function that traces rays.
3. is called radiance

# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
    radiance
```

```
    radiance
```

```
    radiance
```

```
    radiance  
    radiance
```

```
    radiance  
    radiance
```

```
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

```
What is smallpt anyway?  
  
Vec radiance(const Ray &r, int depth, unsigned short *Xi){  
  
    radiance  
    radiance  
  
    radiance  
  
    radiance  
    radiance  
}
```

1. **S**
2. radiance is the function that performs this path tracing
3. Recursively calls itself a bunch of times

# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
    if ( /* hit */ ) if ( /* is a sphere */ ) else
```

```
    } else if ( /* is a glass sphere */ )
```

```
    if ( /* is a light source */ )
```

```
    radiance(r, depth, Xi) + radiance(r, depth, Xi)
    radiance(r, depth, Xi)
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

```
What is smallpt anyway?
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
    if ( /* hit */ ) if ( /* is a sphere */ ) else
    } else if ( /* is a glass sphere */ )
    if ( /* is a light source */ )
    radiance(r, depth, Xi) + radiance(r, depth, Xi)
    radiance(r, depth, Xi)
}
```

1. S
2. Recursion is guarded by a lot of control flow

# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;
```

```
if ( ) if ( ) else  
if ( ){
```

```
radiance  
} else if ( )  
radiance
```

```
if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0)  
radiance
```

```
radiance radiance  
radiance radiance  
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

```
What is smallpt anyway?  
  
Vec radiance(const Ray &r, int depth, unsigned short *Xi){  
  
Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;  
if ( ) if ( ) else  
if ( ){  
  
radiance  
radiance  
}  
else if ( )  
radiance  
radiance  
}  
if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0)  
radiance  
  
radiance radiance  
radiance radiance  
}
```

1. S
2. The control flow and computation is very numeric in nature

# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;
```

```
if ( ) if (erand48(Xi) ) else  
if ( ) {  
    erand48(Xi)    erand48(Xi)
```

```
    radiance  
} else if ( )  
    radiance
```

```
if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0)  
    radiance
```

```
    erand48(Xi)  
    radiance  
    radiance  
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

1. S
2. uses the function erand48 for randomness

What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
```

```
Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;  
if ( ) if (erand48(Xi) ) else  
if ( ) {  
    erand48(Xi)    erand48(Xi)  
    radiance  
} else if ( )  
    radiance  
if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0)  
    radiance  
    erand48(Xi)  
    radiance  
    radiance  
}
```



# What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
    double t; // distance to intersection
    int id=0; // id of intersected object
    if (!intersect(r, t, id)) return Vec(); // if miss, return black
    const Sphere &obj = spheres[id]; // the hit object
    Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;
    double p = f.x>f.y && f.x>f.z ? f.x : f.y>f.z ? f.y : f.z; // max refl
    if (++depth>5) if (erand48(Xi)<p) f=f*(1/p); else return obj.e; //R.R.
    if (obj.refl == DIFF){ // Ideal DIFFUSE reflection
        double r1=2*M_PI*erand48(Xi), r2=erand48(Xi), r2s=sqrt(r2);
        Vec w=nl, u=((fabs(w.x)>.1?Vec(0,1):Vec(1))%w).norm(), v=w%u;
        Vec d = (u*cos(r1)*r2s + v*sin(r1)*r2s + w*sqrt(1-r2)).norm();
        return obj.e + f.mult(radiance(Ray(x,d),depth,Xi));
    } else if (obj.refl == SPEC) // Ideal SPECULAR reflection
        return obj.e + f.mult(radiance(Ray(x,r.d-n*2*n.dot(r.d)),depth,Xi));
    Ray reflRay(x, r.d-n*2*n.dot(r.d)); // Ideal dielectric REFRACTION
    bool into = n.dot(nl)>0; // Ray from outside going in?
    double nc=1, nt=1.5, nnt=into?nc/nt:nt/nc, ddn=r.d.dot(nl), cos2t;
    if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0) // Total internal reflection
        return obj.e + f.mult(radiance(reflRay,depth,Xi));
    Vec tdir = (r.d*nnt - n*((into?-1):1)*(ddn*nnt+sqrt(cos2t))).norm();
    double a=nt-nc, b=nt+nc, R0=a*a/(b*b), c = 1-(into?-ddn:tdir.dot(n));
    double Re=R0+(1-R0)*c*c*c*c*c, Tr=1-Re, P=.25+.5*Re, RP=Re/P, TP=Tr/(1-P);
    return obj.e + f.mult(depth>2 ? (erand48(Xi)<P ? // Russian roulette
        radiance(reflRay,depth,Xi)*RP:radiance(Ray(x,tdir),depth,Xi)*TP) :
        radiance(reflRay,depth,Xi)*Re+radiance(Ray(x,tdir),depth,Xi)*Tr);
}
```

## Optimizing smallpt

2020-11-05

What is smallpt anyway?

1. S
2. The full code continues to be more of the same

What is smallpt anyway?

```
Vec radiance(const Ray &r, int depth, unsigned short *Xi){
    double t; // distance to intersection
    int id=0; // id of intersected object
    if (!intersect(r, t, id)) return Vec(); // if miss, return black
    const Sphere &obj = spheres[id]; // the hit object
    Vec x=r.o+r.d*t, n=(x-obj.p).norm(), nl=n.dot(r.d)<0?n:n*-1, f=obj.c;
    double p = f.x>f.y && f.x>f.z ? f.x : f.y>f.z ? f.y : f.z; // max refl
    if (++depth>5) if (erand48(Xi)<p) f=f*(1/p); else return obj.e; //R.R.
    if (obj.refl == DIFF){ // Ideal DIFFUSE reflection
        double r1=2*M_PI*erand48(Xi), r2=erand48(Xi), r2s=sqrt(r2);
        Vec w=nl, u=((fabs(w.x)>.1?Vec(0,1):Vec(1))%w).norm(), v=w%u;
        Vec d = (u*cos(r1)*r2s + v*sin(r1)*r2s + w*sqrt(1-r2)).norm();
        return obj.e + f.mult(radiance(Ray(x,d),depth,Xi));
    } else if (obj.refl == SPEC) // Ideal SPECULAR reflection
        return obj.e + f.mult(radiance(Ray(x,r.d-n*2*n.dot(r.d)),depth,Xi));
    Ray reflRay(x, r.d-n*2*n.dot(r.d)); // Ideal dielectric REFRACTION
    bool into = n.dot(nl)>0; // Ray from outside going in?
    double nc=1, nt=1.5, nnt=into?nc/nt:nt/nc, ddn=r.d.dot(nl), cos2t;
    if ((cos2t=1-nnt*nnt*(1-ddn*ddn))<0) // Total internal reflection
        return obj.e + f.mult(radiance(reflRay,depth,Xi));
    Vec tdir = (r.d*nnt - n*((into?-1):1)*(ddn*nnt+sqrt(cos2t))).norm();
    double a=nt-nc, b=nt+nc, R0=a*a/(b*b), c = 1-(into?-ddn:tdir.dot(n));
    double Re=R0+(1-R0)*c*c*c*c*c, Tr=1-Re, P=.25+.5*Re, RP=Re/P, TP=Tr/(1-P);
    return obj.e + f.mult(depth>2 ? (erand48(Xi)<P ? // Russian roulette
        radiance(reflRay,depth,Xi)*RP:radiance(Ray(x,tdir),depth,Xi)*TP) :
        radiance(reflRay,depth,Xi)*Re+radiance(Ray(x,tdir),depth,Xi)*Tr);
}
```

# Initial Haskell Code: radiance (1×)

```
radiance :: Ray -> CInt -> Ptr CUSHort -> IO Vec
radiance ray@(Ray o d) depth xi = case intersects ray of
  (Nothing,_) -> return zerov
  (Just t,Sphere _r p e c refl) -> do
```

```
  continue f = case refl of - BRANCHING
    DIFF -> do
      r1 <- ((2*pi)*) `fmap` erand48 xi -- RNG
```

```
      radiance
```

```
    SPEC -> do
```

```
      rad <- radiance -- RECURSION
```

```
    REFR -> do
```

```
      if
      then do
        rad <- radiance
      ...
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: radiance (1×)

1. S
2. The same computation, this time in haskell

Initial Haskell Code: radiance (1×)

```
radiance :: Ray -> CInt -> Ptr CUSHort -> IO Vec
radiance ray@(Ray o d) depth xi = case intersects ray of
  (Nothing,_) -> return zerov
  (Just t,Sphere _r p e c refl) -> do
```

```
  continue f = case refl of - BRANCHING
    DIFF -> do
```

```
    radiance
    SPEC -> do
      rad <- radiance -- RECURSION
    REFR -> do
```

```
      if
      then do
        rad <- radiance
```

# Initial Haskell Code: Data structures

```
data Vec = Vec {-# UNPACK #-} !Double {-# UNPACK #-} !Double {-# UNPACK #-} !Double
```

```
cross :: Vec -> Vec -> Vec
(.*) :: Vec -> Double -> Vec
infixl 7 .*
len :: Vec -> Double
norm :: Vec -> Vec
norm v = v .* recip (len v)
dot :: Vec -> Vec -> Double
maxv :: Vec -> Double
```

```
data Ray = Ray Vec Vec -- origin, direction
data Refl = DIFF | SPEC | REFR -- material types, used in radiance
-- / radius, position, emission, color, reflection
data Sphere = Sphere Double Vec Vec Vec Refl
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: Data structures

Initial Haskell Code: Data structures

```
data Vec = Vec {-# UNPACK #-} !Double {-# UNPACK #-} !Double {-# UNPACK #-} !Double
cross :: Vec -> Vec -> Vec
(.*) :: Vec -> Double -> Vec
infixl 7 .*
len :: Vec -> Double
norm :: Vec -> Vec
norm v = v .* recip (len v)
dot :: Vec -> Vec -> Double
maxv :: Vec -> Double

data Ray = Ray Vec Vec -- origin, direction
data Refl = DIFF | SPEC | REFR -- material types, used in radiance
-- / radius, position, emission, color, reflection
data Sphere = Sphere Double Vec Vec Vec Refl
```

1. S
2. We implement the same geometric data structures in Haskell
3. Code here has an inconsistency
4. while Vec has unpack, Ray, Sphere not having unpack

# Initial Haskell Code: scene data

```
spheres :: [Sphere]
spheres =
  [ Sphere 1e5 (Vec (1e5+1) 40.8 81.6) 0 (Vec 0.75 0.25 0.25) DIFF --Left
  , Sphere 1e5 (Vec (99-1e5) 40.8 81.6) 0 (Vec 0.25 0.25 0.75) DIFF --Rght
  , Sphere 1e5 (Vec 50 40.8 1e5) 0 0.75 DIFF --Back
  , Sphere 1e5 (Vec 50 40.8 (170-1e5)) 0 0 DIFF --Frnt
  , Sphere 1e5 (Vec 50 1e5 81.6) 0 0.75 DIFF --Botm
  , Sphere 1e5 (Vec 50 (81.6-1e5) 81.6) 0 0.75 DIFF --Top
  , Sphere 16.5 (Vec 27 16.5 47) 0 0.999 SPEC --Mirr
  , Sphere 16.5 (Vec 73 16.5 78) 0 0.999 REFR --Glas
  , Sphere 600 (Vec 50 681.33 81.6) 12 0 DIFF] --Lite
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: scene data

Initial Haskell Code: scene data

```
spheres :: [Sphere]
spheres =
  [ Sphere 1e5 (Vec (1e5+1) 40.8 81.6) 0 (Vec 0.75 0.25 0.25) DIFF --Left
  , Sphere 1e5 (Vec (99-1e5) 40.8 81.6) 0 (Vec 0.25 0.25 0.75) DIFF --Rght
  , Sphere 1e5 (Vec 50 40.8 1e5) 0 0.75 DIFF --Back
  , Sphere 1e5 (Vec 50 40.8 (170-1e5)) 0 0 DIFF --Frnt
  , Sphere 1e5 (Vec 50 1e5 81.6) 0 0.75 DIFF --Botm
  , Sphere 1e5 (Vec 50 (81.6-1e5) 81.6) 0 0.75 DIFF --Top
  , Sphere 16.5 (Vec 27 16.5 47) 0 0.999 SPEC --Mirr
  , Sphere 16.5 (Vec 73 16.5 78) 0 0.999 REFR --Glas
  , Sphere 600 (Vec 50 681.33 81.6) 12 0 DIFF] --Lite
```

1. S
2. this list will be walked many times, as it contains our scene information.

# Initial Haskell code: Sphere intersection

```
intersect :: Ray -> Sphere -> Maybe Double
intersect (Ray o d) (Sphere r p _e _c _refl) =
  if det<0 then Nothing else f (b-sdet) (b+sdet)
  where op = p - o -- Numeric
        eps = 1e-4
        b = dot op d
        det = b*b - dot op op + r*r -- Numeric
        sdet = sqrt det
        f a s = if a>eps then Just a else if s>eps then Just s else Nothing
intersects :: Ray -> (Maybe Double, Sphere)
intersects ray = (k, s)
  where (k,s) = foldl' f (Nothing,undefined) spheres -- Spheres iterated over
        f (k',sp) s' = case (k',intersect ray s') of
          (Nothing,Just x) -> (Just x,s')
          (Just y,Just x) | x < y -> (Just x,s')
          _ -> (k',sp)
```

## Optimizing smallpt

2020-11-05

### Initial Haskell code: Sphere intersection

```
intersect :: Ray -> Sphere -> Maybe Double
intersect (Ray o d) (Sphere r p _e _c _refl) =
  if det<0 then Nothing else f (b-sdet) (b+sdet)
  where op = p - o -- Numeric
        eps = 1e-4
        b = dot op d
        det = b*b - dot op op + r*r -- Numeric
        sdet = sqrt det
        f a s = if a>eps then Just a else if s>eps then Just s else Nothing
intersects :: Ray -> (Maybe Double, Sphere)
intersects ray = (k, s)
  where (k,s) = foldl' f (Nothing,undefined) spheres -- Spheres iterated over
        f (k',sp) s' = case (k',intersect ray s') of
          (Nothing,Just x) -> (Just x,s')
          (Just y,Just x) | x < y -> (Just x,s')
          _ -> (k',sp)
```

1. S
2. Responsible for figuring out what the ray hits.
3. We iterate over the list of spheres.
4. Once again, numeric heavy.
5. Use a Maybe to indicate whether we've found an answer or not.

# Initial Haskell Code: radiance (1×)

```
radiance :: Ray -> CInt -> Ptr CUSHort -> IO Vec
radiance ray@(Ray o d) depth xi = case intersects ray of
  (Nothing,_) -> return zeroV
  (Just t,Sphere _r p e c refl) -> do
    let x = o `addv` (d `mulvs` t)
        n = norm $ x `subv` p
        nl = if n `dot` d < 0 then n else n `mulvs` (-1)
        pr = maxv c
        depth' = depth + 1
        continue f = case refl of
          DIFF -> do
            r1 <- ((2*pi)* `fmap` erand48 xi)
            r2 <- erand48 xi
            let r2s = sqrt r2
                w@(Vec wx _ _) = nl
                u = norm $ (if abs wx > 0.1 then (Vec 0 1 0) else (Vec 1 0 0)) `cross` w
                v = w `cross` u
                d' = norm $ (u`mulvs`(cos r1*r2s)) `addv` (v`mulvs`(sin r1*r2s)) `addv` (w`mulvs`sqrt (1-r2))
            rad <- radiance (Ray x d') depth' xi
            return $ e `addv` (f `mulv` rad)
          SPEC -> do
            let d' = d `subv` (n `mulvs` (2 * (n`dot`d)))
            rad <- radiance (Ray x d') depth' xi
            return $ e `addv` (f `mulv` rad)
          REFR -> do
            let reflRay = Ray x (d `subv` (n `mulvs` (2* n`dot`d)))
                into = n`dot`nl > 0
                nc = 1
                nt = 1.5
                nnt = if into then nc/nt else nt/nc
                ddn = d`dot`nl
                cos2t = 1-nnt*nnt*(1-ddn*ddn)
            if cos2t<0
            then do
              rad <- radiance reflRay depth' xi
            ...
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: radiance (1×)

- 1. S
- 2. Branch heavy
- 3. Recursive
- 4. Uses an RNG



# Initial Haskell Code: Entry point (1×)

```
smallpt :: Int -> Int -> Int -> IO ()
```

```
smallpt w h nsamps = do
```

```
...
c <- VM.replicate (w * h) 0
allocaArray 3 \xi -> -- Create mutable memory
  flip mapM_ [0..h-1] $ \y -> do -- Loop
    writeXi xi y
    for_ [0..w-1] \x -> do -- Loop
      let i = (h-y-1) * w + x
      for_ [0..1] \sy -> do -- Loop
        for_ [0..1] \sx -> do -- Loop
          r <- newIORef 0 -- Create mutable memory
          for_ [0..samps-1] \s -> do -- Loops, Loops
            r1 <- (2*) <$> erand48 xi
            ...
            rad <- radiance (Ray (org+d.*140) (norm d)) 0 xi -- Crunch
            ...
            modifyIORef r (+ rad .* recip (fromIntegral samps)) -- Write
          ci <- VM.unsafeRead c i
          Vec rr rg rb <- readIORef r
          VM.unsafeWrite c i $
            ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25 -- Write
          ...
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: Entry point (1×)

```
Initial Haskell Code: Entry point (1×)
smallpt :: Int -> Int -> Int -> IO ()
smallpt w h nsamps = do
  ...
  d <- VM.replicate (w * h) 0
  allocaArray 3 \xi -> -- Create mutable memory
  flip mapM_ [0..h-1] $ \y -> do -- Loop
    writeXi xi y
    for_ [0..w-1] \x -> do -- Loop
      let i = (h-y-1) * w + x
      for_ [0..1] \sy -> do -- Loop
        for_ [0..1] \sx -> do -- Loop
          r <- newIORef 0 -- Create mutable memory
          for_ [0..samps-1] \s -> do -- Loops, Loops
            r1 <- (2*) <$> erand48 xi
            ...
            rad <- radiance (Ray (org+d.*140) (norm d)) 0 xi -- Crunch
            ...
            modifyIORef r (+ rad .* recip (fromIntegral samps)) -- Write
          ci <- VM.unsafeRead c i
          Vec rr rg rb <- readIORef r
          VM.unsafeWrite c i $
            ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25 -- Write
          ...
```

1. S
2. Use mutability to store the pixels of the image in c
3. Loops over all pixels in an image and shoots rays
4. Shoots samps number of rays per pixel and adds up the results
5. Finally, writes resulting color out by mutating the array c

## Initial Haskell Code: File I/O (1×)

```
withFile "image.ppm" WriteMode $ \hdl -> do
  hPrintf hdl "P3\n%d %d\n%d\n" w h (255::Int)
  flip mapM_ [0..w*h-1] \i -> do
    Vec r g b <- VM.unsafeRead c i
    hPrintf hdl "%d %d %d " (toInt r) (toInt g) (toInt b)
```

## Optimizing smallpt

2020-11-05

### Initial Haskell Code: File I/O (1×)

```
Initial Haskell Code: File I/O (1×)

withFile "image.ppm" WriteMode $ \hdl -> do
  hPrintf hdl "P3\n%d %d\n%d\n" w h (255::Int)
  flip mapM_ [0..w*h-1] \i -> do
    Vec r g b <- VM.unsafeRead c i
    hPrintf hdl "%d %d %d " (toInt r) (toInt g) (toInt b)
```



## Initial Haskell Code: RNG (1×)

```
foreign import ccall unsafe "erand48"  
  erand48 :: Ptr Cushort -> IO Double
```

## Optimizing smallpt

2020-11-05

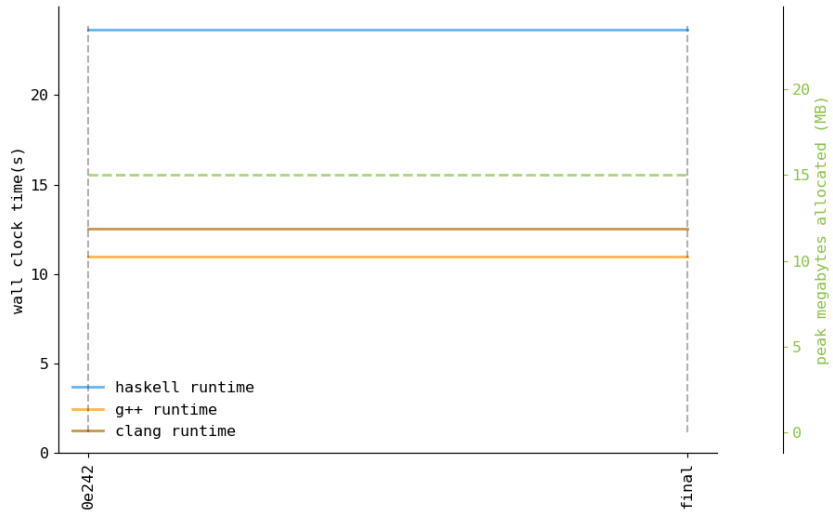
### Initial Haskell Code: RNG (1×)

Initial Haskell Code: RNG (1×)

```
foreign import ccall unsafe "erand48"  
  erand48 :: Ptr Cushort -> IO Double
```

1. **S**
2. As mentioned previously, we use the RNG to decide randomly in which direction to send rays
3. erand48 is imported as a foreign ccall for parity with the C code

# Performance: Initial Haskell Code



2020-11-05

## Optimizing smallpt

Performance: Initial Haskell Code



Restrict export list to main (1.13x)

```
-module Main where
+module Main (main) where
```

## Optimizing smallpt

2020-11-05

- Restrict export list to main ( $1.13\times$ )

Restrict export list to main (1.13x)

```
-module Main where
+module Main (main) where
```

1. **S**
2. The very first thing to do is to let the compiler actually optimize.
3. If a function is public, then compiler doesn't know all call sites
4. Export only the one function that's called from the outside: main
5. Allows compiler to know that other functions in module are not called from outside
6. compiler has "perfect knowledge" about these functions now

Restrict export list to main (1.13×)

```
-module Main where
+module Main (main) where
```

- ▶ Exported functions could be used by something unknown.
- ▶ Original versions must be available.

## Optimizing smallpt

2020-11-05

- Restrict export list to main ( $1.13\times$ )

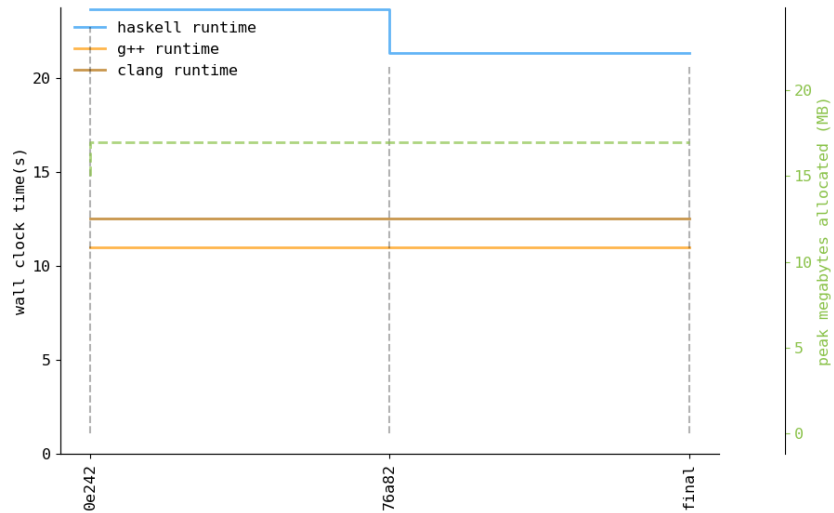
Restrict export list to main (1.13x)

```
-module Main where
+module Main (main) where
```

- ▶ Exported functions could be used by something unknown
- ▶ Original versions must be available.

1. **S**
2. The very first thing to do is to let the compiler actually optimize.
3. If a function is public, then compiler doesn't know all call sites
4. Export only the one function that's called from the outside: `main`
5. Allows compiler to know that other functions in module are not called from outside
6. compiler has "perfect knowledge" about these functions now

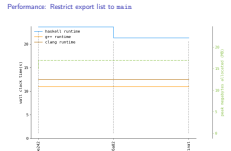
## Performance: Restrict export list to main



## Optimizing smallpt

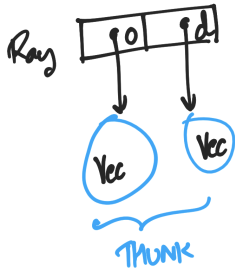
2020-11-05

Performance: Restrict export list to main



## Mark entries of Ray and Sphere as UNPACK and Strict (1.07×)

```
data Ray = Ray Vec Vec
```



- By default, all fields are *thunks* to rest of computation
- Pure, allow equational reasoning.

## Optimizing smallpt

2020-11-05

└ Mark entries of Ray and Sphere as UNPACK and Strict (1.07×)

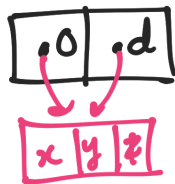
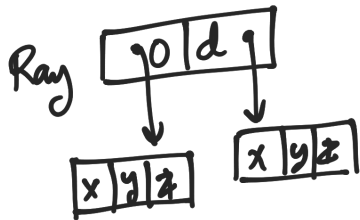
data Ray = Ray Vec Vec



- By default, all fields are *thunks* to rest of computation
- Pure, allow equational reasoning.

## Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)

```
data Ray = Ray !Vec !Vec
```

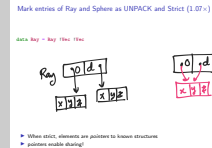


- ▶ When strict, elements are *pointers* to known structures
- ▶ pointers enable sharing!

## Optimizing smallpt

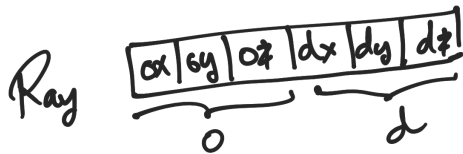
2020-11-05

Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)



## Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)

```
data Ray = Ray {-# UNPACK #-} !Vec {-# UNPACK #-} !Vec
```



- ▶ When unpacked, elements are *members* of the parent.
- ▶ Larger, but eliminate pointer chasing.

## Optimizing smallpt

2020-11-05

Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)

```
data Ray = Ray {-# UNPACK #-} !Vec {-# UNPACK #-} !Vec
```



- ▶ When unpacked, elements are members of the parent.
- ▶ Larger, but eliminate pointer chasing.



# Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)

```
data Vec = Vec {-# UNPACK #-} !Double
           {-# UNPACK #-} !Double
           {-# UNPACK #-} !Double
```

```
-data Ray = Ray Vec Vec -- origin, direction
+data Ray = Ray !Vec !Vec -- origin, direction
```

```
data Refl = DIFF | SPEC | REFR -- material types, used in radiance
```

```
-- radius, position, emission, color, reflection
-data Sphere = Sphere Double Vec Vec Vec !Refl
+data Sphere = Sphere {-# UNPACK #-} !Double
+                      {-# UNPACK #-} !Vec
+                      {-# UNPACK #-} !Vec
+                      {-# UNPACK #-} !Vec !Refl
```

```
struct Vec { double x, y, z; }
struct Ray { std::function<Vec()> v; std::function<Vec()> w; };
struct RayUnpack { double xv, yv, int zv;
                  double xw, yw, zw; };
```

## Optimizing smallpt

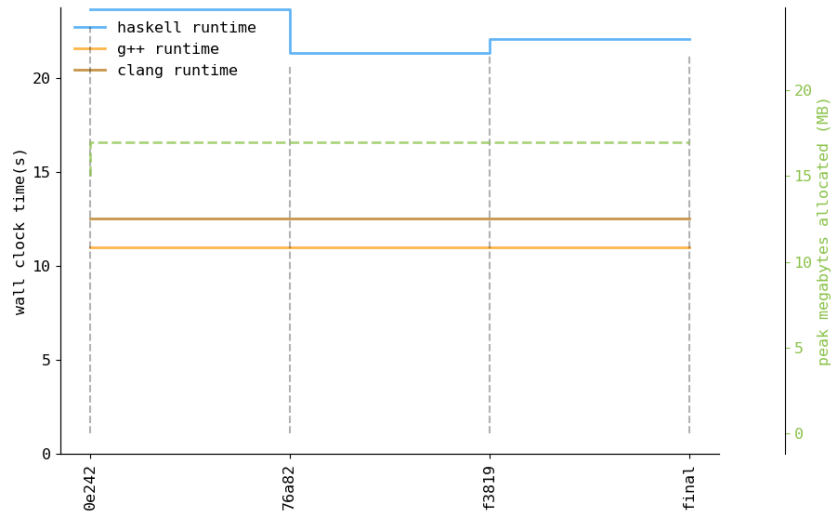
2020-11-05

### Mark entries of Ray and Sphere as UNPACK and Strict (1.07x)

```
data Vec = Vec {-# UNPACK #-} !Double
              {-# UNPACK #-} !Double
              {-# UNPACK #-} !Double
data Ray = Ray Vec Vec -- origin, direction
data Refl = DIFF | SPEC | REFR -- material types, used in radiance
-- radius, position, emission, color, reflection
data Sphere = Sphere Double Vec Vec Vec !Refl
data Sphere = Sphere {-# UNPACK #-} !Double
                  {-# UNPACK #-} !Vec
                  {-# UNPACK #-} !Vec
                  {-# UNPACK #-} !Vec !Refl
struct Vec { double x, y, z; }
struct Ray { std::function<Vec()> v; std::function<Vec()> w; };
struct RayUnpack { double xv, yv, int zv;
                  double xw, yw, zw; };
```

1. D
2. Strictness in the arguments means that they're evaluated when instantiated, not when demanded.
3. Where as Unpacking removes indirection from doing a memory lookup for components.
4. Means we have to copy everything into the data structure that it is unpacked into.
5. We don't unpack ray (Lots of calculations on its components, want those to fuse)
6. Unpack Sphere - its static from compile time
7. Don't unpack Ray, because each Vec undergoes a lot of computation.

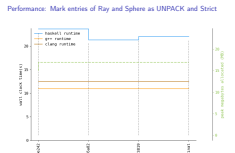
## Performance: Mark entries of Ray and Sphere as UNPACK and Strict



## Optimizing smallpt

2020-11-05

Performance: Mark entries of Ray and Sphere as UNPACK and Strict



Use a pattern synonym to unpack Refl in Sphere ( $1.07\times$ )

```
+{-# LANGUAGE PatternSynonyms #-}
```

```
-data Refl = DIFF | SPEC | REFR -- material types, used in radiance
+newtype Refl = Refl Int -- material types, used in radiance
+pattern DIFF,SPEC,REFR :: Refl
+pattern DIFF = Refl 0
+pattern SPEC = Refl 1
+pattern REFR = Refl 2
+{-# COMPLETE DIFF, SPEC, REFR #-}
```

```
-- radius, position, emission, color, reflection
data Sphere = Sphere {-# UNPACK #-} !Double
                    {-# UNPACK #-} !Vec
                    {-# UNPACK #-} !Vec
-                    {-# UNPACK #-} !Vec !Ref1
+                    {-# UNPACK #-} !Vec {-# UNPACK #-} !Ref1
```

## Optimizing smallpt

2020-11-05

- Use a pattern synonym to unpack Refl in Sphere (1.07x)

```
Use a pattern synonym to unpack Refl in Sphere (1.07)

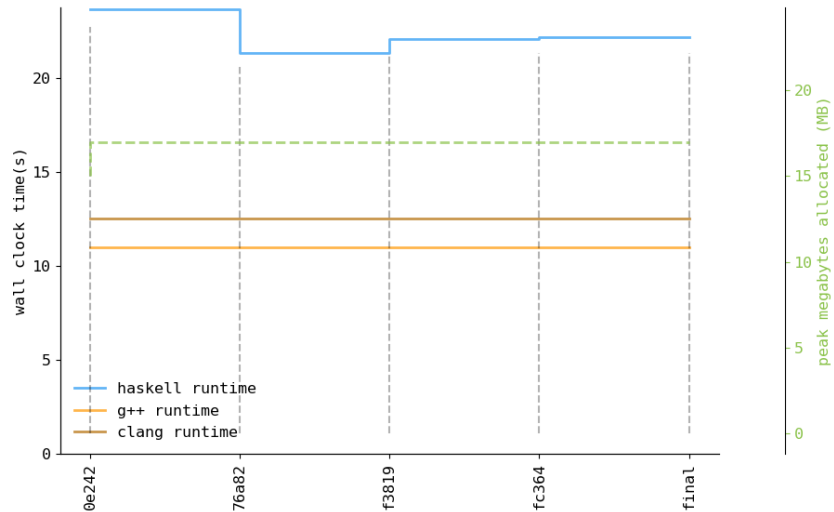
--(c) LANGUAGE PatternSynonyms #-
data Refl = DIFF | SPEC | REFR :: material types, used in radiance
newtype Refl = Refl Int :: material types, used in radiance
pattern DIFF, SPEC, REFR :: Refl
pattern DIFF = Refl 0
pattern SPEC = Refl 1
pattern REFR = Refl 2
--(c) COMPLETE DIFF, SPEC, REFR #-

-- radius, position, emission, color, shininess
data Sphere = Sphere {
  r :: Double,
  p :: Vec,
  e :: Double,
  c :: Vec,
  s :: Double
} deriving (Eq, Show)

mkSphere :: Double -- radius
--> Sphere
```

1. **D**
2. Was unable to unpack Refl
3. UnboxedSums are recent
4. UnboxedSums are very unpleasant
5. We're using an older trick to fake the unboxing here instead.
6. In this case it isn't much of a win, but it illustrates the technique.

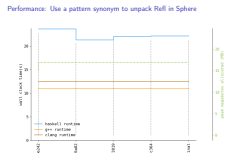
## Performance: Use a pattern synonym to unpack Refl in Sphere



## Optimizing smallpt

2020-11-05

Performance: Use a pattern synonym to unpack Refl in Sphere



## Change from maximum on a list to max (1.08×)

```
-maxv (Vec a b c) = maximum [a,b,c]
+maxv (Vec a b c) = max a (max b c)

    let x = o `addv` (d `mulvs` t)
        n = norm $ x `subv` p
        nl = if n `dot` d < 0 then n else n `mulvs` (-1)
-    pr = maxv c
    depth' = depth + 1
    continue f = case refl of
        DIFF -> do
...
    if depth'>5
    then do
        er <- erand48 xi
+    let !pr = maxv c
```

## Optimizing smallpt

2020-11-05

Change from maximum on a list to max (1.08×)

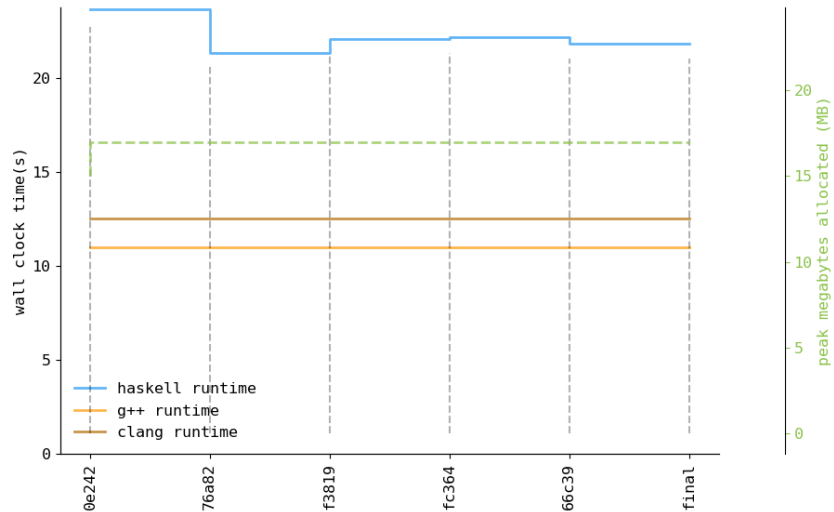
```
Change from maximum on a list to max (1.08×)

-maxv (Vec a b c) = maximum [a,b,c]
+maxv (Vec a b c) = max a (max b c)

    let x = o `addv` (d `mulvs` t)
        n = norm $ x `subv` p
        nl = if n `dot` d < 0 then n else n `mulvs` (-1)
-    pr = maxv c
    depth' = depth + 1
    continue f = case refl of
        DIFF -> do
...
    if depth'>5
    then do
        er <- erand48 xi
+    let !pr = maxv c
```

1. D
2. Prebuild comparison
3. Don't go via list
4. GHC does not evaluate at compile time, only has RULES
5. Doesn't really help much in this case

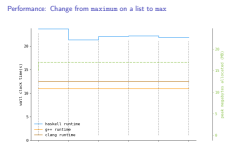
## Performance: Change from maximum on a list to max



## Optimizing smallpt

2020-11-05

Performance: Change from maximum on a list to max



# Convert erand48 to pure Haskell (1.09×)

```
-foreign import ccall unsafe "erand48"
- erand48 :: Ptr CUShort -> IO Double
```

```
+erand48 :: IORef Word64 -> IO Double
+erand48 !t = do -- | Some number crunchy thing.
+  r <- readIORef t
+  let x' = 0x5deece66d * r + 0xb
+      d_word = 0x3ff0000000000000 .|. ((x' .&. 0xffffffff) `unsafeShiftL` 4)
+      d = castWord64ToDouble d_word - 1.0
+  writeIORef t x'
+  pure d
+...
```

```
-radiance :: Ray -> CInt -> Ptr CUShort -> IO Vec
+radiance :: Ray -> Int -> IORef Word64 -> IO Vec -- IORef with state
radiance ray@(Ray o d) depth xi = case intersects ray of
  ...
  c <- VM.replicate (w * h) zeroV
-  allocaArray 3 $ \xi -> -- Old RNG state
-    flip mapM_ [0..h-1] $ \y -> do
+  xi <- newIORef 0 -- New RNG state
+  flip mapM_ [0..h-1] $ \y -> do
    writeXi xi y
```

## Optimizing smallpt

2020-11-05

### Convert erand48 to pure Haskell (1.09×)

```
Convert erand48 to pure Haskell (1.09×)

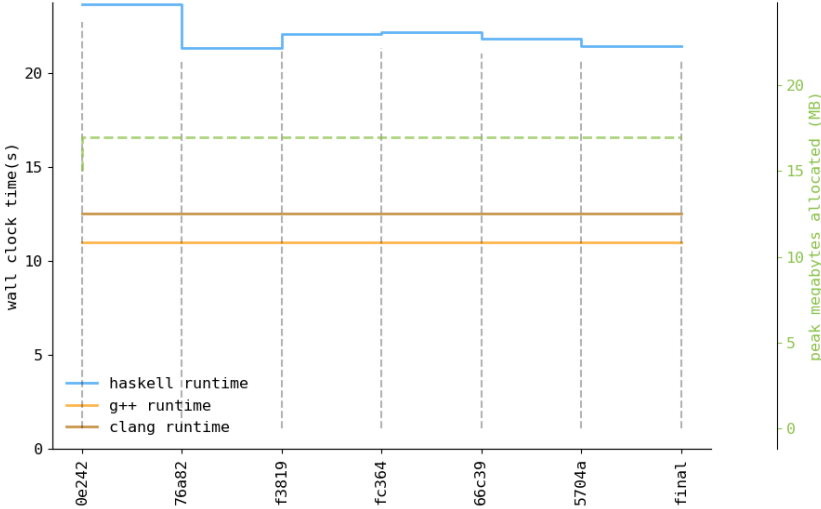
--foreign import ccall unsafe "erand48"
-- erand48 :: Ptr CUShort -> IO Double

+erand48 :: IORef Word64 -> IO Double
+erand48 !t = do -- | Some number crunchy thing.
+  r <- readIORef t
+  let x' = 0x5deece66d * r + 0xb
+      d_word = 0x3ff0000000000000 .|. ((x' .&. 0xffffffff) `unsafeShiftL` 4)
+      d = castWord64ToDouble d_word - 1.0
+  writeIORef t x'
+  pure d

+radiance :: Ray -> CInt -> Ptr CUShort -> IO Vec
+radiance :: Ray -> Int -> IORef Word64 -> IO Vec -- IORef with state
+radiance ray@(Ray o d) depth xi = case intersects ray of
  ...
  c <- VM.replicate (w * h) zeroV
-  allocaArray 3 $ \xi -> -- Old RNG state
-    flip mapM_ [0..h-1] $ \y -> do
+  xi <- newIORef 0 -- New RNG state
+  flip mapM_ [0..h-1] $ \y -> do
    writeXi xi y
```

1. S
2. The entire premise of this talk is that Haskell can be as fast as C.
3. We're opening the black box of what erand48 does to GHC
4. Further any impedance mismatch, such as FFI almost universally has to have, carries some bookkeeping overhead.
5. If our Haskell code was as fast as the C code moving the code into Haskell would be a win, if it was slightly slower it could still be a win.
6. Often considering your Haskell code's performance is a better option and easier than reimplementing something in C.
7. As is the way with optimizations, this is not universally true.

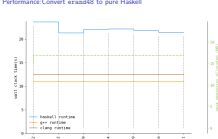
# Performance:Convert erand48 to pure Haskell



## Optimizing smallpt

2020-11-05

Performance:Convert erand48 to pure Haskell





# Remove mutability: Erand48 Monad

```
-erand48 :: IORef Word64 -> IO Double
-erand48 !t = do
-  r <- readIORef t
+data ET a = ET !Word64 !a deriving Functor
+newtype Erand48 a = Erand48 { runErand48' :: Word64 -> ET a } deriving Functor
+instance Applicative Erand48 where
+instance Monad Erand48 where
+runWithErand48 :: Int -> Erand48 a -> a
+erand48 :: Erand48 Double
+...
-radiance :: Ray -> Int -> IORef Word64 -> IO Vec
-radiance ray@(Ray o d) depth xi = case intersects ray of
+radiance :: Ray -> Int -> Erand48 Vec
+radiance ray@(Ray o d) depth = case intersects ray of
+...
-      r1 <- (2*pi*) <$> erand48 xi
-      r2 <- erand48 xi
+      r1 <- (2*pi*) <$> erand48
+      r2 <- erand48
+...
-      then (* rp) <$> radiance reflRay depth' xi
-      else (* tp) <$> radiance (Ray x tdir) depth' xi
+      then (* rp) <$> radiance reflRay depth'
+      else (* tp) <$> radiance (Ray x tdir) depth'
```

# Optimizing smallpt

2020-11-05

## Remove mutability: Erand48 Monad

```
erand48 :: IORef Word64 -> IO Double
erand48 !t = do
  r <- readIORef t
  return ET a = ET !Word64 !a deriving Functor
newtype Erand48 a = Erand48 { runErand48' :: Word64 -> ET a } deriving Functor
instance Applicative Erand48 where
instance Monad Erand48 where
runWithErand48 :: Int -> Erand48 a -> a
erand48 :: Erand48 Double
...
radiance :: Ray -> Int -> IORef Word64 -> IO Vec
radiance ray@(Ray o d) depth xi = case intersects ray of
radiance :: Ray -> Int -> Erand48 Vec
radiance ray@(Ray o d) depth = case intersects ray of
...
  r1 <- (2*pi*) <$> erand48 xi
  r2 <- erand48 xi
  r3 <- erand48 xi
  ...
  when (* rp) <$> radiance reflRay depth' xi
  when (* tp) <$> radiance (Ray x tdir) depth' xi
  when (* rp) <$> radiance reflRay depth'
  when (* tp) <$> radiance (Ray x tdir) depth'
```

- 1. D
- 2. All these mutability locations throw in extra RTS code, extra sequencing that blocks the compiler's optimization, and dependency chains.
- 3. Sometimes we need mutability for performance.
- 4. SSA is normal to compilers though.
- 5. We almost start at SSA as a functional language.
- 6. don't break it when you don't have a good reason.

# Removing mutation: eliminate IORef and Data.Vector.Mutable

```
- c <- VM.replicate (w * h) 0
- xi <- newIORef 0
- flip mapM_ [0..h-1] $ \y -> do
-   writeXi xi y
-   for_ [0..w-1] \x -> do
-     let i = (h-y-1) * w + x
-     for_ [0..1] \sy -> do
-       for_ [0..1] \sx -> do
-         r <- newIORef 0
-         for_ [0..samps-1] \_s -> do
-           r1 <- (2*) <$> erand48 xi
+ img = (`concatMap` [(h-1),(h-2)..0]) $ \y -> runWithErand48 y do
+   for [0..w-1] \x -> do
+     (\pf -> foldlM pf 0 [(sy, sx) | sy <- [0,1], sx <- [0,1]]) \ci (sy, sx) -> do
+       Vec rr rg rb <- (\f -> foldlM f 0 [0..samps-1]) \ !r _s -> do
+         r1 <- (2*) <$> erand48
+
+ ...
-       modifyIORef r (+ rad .* recip (fromIntegral samps))
-       ci <- VM.unsafeRead c i
-       Vec rr rg rb <- readIORef r
-       VM.unsafeWrite c i $ ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
+       pure (r + rad .* recip (fromIntegral samps))
+       pure (ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25)
+
+ ...
```

## Optimizing smallpt

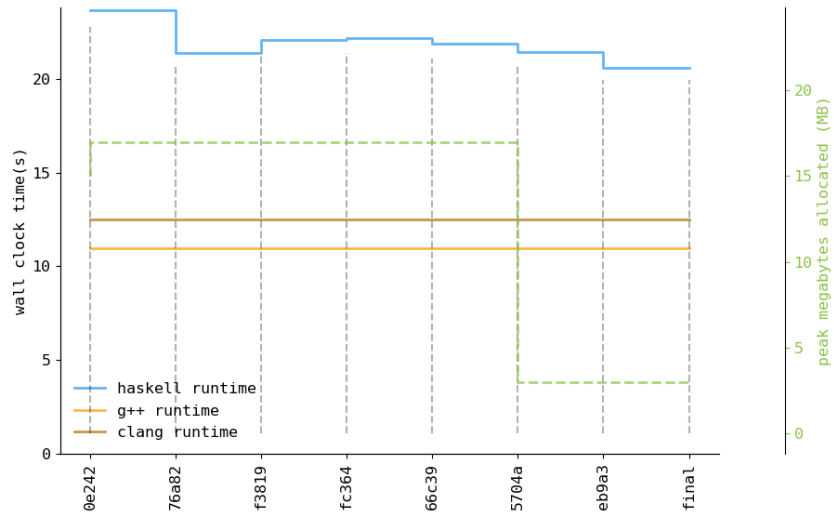
2020-11-05

### Removing mutation: eliminate IORef and Data.Vector.Mutable

```
- w <- VM.replicate (w * h) 0
- xi <- newIORef 0
- flip mapM_ [0..h-1] $ \y -> do
-   writeXi xi y
-   for_ [0..w-1] \x -> do
-     let i = (h-y-1) * w + x
-     for_ [0..1] \sy -> do
-       for_ [0..1] \sx -> do
-         r <- newIORef 0
-         for_ [0..samps-1] \_s -> do
-           r1 <- (2*) <$> erand48 xi
+ img = `concatMap` [(h-1),(h-2)..0] $ \y -> multiWithIORef y do
+   for [0..w-1] \x -> do
+     (\pf -> foldlM pf 0 [(sy, sx) | sy <- [0,1], sx <- [0,1]]) \ci (sy, sx) -> do
+       Vec rr rg rb <- (\f -> foldlM f 0 [0..samps-1]) \ !r _s -> do
+         r1 <- (2*) <$> erand48
+
+ ...
-       modifyIORef r (+ rad .* recip (fromIntegral samps))
-       ci <- VM.unsafeRead c i
-       Vec rr rg rb <- readIORef r
-       VM.unsafeWrite c i $ ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
+       pure (r + rad .* recip (fromIntegral samps))
+       pure (ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25)
+
+ ...
```

## 1. D

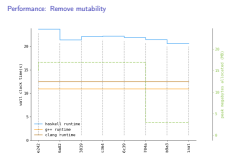
## Performance: Remove mutability



## Optimizing smallpt

2020-11-05

Performance: Remove mutability



# Set everything in smallpt to be strict (1.17x)

```
smallpt :: Int -> Int -> Int -> IO ()
smallpt w h nsamps = do
-   let samps = nsamps `div` 4
-   org = Vec 50 52 295.6
-   dir = norm $ Vec 0 (-0.042612) (-1)
-   cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
-   cy = norm (cx `cross` dir) `mulvs` 0.5135
+   let !samps = nsamps `div` 4
+   !org = Vec 50 52 295.6
+   !dir = norm $ Vec 0 (-0.042612) (-1)
+   !cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
+   !cy = norm (cx `cross` dir) `mulvs` 0.5135
...
-   r1 <- (2*) `fmap` erand48 xi
-   let dx = if r1<1 then sqrt r1-1 else 1-sqrt(2-r1)
-   r2 <- (2*) `fmap` erand48 xi
-   let dy = if r2<1 then sqrt r2-1 else 1-sqrt(2-r2)
-   d = ...
-   rad <- radiance (Ray (org`addv`(d`mulvs`140)) (norm d)) 0 xi
+   !r1 <- (2*) `fmap` erand48 xi
+   let !dx = if r1<1 then sqrt r1-1 else 1-sqrt(2-r1)
+   !r2 <- (2*) `fmap` erand48 xi
+   let !dy = if r2<1 then sqrt r2-1 else 1-sqrt(2-r2)
+   !d = ...
...
+   pure $! r + rad .* recip (fromIntegral samps)
+   pure $! ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
```

## Optimizing smallpt

2020-11-05

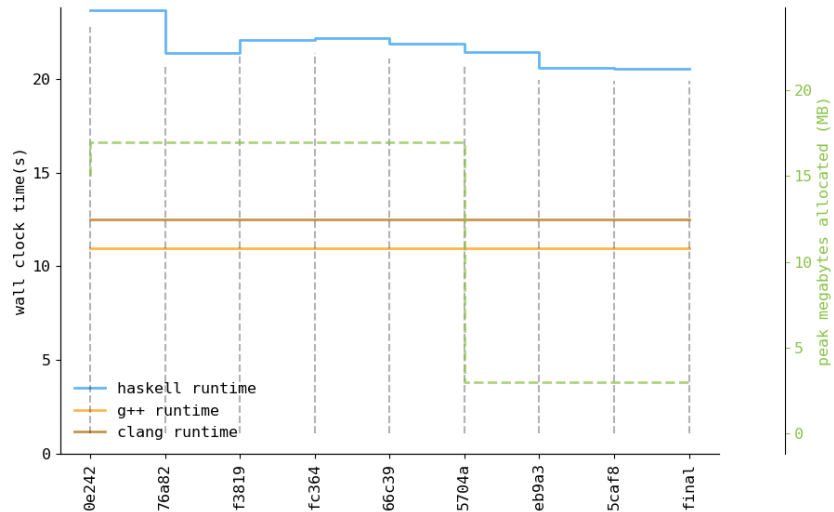
Set everything in smallpt to be strict (1.17x)

```
Set everything in smallpt to be strict (1.17x)
smallpt :: Int -> Int -> Int -> IO ()
smallpt w h nsamps = do
-   let samps = nsamps `div` 4
-   org = Vec 50 52 295.6
-   dir = norm $ Vec 0 (-0.042612) (-1)
-   cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
-   cy = norm (cx `cross` dir) `mulvs` 0.5135
+   let !samps = nsamps `div` 4
+   !org = Vec 50 52 295.6
+   !dir = norm $ Vec 0 (-0.042612) (-1)
+   !cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
+   !cy = norm (cx `cross` dir) `mulvs` 0.5135
...
-   r1 <- (2*) `fmap` erand48 xi
-   let dx = if r1<1 then sqrt r1-1 else 1-sqrt(2-r1)
-   r2 <- (2*) `fmap` erand48 xi
-   let dy = if r2<1 then sqrt r2-1 else 1-sqrt(2-r2)
-   d = ...
-   rad <- radiance (Ray (org`addv`(d`mulvs`140)) (norm d)) 0 xi
+   !r1 <- (2*) `fmap` erand48 xi
+   !dx = if r1<1 then sqrt r1-1 else 1-sqrt(2-r1)
+   !r2 <- (2*) `fmap` erand48 xi
+   !dy = if r2<1 then sqrt r2-1 else 1-sqrt(2-r2)
+   !d = ...
...
+   pure $! r + rad .* recip (fromIntegral samps)
+   pure $! ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
```

Don't senselessly bang everything in sight.

1. D
2. This is not a recommendation, this is a warning.
3. We get a speedup here but it can also regress performance. Some of these bangs are regressions that are hidden.

## Performance: Set **everything** in smallpt to be strict



## Optimizing smallpt

2020-11-05

Performance: Set **everything** in smallpt to be strict



# Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y
```

## Optimizing smallpt

2020-11-05

### Why strictness may be bad

Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y
```

1. **S**
2. Consider the function foo and fooOpt. These are equivalent
3. The fact that x is not used allows us to eliminate computing x
4. Consider the next version
5. Illegal, we need to have x, because it doesn't produce ERR
6. we can't equationally reason about the program anymore.
7. Makes it harder for GHC. GHC is conservative about bangs
8. Inhibits compiler from optimizing

# Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y

let foo' = let !x = error "ERR" in \y -> y
```

## Optimizing smallpt

2020-11-05

### Why strictness may be bad

Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y
let foo' = let !x = error "ERR" in \y -> y
```

1. **S**
2. Consider the function foo and fooOpt. These are equivalent
3. The fact that x is not used allows us to eliminate computing x
4. Consider the next version
5. Illegal, we need to have x, because it doesn't produce ERR
6. we can't equationally reason about the program anymore.
7. Makes it harder for GHC. GHC is conservative about bangs
8. Inhibits compiler from optimizing

# Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y

let foo' = let !x = error "ERR" in \y -> y
let foo'Opt = \y -> y  -- ERROR! forcing foo'=foo'Opt should give "ERR"
```

## Optimizing smallpt

2020-11-05

### Why strictness may be bad

Why strictness may be bad

```
let foo = let x = error "ERR" in \y -> y
let fooOpt = \y -> y
let foo' = let !x = error "ERR" in \y -> y
let foo'Opt = \y -> y  -- ERROR! forcing foo'=foo'Opt should give "ERR"
```

1. S
2. Consider the function foo and fooOpt. These are equivalent
3. The fact that x is not used allows us to eliminate computing x
4. Consider the next version
5. Illegal, we need to have x, because it doesn't produce ERR
6. we can't equationally reason about the program anymore.
7. Makes it harder for GHC. GHC is conservative about bangs
8. Inhibits compiler from optimizing



## Reduce to only useful strictnesses in smallpt(1.17x)

```
- let !samps = nsamps `div` 4
- !org = Vec 50 52 295.6
- !dir = norm $ Vec 0 (-0.042612) (-1)
- !cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
- !cy = norm (cx `cross` dir) .* 0.5135
+ let samps = nsamps `div` 4
+ org = Vec 50 52 295.6
+ dir = norm $ Vec 0 (-0.042612) (-1)
+ cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
+ cy = norm (cx `cross` dir) .* 0.5135
...
- !r1 <- (2*) <$> erand48
+ r1 <- (2*) <$> erand48
...
- !r2 <- (2*) <$> erand48
+ r2 <- (2*) <$> erand48
...
- !rad <- radiance (Ray (org+d.*140) (norm d)) 0
+ rad <- radiance (Ray (org+d.*140) (norm d)) 0
...
- pure $! r + rad .* recip (fromIntegral samps)
- pure $! ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
+ pure (r + rad .* recip (fromIntegral samps))
+ pure (ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25)
```

## Optimizing smallpt

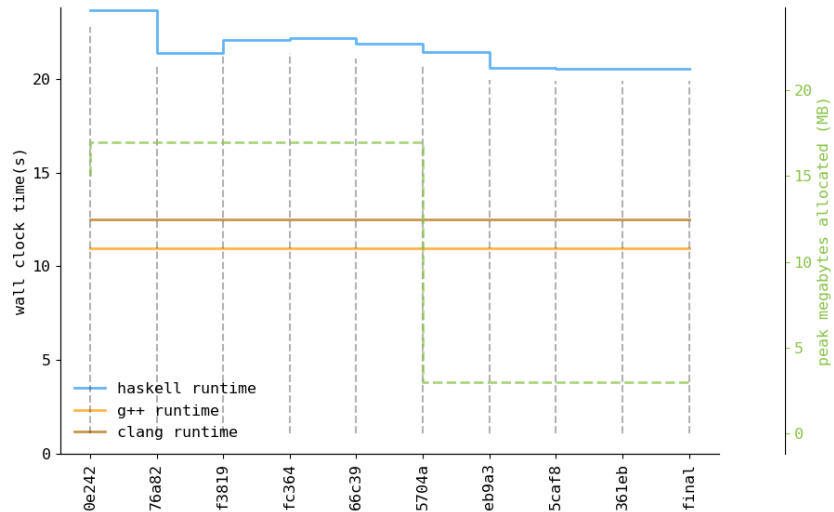
2020-11-05

Reduce to only useful strictnesses in smallpt(1.17x)

```
Reduce to only useful strictnesses in smallpt(1.17x)
- let nsamps = nsamps `div` 4
- !org = Vec 50 52 295.6
- !dir = norm $ Vec 0 (-0.042612) (-1)
- !cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
- !cy = norm (cx `cross` dir) .* 0.5135
+ let nsamps = nsamps `div` 4
+ org = Vec 50 52 295.6
+ dir = norm $ Vec 0 (-0.042612) (-1)
+ cx = Vec (fromIntegral w * 0.5135 / fromIntegral h) 0 0
+ cy = norm (cx `cross` dir) .* 0.5135
...
- !r1 <- (2*) <$> erand48
- !r2 <- (2*) <$> erand48
+ r1 <- (2*) <$> erand48
+ r2 <- (2*) <$> erand48
...
- !rad <- radiance (Ray (org+d.*140) (norm d)) 0
- !rad <- radiance (Ray (org+d.*140) (norm d)) 0
+ rad <- radiance (Ray (org+d.*140) (norm d)) 0
...
- pure $! r + rad .* recip (fromIntegral nsamps)
- pure $! ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25
+ pure (r + rad .* recip (fromIntegral nsamps))
+ pure (ci + Vec (clamp rr) (clamp rg) (clamp rb) .* 0.25)
```

1. D
2. Thus the compiler can no longer move the computation around or simplify it.
3. Force useless work.
4. A little thinking about how the variables are used or looking at core allows us to select which ones we bang selectively.

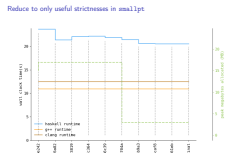
## Reduce to only useful strictnesses in smallpt



## Optimizing smallpt

2020-11-05

Reduce to only useful strictnesses in smallpt



# Use strictness strategically in entire project

```
...
- if det<0 then Nothing else f (b-sdet) (b+sdet)
- where op = p - o
-       eps = 1e-4
-       b = dot op d
-       det = b*b - dot op op + r*r
-       sdet = sqrt det
-       f a s = if a>eps then Just a else if s>eps then Just s else Nothing
+ if det<0
+ then Nothing
+ else
+   let !eps = 1e-4
+       !sdet = sqrt det
+       !a = b-sdet
+       !s = b+sdet
+   in if a>eps then Just a else if s>eps then Just s else Nothing
...
```

## Optimizing smallpt

2020-11-05

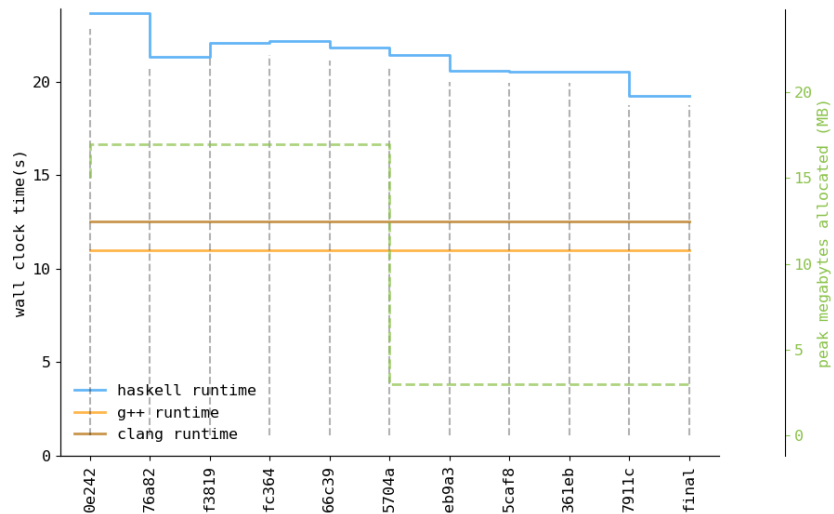
### Use strictness strategically in entire project

```
Use strictness strategically in entire project

...
- if det<0 then Nothing else f (b-sdet) (b+sdet)
- where op = p - o
-       eps = 1e-4
-       b = dot op d
-       det = b*b - dot op op + r*r
-       sdet = sqrt det
-       f a s = if a>eps then Just a else if s>eps then Just s else Nothing
+ if det<0
+ then Nothing
+ else
+   let !eps = 1e-4
+       !sdet = sqrt det
+       !a = b-sdet
+       !s = b+sdet
+   in if a>eps then Just a else if s>eps then Just s else Nothing
...
```

1. **D**
2. Sometimes (point out 'intersect') we have to rearrange the code though when we use bangs.
3. Bangs tell the compiler to make more efficient code, but take away the compiler's options in how to do so.
4. Only take away the compiler's liberties when it's using them poorly.
5. Becomes intuitive.

## Use strictness strategically in entire project



## Optimizing smallpt

2020-11-05

Use strictness strategically in entire project

Use strictness strategically in entire project



## Remove Maybe from intersect(s) (1.32x)

| Old: Use Maybe Double to represent (was-hit?:bool, hit-distance: Double)

| New: use (1/0) to represent not (was-hit?)

-intersect :: Ray -> Sphere -> Maybe Double

+intersect :: Ray -> Sphere -> Double

intersect (Ray o d) (Sphere r p \_e \_c \_refl) =

- if det<0 then Nothing else f (b-sdet) (b+sdet)

+ if det<0 then (1/0.0) else f (b-sdet) (b+sdet)

where op = p `subv` o

...

- f a s = if a>eps then Just a else if s>eps then Just s else Nothing

+ f a s = if a>eps then a else if s>eps then s else (1/0.0)

-intersects :: Ray -> (Maybe Double, Sphere)

+intersects :: Ray -> (Double, Sphere)

intersects ray = (k, s)

- where (k,s) = foldl' f (Nothing,undefined) spheres

- f (k',sp) s' = case (k',intersect ray s') of

- (Nothing,Just x) -> (Just x,s')

- (Just y,Just x) | x < y -> (Just x,s')

- \_ -> (k',sp)

+ where (k,s) = foldl' f (1/0.0,undefined) spheres

+ f (k', sp) s' = let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)

radiance :: Ray -> Int -> STRefU s Word64 -> ST s Vec

radiance ray@(Ray o d) depth xi = case intersects ray of

- (Nothing,\_) -> return zerov

- (Just t,Sphere \_r p e c refl) -> do

+ (t,\_) | t == (1/0.0) -> return zerov

+ (t,Sphere \_r p e c refl) -> do

## Optimizing smallpt

2020-11-05

### Remove Maybe from intersect(s) (1.32x)

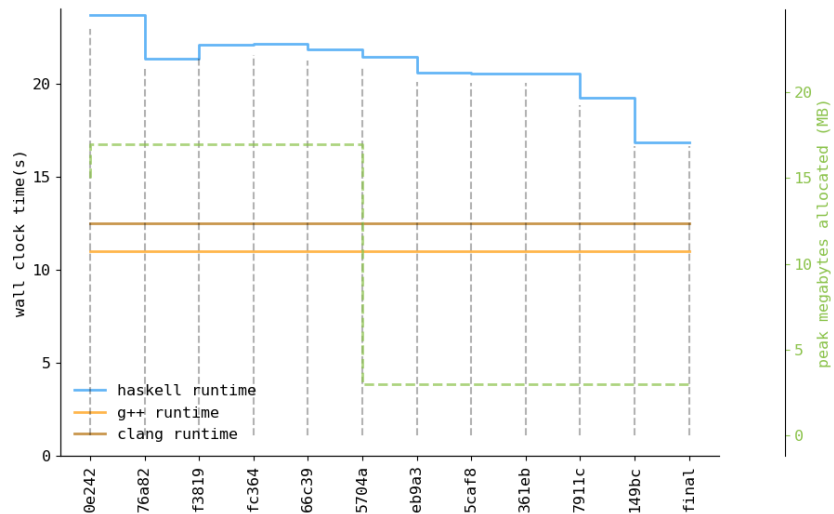
```
Remove Maybe from intersect(s) (1.32x)
| Old: Use Maybe Double to represent (was-hit?:bool, hit-distance: Double)
| New: use (1/0) to represent not (was-hit?)
intersect :: Ray -> Sphere -> Maybe Double
intersect :: Ray -> Sphere -> Double
intersect (Ray o d) (Sphere r p _e _c _refl) =
- if det<0 then Nothing else f (b-sdet) (b+sdet)
+ if det<0 then (1/0.0) else f (b-sdet) (b+sdet)
where op = p `subv` o
...
f a s = if a>eps then Just a else if s>eps then Just s else Nothing
f a s = if a>eps then a else if s>eps then s else (1/0.0)

intersects :: Ray -> (Maybe Double, Sphere)
intersects :: Ray -> (Double, Sphere)
intersects ray = (k, s)
where (k,s) = foldl' f (Nothing,undefined) spheres
f (k',sp) s' = case (k',intersect ray s') of
- (Nothing,Just x) -> (Just x,s')
- (Just y,Just x) | x < y -> (Just x,s')
- _ -> (k',sp)
+ where (k,s) = foldl' f (1/0.0,undefined) spheres
+ f (k', sp) s' = let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)

radiance :: Ray -> Int -> STRefU s Word64 -> ST s Vec
radiance ray@(Ray o d) depth xi = case intersects ray of
- (Nothing,_) -> return zerov
- (Just t,Sphere _r p e c refl) -> do
+ (t,_) | t == (1/0.0) -> return zerov
+ (t,Sphere _r p e c refl) -> do
```

1. S
2. This is a far more performance critical version of what we saw with 'maximum' vs. 'max'.
3. innermost functions are of critical importance. remove Maybe which significantly reduces the boxing
4. Since a Ray that fails to intersect something can be said to intersect at infinity, Double already actually covers the structure at play
5. This also reduces allocation.

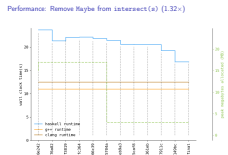
# Performance: Remove Maybe from intersect(s) (1.32×)



## Optimizing smallpt

2020-11-05

Performance: Remove Maybe from intersect(s) (1.32×)



# Hand unroll the fold in intersects (1.35x)

```
intersects :: Ray -> (Double, Sphere)
-intersects ray = (k, s)
-  where (k,s) = foldl' f (1/0.0,undefined) spheres
+intersects ray =
+  f (... (f (f (intersect ray sphLeft, sphLeft) sphRight) ...)
+  where
    f (k', sp) s' = let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)

-spheres :: [Sphere]
-spheres = let s = Sphere ; z = zeroV ; (.*) = mulvs ; v = Vec in
-  [ s 1e5 (v (1e5+1) 40.8 81.6)    z (v 0.75 0.25 0.25) DIFF --Left
-  , s 1e5 (v (-1e5+99) 40.8 81.6)   z (v 0.25 0.25 0.75) DIFF --Rght
-  ...

+sphLeft, sphRight, ... :: Sphere
+sphLeft  = Sphere 1e5  (Vec (1e5+1) 40.8 81.6)    zeroV (Vec 0.75 0.25 0.25) DIFF
+sphRight = Sphere 1e5  (Vec (-1e5+99) 40.8 81.6)   zeroV (Vec 0.25 0.25 0.75) DIFF
+...
```

## Optimizing smallpt

2020-11-05

### Hand unroll the fold in intersects (1.35x)

```
Hand unroll the fold in intersects (1.35x)

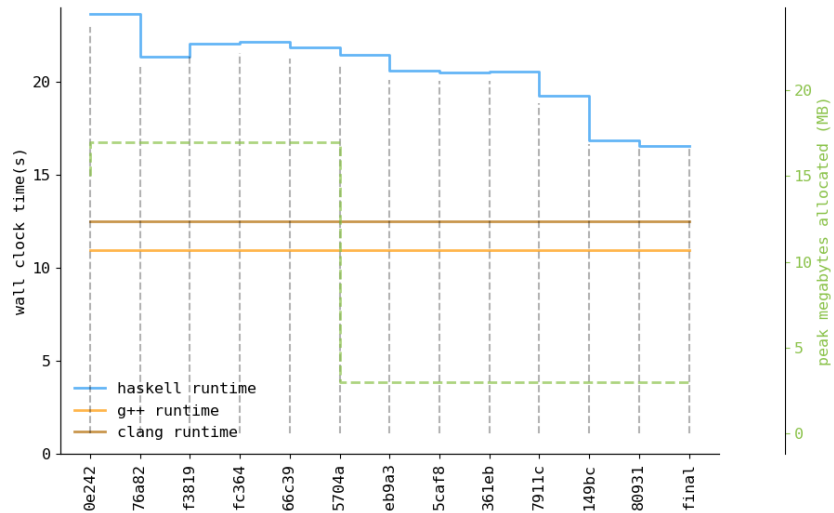
intersects :: Ray -> (Double, Sphere)
-intersects ray = (k, s)
-  where (k,s) = foldl' f (1/0.0,undefined) spheres
+intersects ray =
+  f (... (f (f (intersect ray sphLeft, sphLeft) sphRight) ...)
+  where
    f (k', sp) s' = let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)

-spheres :: [Sphere]
-spheres = let s = Sphere ; z = zeroV ; (.*) = mulvs ; v = Vec in
-  [ s 1e5 (v (1e5+1) 40.8 81.6)    z (v 0.75 0.25 0.25) DIFF --Left
-  , s 1e5 (v (-1e5+99) 40.8 81.6)   z (v 0.25 0.25 0.75) DIFF --Rght
-  ...

+sphLeft, sphRight, ... :: Sphere
+sphLeft  = Sphere 1e5  (Vec (1e5+1) 40.8 81.6)    zeroV (Vec 0.75 0.25 0.25) DIFF
+sphRight = Sphere 1e5  (Vec (-1e5+99) 40.8 81.6)   zeroV (Vec 0.25 0.25 0.75) DIFF
+...
```

1. D
2. 'intersects' is very hot
3. Loop unrolling
4. Many compilers do this for us, and there are special versions of it like Duff's Device.
5. Sadly GHC doesn't
6. Can do variants by hand.
7. RULE could handle each one specifically (only exactly that one)?

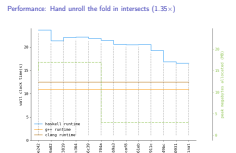
## Performance: Hand unroll the fold in intersects (1.35 $\times$ )



## Optimizing smallpt

2020-11-05

Performance: Hand unroll the fold in intersects (1.35 $\times$ )





# Custom datatype for intersects parameter passing

Old: Tuple with possibly-unevaluated Double and Sphere

New: Reference to a guaranteed-to-be-evaluated Double and Sphere

```
-intersects :: Ray -> (Double, Sphere)
```

```
+data T = T !Double !Sphere
```

```
+
```

```
+intersects :: Ray -> T
```

```
  intersects ray =  
-   f ( ... f (intersect ray sphLeft, sphLeft) sphRight) ... sphLite  
+   f ( ... f (T (intersect ray sphLeft) sphLeft) sphRight) ... sphLite  
  where  
-   f (k', sp) s' =  
-       let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)  
+   f !(T k' sp) !s' =  
+       let !x = intersect ray s' in if x < k' then T x s' else T k' sp
```

```
radiance :: Ray -> Int -> Erand48 Vec  
radiance ray@(Ray o d) depth = case intersects ray of  
-  (!t,_) | t == 1/0.0 -> return 0  
-  (!t,!Sphere _r p e c refl) -> do  
+  (T t _) | t == 1/0.0 -> return 0  
+  (T t (Sphere _r p e c refl)) -> do  
    let !x = o + d .* t  
        !n = norm $ x - p  
        !nl = if dot n d < 0 then n else negate n
```

## Optimizing smallpt

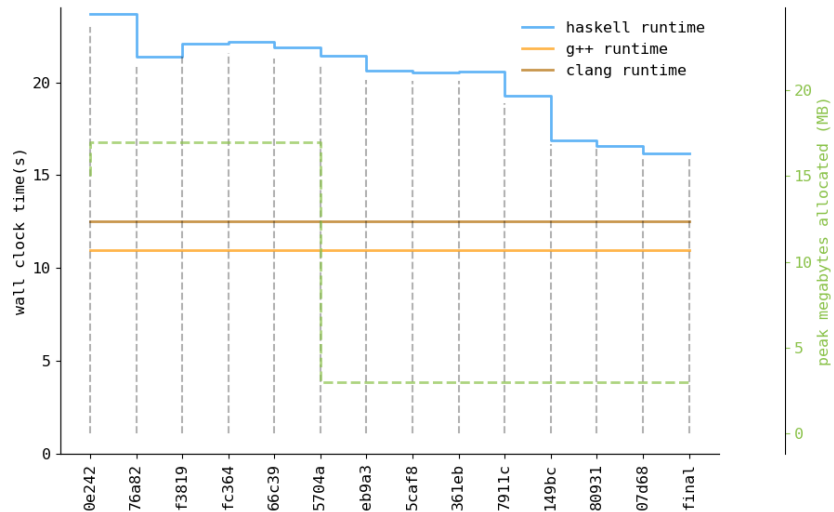
2020-11-05

### Custom datatype for intersects parameter passing

```
Old: Tuple with possibly-unevaluated Double and Sphere  
New: Reference to a guaranteed-to-be-evaluated Double and Sphere  
-intersects :: Ray -> (Double, Sphere)  
+data T = T !Double !Sphere  
+  
+intersects :: Ray -> T  
+intersects ray =  
+  f (...) f (intersect ray sphLeft, sphLeft) sphRight) ... sphLite  
+  where  
+    f (k', sp) s' =  
+      let !x = intersect ray s' in if x < k' then (x, s') else (k', sp)  
+    f !(T k' sp) !s' =  
+      let !x = intersect ray s' in if x < k' then T x s' else T k' sp  
  
radiance :: Ray -> Int -> Erand48 Vec  
radiance ray@(Ray o d) depth = case intersects ray of  
-  (!t,_) | t == 1/0.0 -> return 0  
-  (!t,!Sphere _r p e c refl) -> do  
+  (T t _) | t == 1/0.0 -> return 0  
+  (T t (Sphere _r p e c refl)) -> do  
    let !x = o + d .* t  
        !n = norm $ x - p  
        !nl = if dot n d < 0 then n else negate n
```

1. D
2. We can optimize data passing.
3. Want: Data strict, but not unpacked.
4. Compiler knows its evaluated but no copying
5. A normal tuple lacks strictness information.
6. An unboxed tuple forces copying
7. Strict Tuple.
8. This exists in libraries of course, but we wanted to illustrate it.

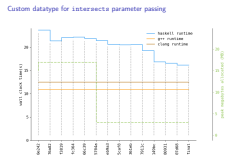
## Custom datatype for intersects parameter passing



## Optimizing smallpt

2020-11-05

Custom datatype for intersects parameter passing



# Optimize file writing

build-depends:

base >= 4.12 && < 4.15

+ , bytestring ^>= 0.11

-toInt :: Double -> Int

-toInt x = floor \$ clamp x \*\* recip 2.2 \* 255 + 0.5

+toInt :: Double -> BB.Builder -- O(1) concatenation

+toInt x = BB.intDec (floor (clamp x \*\* recip 2.2 \* 255 + 0.5)) <> BB.char8 ' ' ' '

...

withFile "image.ppm" WriteMode \$ \hdl -> do

- hPrintf hdl "P3\n%d %d\n%d\n" w h (255::Int)

- for\_ img \(Vec r g b) -> do

- hPrintf hdl "%d %d %d " (toInt r) (toInt g) (toInt b)

+ BB.hPutBuilder hdl \$

+ BB.string8 "P3\n" <> -- efficient builders for ASCII

+ BB.intDec w <> BB.char8 ' ' <> BB.intDec h <> BB.char8 '\n' <>

+ BB.intDec 255 <> BB.char8 '\n' <>

+ (mconcat \$ fmap \(Vec r g b) -> toInt r <> toInt g <> toInt b) img)

## Optimizing smallpt

2020-11-05

### Optimize file writing

Optimize file writing

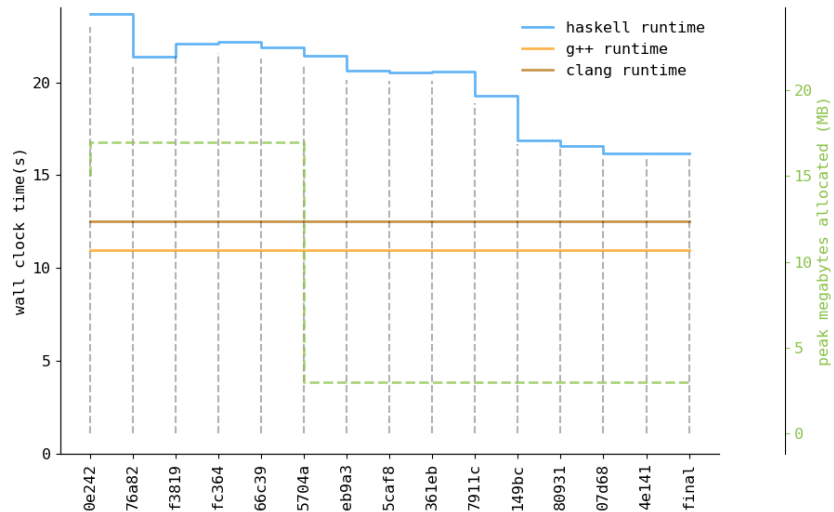
```
build-depends:
  base >= 4.12 && < 4.15
+ , bytestring ^>= 0.11

- toInt :: Double -> Int
- toInt x = floor $ clamp x ** recip 2.2 * 255 + 0.5
+ toInt :: Double -> BB.Builder -- O(1) concatenation
+ toInt x = BB.intDec (floor (clamp x ** recip 2.2 * 255 + 0.5)) <> BB.char8 ' '
...

withFile "image.ppm" WriteMode $ \hdl -> do
- hPrintf hdl "P3\n%d %d\n%d\n" w h (255::Int)
- for_ img \(Vec r g b) -> do
-   hPrintf hdl "%d %d %d " (toInt r) (toInt g) (toInt b)
+ BB.hPutBuilder hdl $
+   BB.string8 "P3\n" <> -- efficient builders for ASCII
+   BB.intDec w <> BB.char8 ' ' <> BB.intDec h <> BB.char8 '\n' <>
+   BB.intDec 255 <> BB.char8 '\n' <>
+   (mconcat $ fmap \(Vec r g b) -> toInt r <> toInt g <> toInt b) img)
```

1. D
2. Strings are inefficient
3. 'bytestring' has some efficient writing code, so we just convert to that for a modest gain.

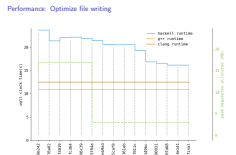
## Performance: Optimize file writing



## Optimizing smallpt

2020-11-05

Performance: Optimize file writing



Use LLVM backend (1.87x)

```
+package smallpt-opt
+ ghc-options: -fllvm
```

## Optimizing smallpt

2020-11-05

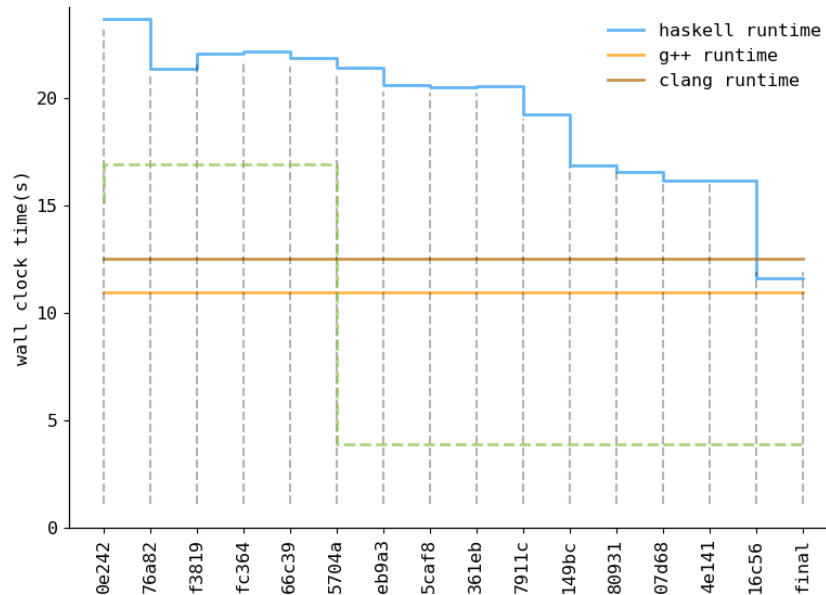
└ Use LLVM backend (1.87x)

Use LLVM backend (1.87x)

```
+package smaller-opt
+ ghc-options: -fllvm
```

1. **S**
2. Finally, this particular code is quite numeric heavy.
3. There are optimizations for numeric heavy code we're missing in GHC.
4. LLVM has an extensive library of laws to optimize low level numeric ops.
5. LLVM is too low-level to understand haskell as haskell.
6. LLVM makes decisions with the tacit assumption that the assembly came from a C-like language, which is often to the detriment of a Haskell-like language.
7. In this case, as the code is "fortran-like", LLVM wins.

# The view from the mountaintop



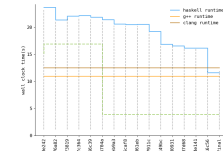
## Optimizing smallpt

2020-11-05

The view from the mountaintop

1. D

The view from the mountaintop



## Avoid CPU ieee754 slow paths

```
intersect :: Ray -> Sphere -> Double
intersect (Ray o d) (Sphere r p _e _c _refl) =
    if det<0
-   then 1/0.0
+   then 1e20
    else
        ...
-   in if a>eps then a else if s>eps then s else 1/0.0
+   in if a>eps then a else if s>eps then s else 1e20

...

radiance :: Ray -> Int -> Erand48 Vec
radiance ray@(Ray o d) depth = case intersects ray of
-   (T t _) | t == 1/0.0 -> return 0
+   (T 1e20 _) -> return 0
    ...
```

## Optimizing smallpt

2020-11-05

### Avoid CPU ieee754 slow paths

Avoid CPU ieee754 slow paths

```
intersect :: Ray -> Sphere -> Double
intersect (Ray o d) (Sphere r p _e _c _refl) =
    if det<0
-   then 1/0.0
+   then 1e20
    else
        ...
-   in if a>eps then a else if s>eps then s else 1/0.0
+   in if a>eps then a else if s>eps then s else 1e20

...

radiance :: Ray -> Int -> Erand48 Vec
radiance ray@(Ray o d) depth = case intersects ray of
-   (T t _) | t == 1/0.0 -> return 0
+   (T 1e20 _) -> return 0
    ...
```

1. D
2. We used +Inf to match the Maybeness
3. C++ code set 1e20 s the horizon
4. Mechanical sympathy is important.
5. Know how the CPU (abstractly) executes - slow path / fast path.

## Fix differences with C++ version

```
-         if depth>2
+         if depth'>2 -- depth' = depth + 1
...
```

## Optimizing smallpt

2020-11-05

### Fix differences with C++ version

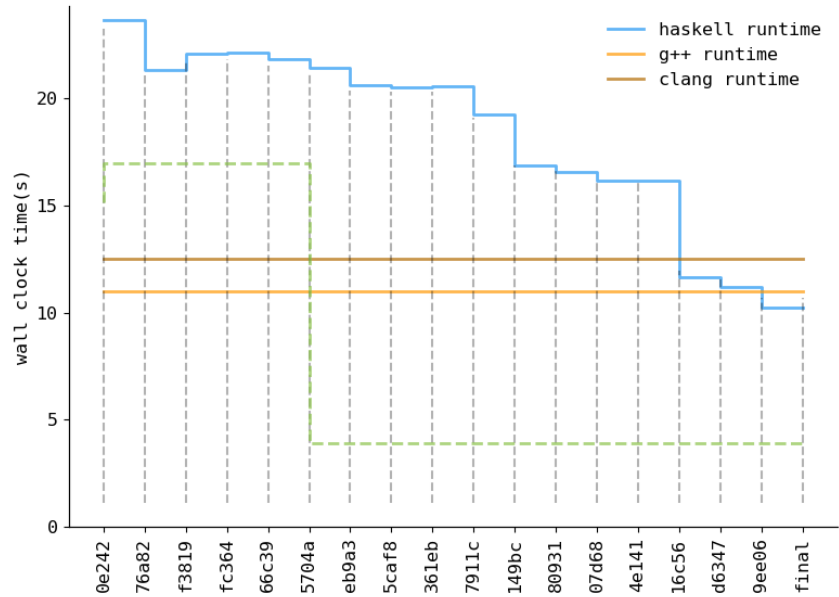
Fix differences with C++ version

```
-         if depth>2
+         if depth'>2 -- depth' = depth + 1
...
```

1. **S**
2. Since the sha1 of the output didn't match the C++ version we started investigating.
3. clang++, g++ actually produce different sha1s
4. unincremented depth was being used in one branch, causing us to do more work
5. now confident to say we're doing the same computation as C++



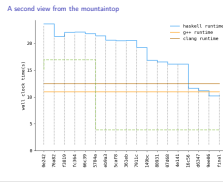
## A second view from the mountaintop



## Optimizing smallpt

2020-11-05

A second view from the mountaintop



## Takeaways

- ▶ The unrolling in 'intersects' is ugly.
- ▶ (We feel) the maintainability of this code hasn't been significantly harmed.
- ▶ We're faster than clang++ and within 6% of g++
- ▶ Haven't exhausted the optimization opportunities.
- ▶ GHC could learn to do several of these optimizations for us.
- ▶ Others are just good Haskell style.
- ▶ Clean Haskell is often performant Haskell.
- ▶ Repository stepping through each optimization is available at ...

## Takeaways

## Takeaways

- ▶ The unrolling in `interacts` is ugly.
- ▶ (We feel) the maintainability of this code hasn't been significantly harmed.
- ▶ We're faster than `clang++` and within 6% of `g++`.
- ▶ Haven't exhausted the optimization opportunities.
- ▶ GHC could learn to do several of these optimizations for us.
- ▶ Others are just good Haskell style.
- ▶ Clean Haskell is often performant Haskell.
- ▶ Repository stepping through each optimization is available at ...

1. D

## Raw data

- All test were on an otherwise idle Equinix Metal c3.small.x86 (Intel Xeon E-2278G with 32GiB RAM, Ubuntu 20.04).

0e242	23.6586	23.658	23.7251	23.6954	23.676	23.656	23.673	23.7139	23.6598	23.7641
76a82	21.3573	21.384	21.3516	21.3304	21.3658	21.3776	21.3564	21.3843	21.3401	21.3683
f3819	22.1036	22.0754	22.1034	22.0864	22.0692	22.1004	22.0584	22.1181	22.0728	22.0972
fc364	22.1211	22.114	22.1205	22.1101	23.0621	22.1101	22.1163	22.133	22.1491	22.1464
66c39	21.8626	21.8684	21.8977	21.9043	21.893	21.8483	21.8335	21.8869	21.8848	21.8335
5704a	21.4682	21.4692	21.4411	21.473	21.4783	21.4613	21.4818	21.4507	21.4388	21.4933
eb9a3	20.6134	20.6014	20.6527	20.596	20.6034	20.6174	20.5965	20.594	20.5967	20.5892
5caf8	20.5209	20.535	20.5312	20.5289	20.5338	20.5717	20.5387	20.5386	20.5262	20.5488
361eb	20.5551	20.5485	20.5602	20.552	20.5668	20.555	20.5573	20.5564	20.5599	20.5823
7911c	19.2532	19.2664	19.2955	19.2565	19.2517	19.2722	19.3284	19.2611	19.2623	19.2596
149bc	16.8551	16.8551	16.8788	16.9067	16.8683	16.8685	16.8651	16.9186	16.8589	16.8604
80931	16.5752	16.5739	16.5831	16.5918	16.5678	16.5785	16.6128	16.5682	16.5816	16.577
07d68	16.1819	16.1672	16.1829	16.2267	16.1716	16.1854	16.1806	16.1949	16.1917	16.1784
4e141	16.2206	16.1816	16.2002	16.1799	16.1813	16.1781	16.1929	16.243	16.1705	16.1877
16c56	11.6334	11.6166	11.6837	11.6504	11.6227	11.6135	11.5949	11.5966	11.6013	11.64
d6347	11.1632	11.218	11.1741	11.1802	11.1849	11.1755	11.1729	11.2155	11.1718	11.2089
9ee06	10.2131	10.2154	10.1994	10.2105	10.2028	10.2344	10.2008	10.2497	10.2226	10.3042
gcc	10.97	10.97	10.97	10.99	10.98	10.97	10.97	10.98	10.98	10.98
clang	12.53	12.51	12.5	12.53	12.51	12.5	12.52	12.48	12.53	12.52

## Optimizing smallpt

2020-11-05

- Raw data

Raw data

► All test were on a otherwise idle Equinox Metal c3.small.x86 (Intel Xeon E-2279D with 32GiB RAM, Ubuntu 20.04).

[illegible]