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# Computer graphics III

## Path tracing

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# Tracing paths from the (pinhole) camera


```
renderImage()  
{  
  for all pixels  
  {  
    Spectrum pixelColor = (0,0,0);  
    for k = 1 to N  
    {  
       $\omega_k$  := random direction through the pixel  
      pixelColor += estimateLin(cameraPosition,  $\omega_k$ )  
    }  
    pixelColor /= N;  
    writePixel(k, pixelColor);  
  }  
}
```

# Tracing paths from the (pinhole) camera

- For progressive rendering, swap the loop nesting:

```
renderImage ()
{
    for k = 1 to N // rendering "passes"
    {
        for all pixels
        {
            Spectrum pixelColor = (0,0,0);
            ...
        }
    }
}
```

# Path tracing, v. 0.1



```
estimateLin ( $x, \omega$ ): // radiance incident at  $x$  from direction  $\omega$   
   $y = \text{findNearestIntersection}(x, \omega)$   
  if (no intersection)  
    return  $\text{backgroud.getLe}(y, -\omega)$  // emitted radiance from envmap  
  else  
    return  $\text{getLe}(y, -\omega) +$  // emitted radiance (if  $y$  is on a light)  
           $\text{estimateLrefl}(y, -\omega)$  // reflected radiance
```

```
estimateLrefl( $x, \omega_{\text{out}}$ ):  
  [ $\omega_{\text{in}}, \text{pdf}$ ] =  $\text{genRandomDir}(x, \omega_{\text{out}})$ ; // e.g. BRDF imp. sampling  
  return  $\text{estimateLin}(x, \omega_{\text{in}}) * \text{brdf}(x, \omega_{\text{in}}, \omega_{\text{out}}) * \text{dot}(\mathbf{n}_x, \omega_{\text{in}}) / \text{pdf}$ 
```

# Path Tracing – Loop version

- Path tracing only has tail recursion
  - Can be unrolled into a loop for better efficiency
- New feature: “Russian Roulette” for unbiased path termination

```

estimateLin(x, omegaInAtX) // radiance incident at "x" from the direction "omegaInAtX"
{
    // ("omegaInAtX" is pointing *away* from "x")
    Spectrum throughput = (1,1,1)
    Spectrum accum = (0,0,0)
    while(1)
    {
        hit = findNearestIntersection(x, omegaInAtX)

        if noIntersection(hit) // ray leaves the scene - it "hits" the background
            return accum + throughput * bkgLight.getLe(x, - omegaInAtX)

        omegaOut := -omegaInAtX // omegaOut at hit.pos
        if isOnLightSource(hit) // ray happened to directly hit a light source
            accum += throughput * getLe(hit.pos, omegaOut) // "pick up" emission
        // now estimate the reflected radiance
        [omegaIn, pdfIn] := generateRandomDir(hit) // omegaIn at hit.pos
        throughput *= 1/pdfIn * brdf(hit.pos, omegaIn, omegaOut) * dot(hit.n, omegaIn)

        x := hit.pos // "recursion"
        omegaInAtX := omegaIn // "recursion"

    }
    return accum;
}

```

```

estimateLin(x, omegaInAtX) // radiance incident at "x" from the direction "omegaInAtX"
{
    // ("omegaInAtX" is pointing *away* from "x")
    Spectrum throughput = (1,1,1)
    Spectrum accum = (0,0,0)
    while(1)
    {
        hit = findNearestIntersection(x, omegaInAtX)

        if noIntersection(hit) // ray leaves the scene - it "hits" the background
            return accum + throughput * bkgLight.getLe(x, - omegaInAtX)

        omegaOut := -omegaInAtX // omegaOut at hit.pos
        if isOnLightSource(hit) // ray happened to directly hit a light source
            accum += throughput * getLe(hit.pos, omegaOut) // "pick up" emission
        // now estimate the reflected radiance
        [omegaIn, pdfIn] := generateRandomDir(hit) // omegaIn at hit.pos
        throughput *= 1/pdfIn * brdf(hit.pos, omegaIn, omegaOut) * dot(hit.n, omegaIn)

        survivalProb = min(1, throughput.maxComponent())
        if rand() < survivalProb // Russian Roulette - survive (reflect)
            throughput /= survivalProb
            x := hit.pos // "recursion"
            omegaInAtX := omegaIn // "recursion"
        else // terminate the path - break the while loop
            break;
    }
    return accum;
}

```

# Terminating paths – Russian roulette

- Continue the path with probability  $q$
- Multiply weight (throughput) of surviving paths by  $1 / q$

$$Z = \begin{cases} Y / q & \text{if } \xi < q \\ 0 & \text{otherwise} \end{cases}$$

- RR is unbiased!

$$E[Z] = \frac{E[Y]}{q} \cdot q + 0 \cdot \frac{1}{q-1} = E[Y]$$



# Survival probability

- It makes sense to use the surface reflectance  $\rho$  as the survival probability
  - If the surface reflects only 30% of light energy, we continue with the probability of 30%. That's how light behaves in physical reality.

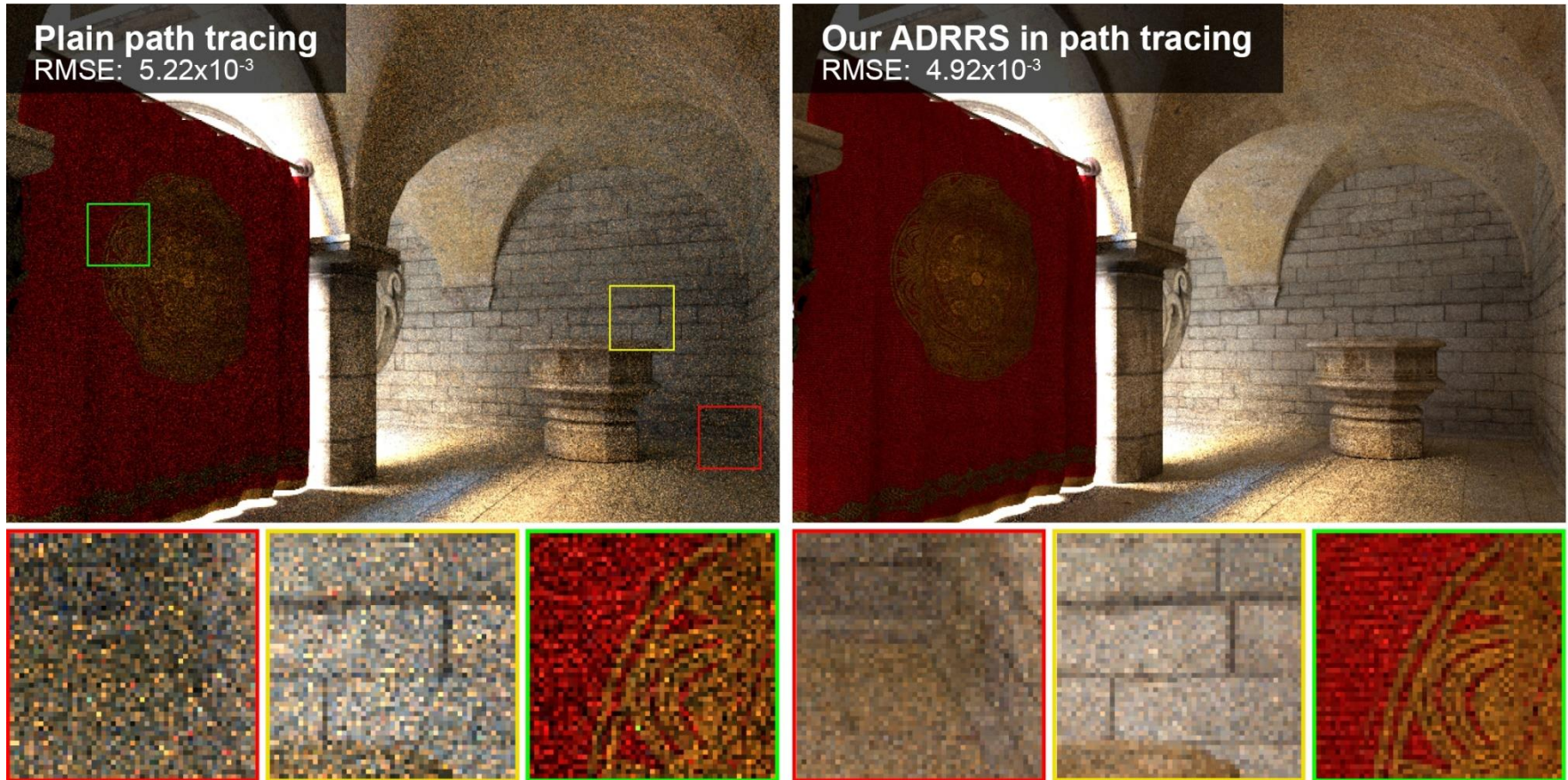
# Survival probability

- What if we cannot calculate  $\rho$ ? Then there's a convenient alternative, which in fact works even better:
  1. First sample a random direction  $\omega_{\text{in}}$  according to  $pdf(\omega_{\text{in}})$
  2. Update the path throughput
  3. Use the updated throughput as the survival probability
- If direction sampling  $pdf(\omega_{\text{in}})$  is exactly proportional to  $BRDF \cdot \cos$ , the above strategy turns out to be exactly equivalent to setting survival probability to the surface reflectance (*prove this*).

# Survival probability

- Our work: Adjoint-driven Russian Roulette & Splitting [Vorba & Křivánek 2016]
  - Weight the survival probability by the expected path contribution
    - If we enter a bright region, continue path even if throughput might be low
    - If we enter a dark region, kill the path even if throughput might be high
  - If the “survival probability” ends up  $> 1$ , split the path

# Adjoint-drive RR and splitting



Vorba and Křivánek. **Adjoint-Driven Russian Roulette and Splitting in Light Transport Simulation.** *ACM SIGGRAPH 2016*

```

estimateLin(x, omegaInAtX) // radiance incident at "x" from the direction "omegaInAtX"
{
    // ("omegaInAtX" is pointing *away* from "x")
    Spectrum throughput = (1,1,1)
    Spectrum accum = (0,0,0)
    while(1)
    {
        hit = findNearestIntersection(x, omegaInAtX)

        if noIntersection(hit) // ray leaves the scene - it "hits" the background
            return accum + throughput * bkgLight.getLe(x, - omegaInAtX)

        omegaOut := -omegaInAtX // omegaOut at hit.pos
        if isOnLightSource(hit) // ray happened to directly hit a light source
            accum += throughput * getLe(hit.pos, omegaOut) // "pick up" emission
        // now estimate the reflected radiance
        [omegaIn, pdfIn] := generateRandomDir(hit) // omegaIn at hit.pos
        throughput *= 1/pdfIn * brdf(hit.pos, omegaIn, omegaOut) * dot(hit.n, omegaIn)

        survivalProb = min(1, throughput.maxComponent())
        if rand() < survivalProb // Russian Roulette - survive (reflect)
            throughput /= survivalProb
            x := hit.pos // "recursion"
            omegaInAtX := omegaIn // "recursion"
        else // terminate the path - break the while loop
            break;
    }
    return accum;
}

```

# Direction sampling – genRandomDir()

- We usually sample the direction  $\omega_{\text{in}}$  from a pdf similar to

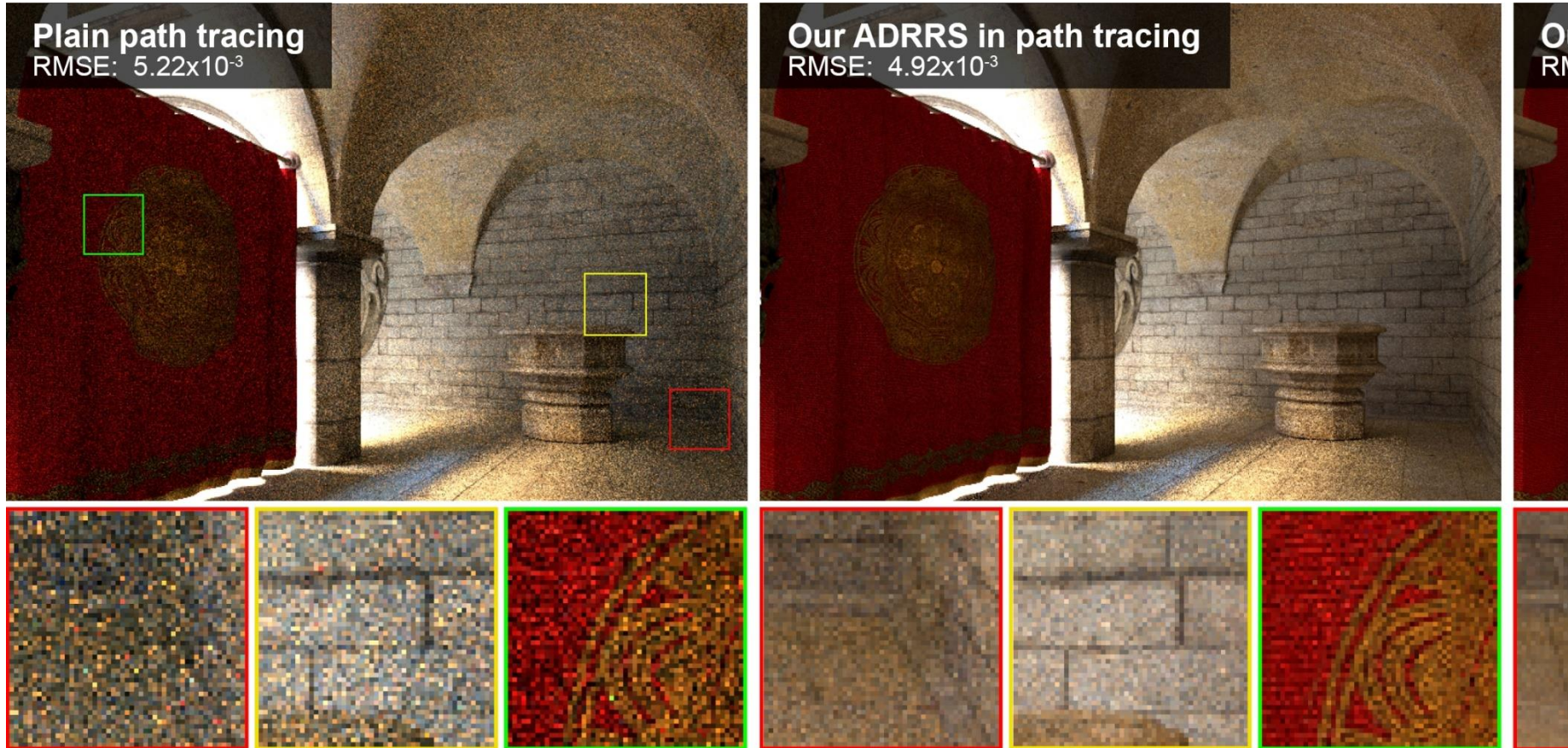
$$f_r(x, \omega_{\text{in}} \rightarrow \omega_{\text{out}}) \cos \theta_{\text{in}}$$

- Ideally, we would want to sample proportionally to the integrand itself

$$L_{\text{in}}(x, \omega_{\text{in}}) f_r(x, \omega_{\text{in}} \rightarrow \omega_{\text{out}}) \cos \theta_{\text{i}},$$

but this is difficult, because we do not know  $L_{\text{in}}$  upfront. With some precomputation, it is possible to use a rough estimate of  $L_{\text{in}}$  for sampling [Jensen 95, Vorba et al. 2014]. This is called “path guiding”.

# Path guiding



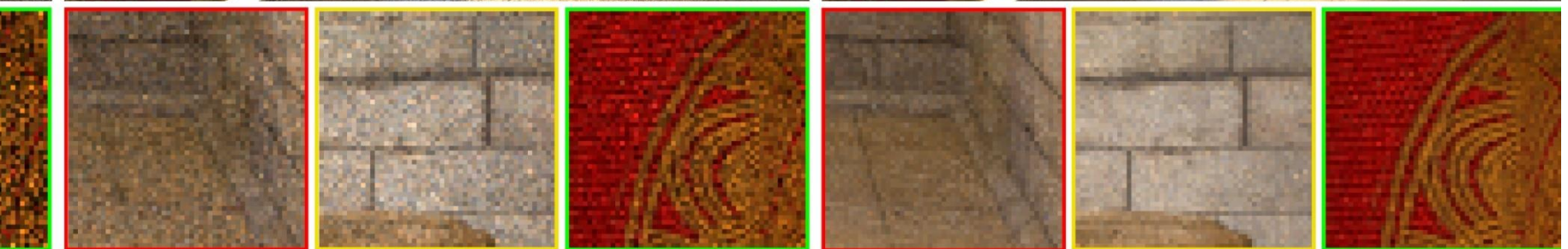
Vorba, Karlík, Šik, Ritschel, and Křivánek. **On-line Learning of Parametric Mixture Models for Light Transport Simulation.** *ACM SIGGRAPH 2014*

# Path guiding

Our ADRRS in path tracing  
RMSE:  $4.92 \times 10^{-3}$



Our ADRRS with path guiding in path tracing  
RMSE:  $2.75 \times 10^{-3}$



Vorba, Karlík, Šik, Ritschel, and Křivánek. **On-line Learning of Parametric Mixture Models for Light Transport Simulation.** *ACM SIGGRAPH 2014*



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# **Direct illumination calculation in a path tracer**

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# Direct illumination: Two strategies

- At each path vertex, we are calculating **direct illumination**
  - i.e. radiance reflected from the surface point exclusively due to the light coming *directly* from the light sources
- Two sampling strategies
  1. **Explicit light source sampling**  
(“next event estimation”)
  2. **BRDF-proportional sampling**  
(already in the above code)

# The use of MIS in a path tracer

- At each path vertex do both:
  - **Explicit light source sampling**
    - Generate point on light source & cast shadow ray
  - **BRDF-proportional sampling**
    - One ray can be shared for the calculation of both **direct** and **indirect** illumination
    - But the MIS weight is applied only on the direct term (indirect illumination is added unweighted because there is no alternative technique to calculate it)

# Dealing with multiple light sources

- Option 1:
  1. Loop over all sources and send a shadow ray to each one
- Option 2:
  1. Choose one source at random (ideally with prob proportional to light contribution)
  2. Sample illumination only on the chosen light, divide the result by the prob of picking that light
  - (Scales better with many sources but has higher variance per path)
- Beware: The probability of choosing a light influences the sampling pds and therefore also the MIS weights.

# Learning the lights' contributions



Vévoda, Kondapaneni, Křivánek. **Bayesian online regression for adaptive direct illumination sampling.** *ACM SIGGRAPH 2018*

# Learning the lights' contributions



Vévoda, Kondapaneni, Křivánek. **Bayesian online regression for adaptive direct illumination sampling.** *ACM SIGGRAPH 2018*