

# Path Tracing I



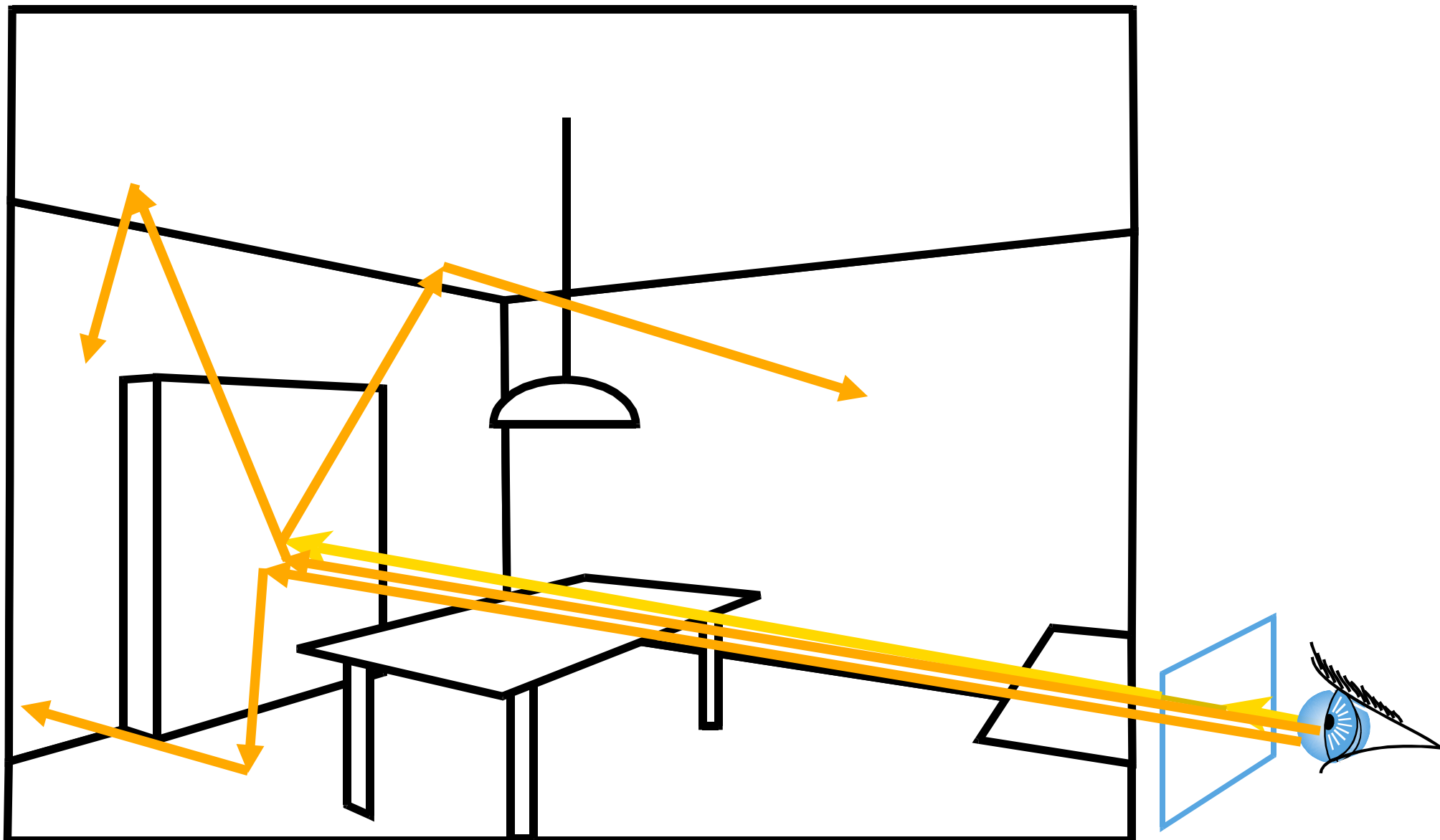
Aalto CS-E5520 Spring 2023  
Jaakko Lehtinen



# Monte Carlo Path Tracing

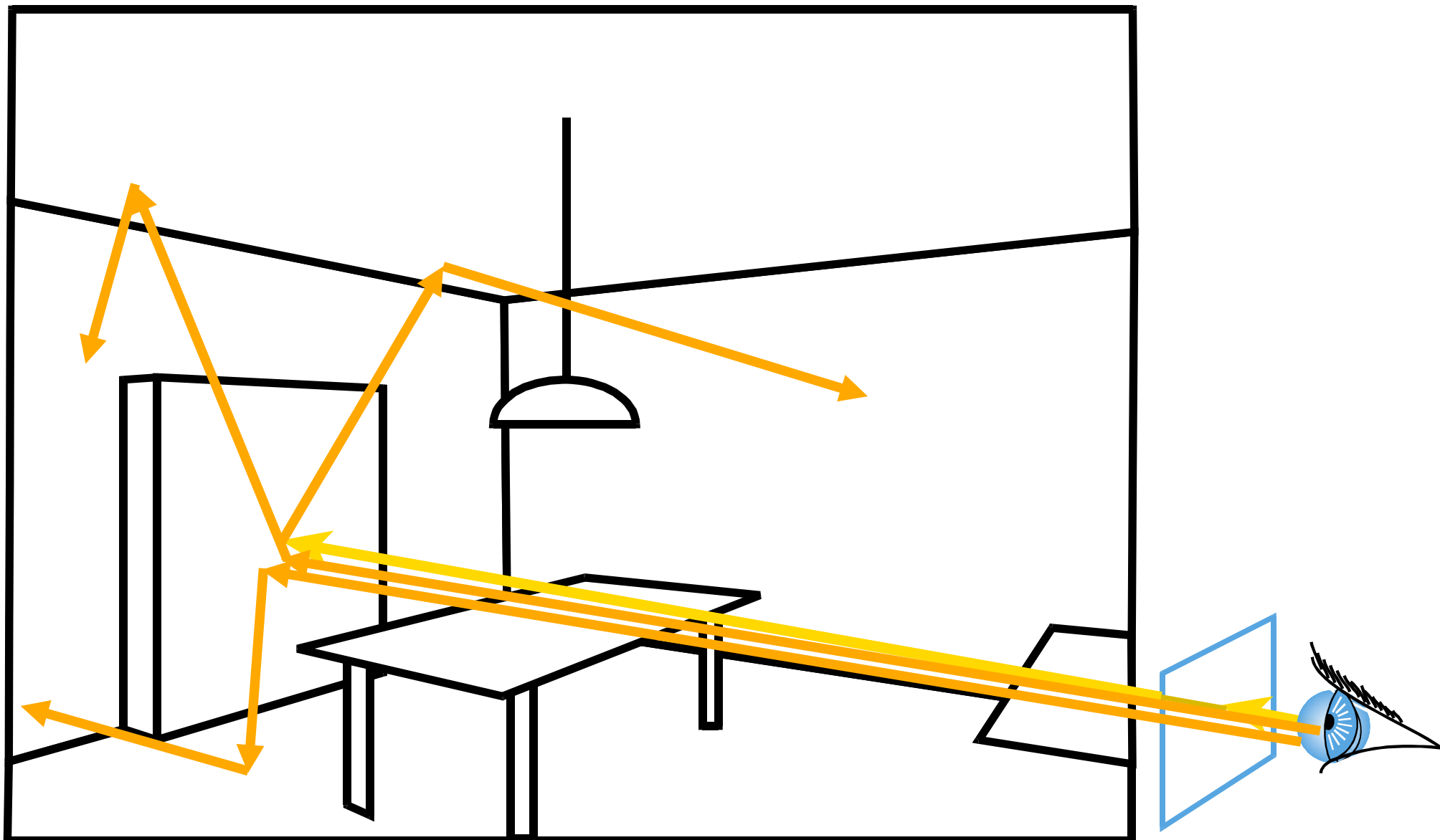
- Recursively estimate the rendering equation

$$L_{\text{out}}(x, \mathbf{v}) = \int_{\Omega} L_{\text{in}}(x, \mathbf{l}) f_r(x, \mathbf{l} \rightarrow \mathbf{v}) \cos \theta_{\text{in}} d\mathbf{l} + E_{\text{out}}(x, \mathbf{v})$$



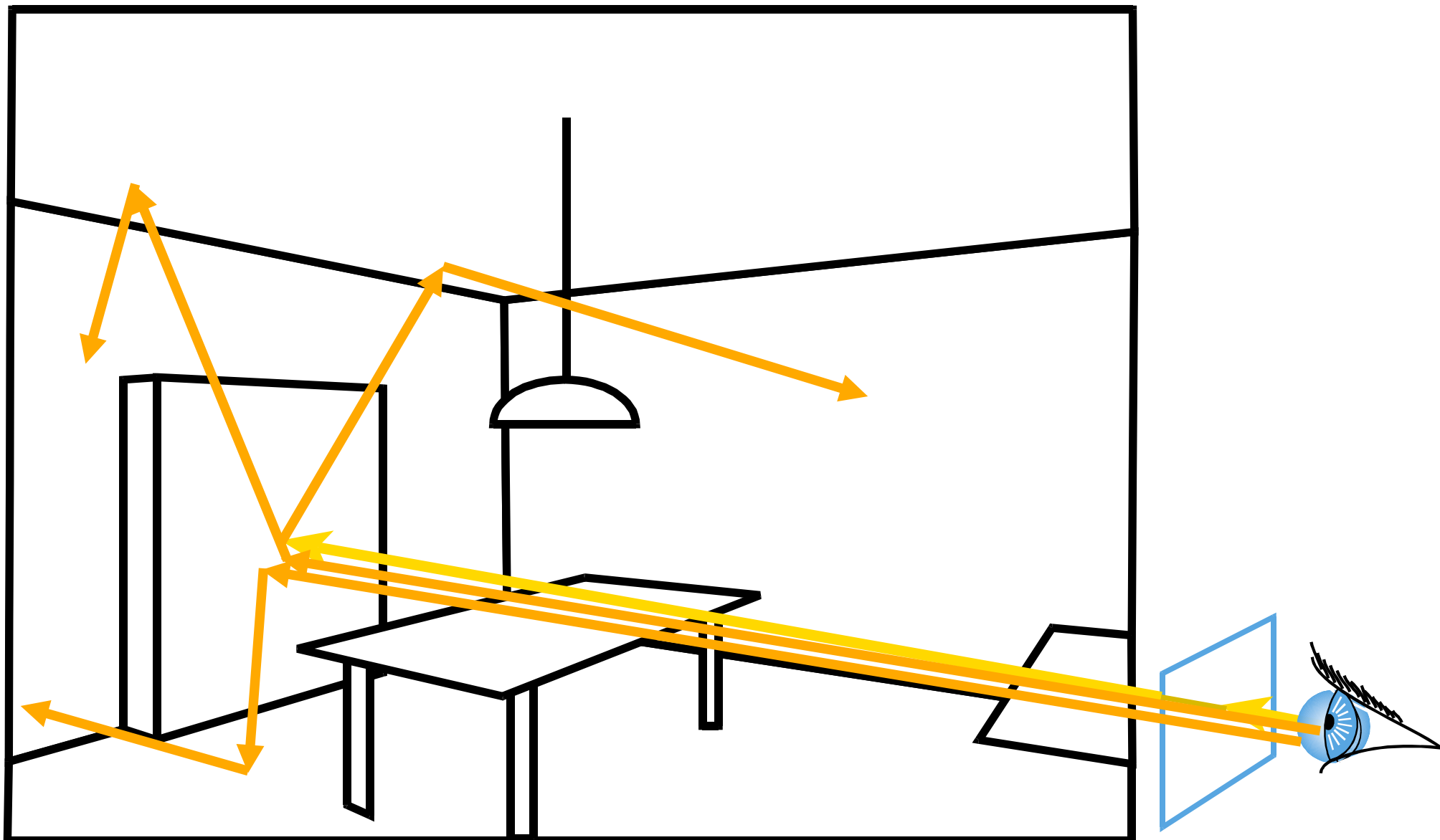
# Monte Carlo Path Tracing

- Trace only one secondary ray per recursion
  - Otherwise number of rays explodes!
- But send many primary rays per pixel (antialiasing)



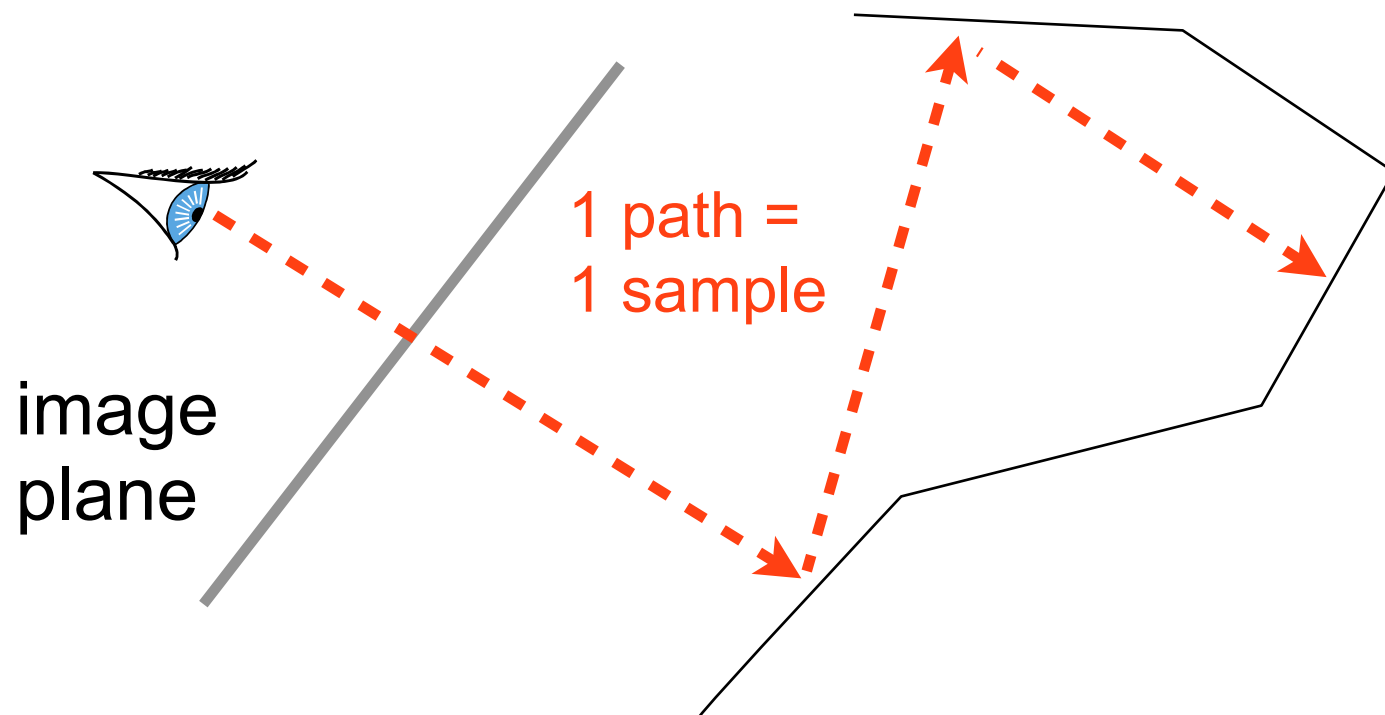
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# Monte Carlo Path Tracing

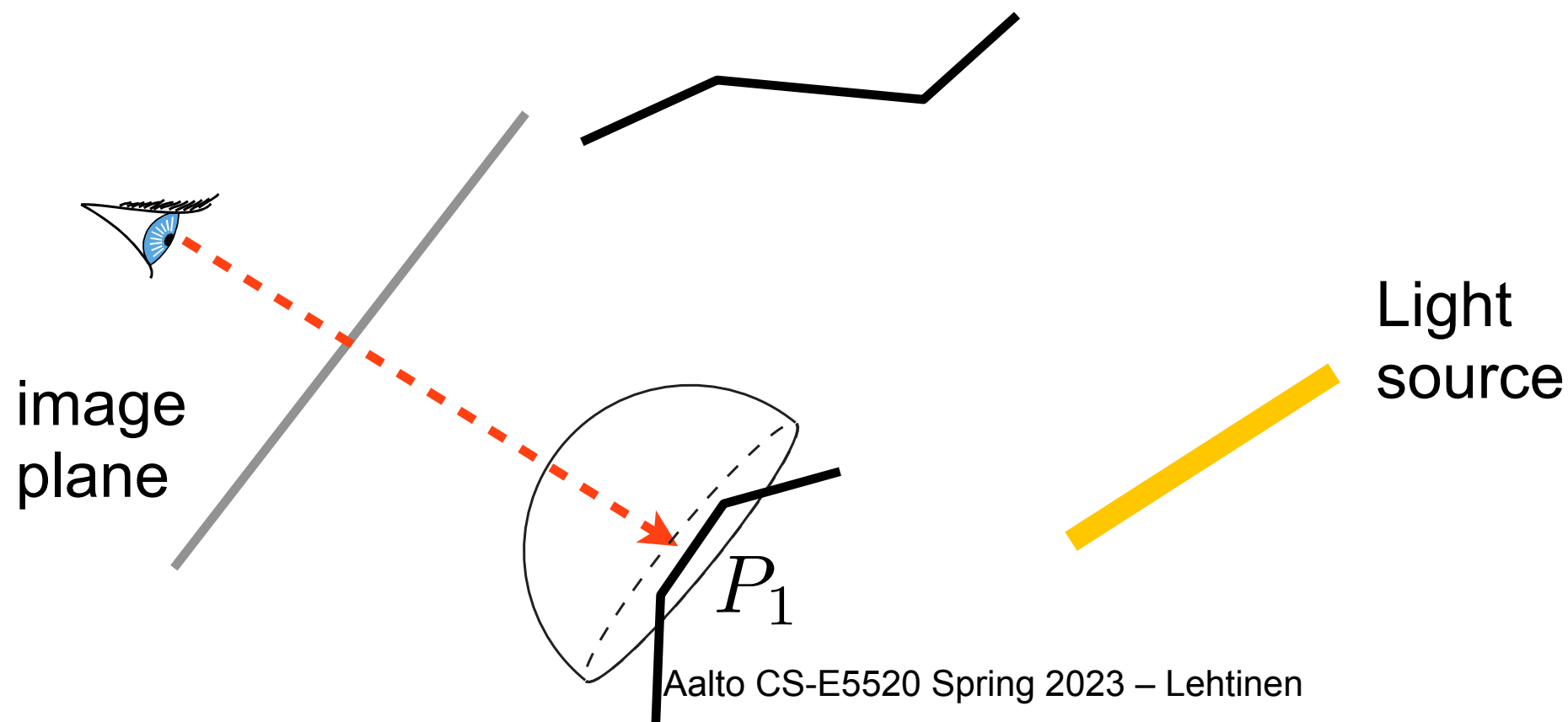
- The idea is just the same as before with AO+filter
  - Instead of thinking about nested integrals over hemispheres at each bounce, let's think of one integral over the Cartesian product of all the hemispheres
  - For  $n$  bounces, the domain is  $\text{screen} \times \underbrace{\Omega \times \dots \times \Omega}_{n \text{ times}}$
  - Each sample is a *path = sequence of rays*



# Example: 1 Indirect Bounce

(Without pixel filter,  
for clarity!)

- What is the radiance leaving  $P_1$  towards the eye after it has taken precisely one bounce off other surfaces after leaving the light source?

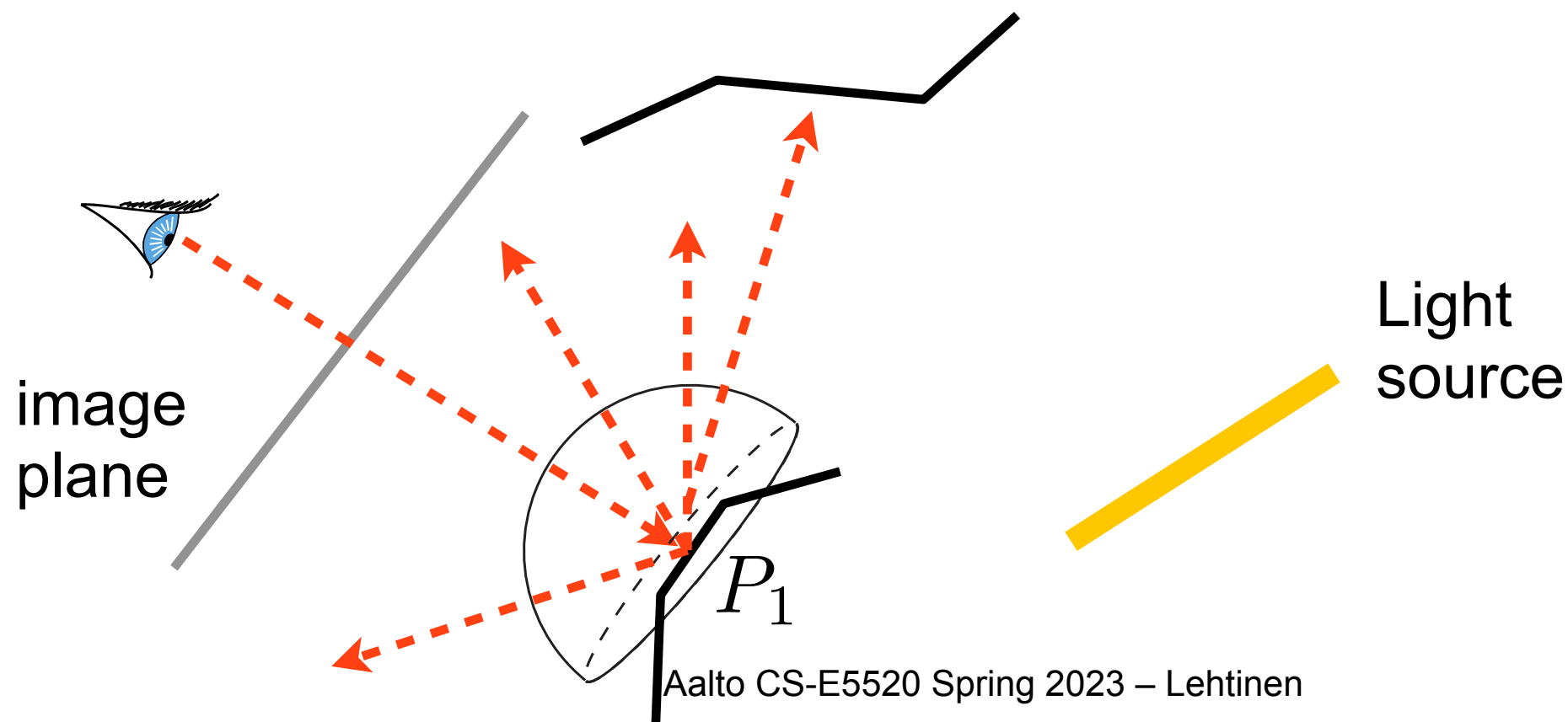


# Example: 1 Indirect Bounce

(Without pixel filter,  
for clarity!)

- Nested version ( $P_1, P_2$  are ray hit points)

$$L_2(x, y) = \int_{\Omega(P_1)} L(P_1 \leftarrow \omega_1) f_r(P_1, \omega_1 \rightarrow \text{eye}) \cos \theta_1 d\omega_1$$

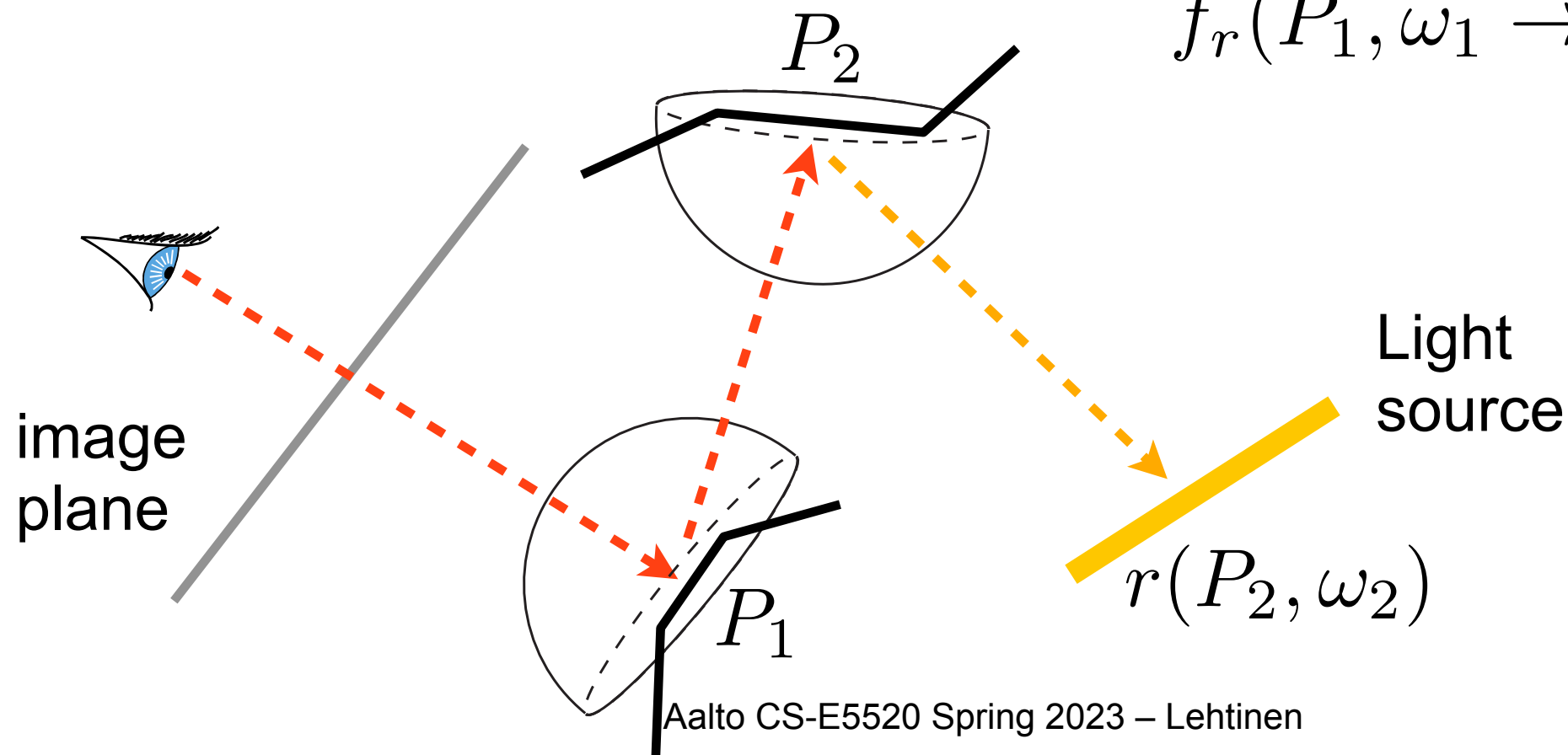


# Example: 1 Indirect Bounce

(Without pixel filter,  
for clarity!)

- Nested version ( $P_1, P_2$  are ray hit points)

$$L_2(x, y) = \int_{\Omega(P_1)} \left[ \int_{\Omega(P_2)} E(r(P_2, \omega_2) \rightarrow P_2) f_r(P_2, \omega_2 \rightarrow -\omega_1) \cos \theta_2 d\omega_2 \right] L(P_1 \leftarrow \omega_1) f_r(P_1, \omega_1 \rightarrow \text{eye}) \cos \theta_1 d\omega_1$$





# Example: 1 Indirect Bounce

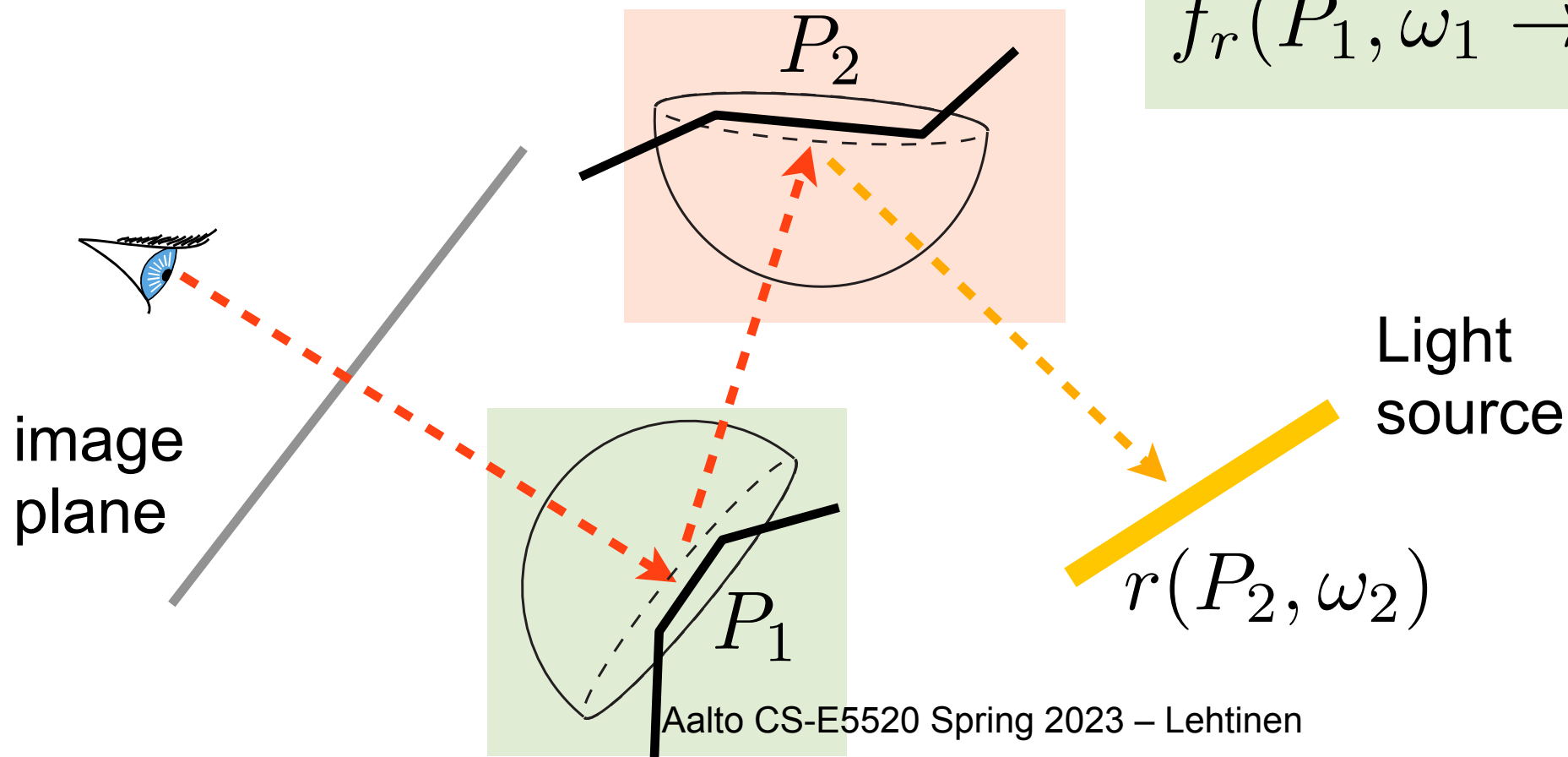
- Nested version ( $P_1, P_2$  are ray hit points)

$$L_2(x, y) =$$

$$L(P_1 \leftarrow \omega_1)$$

$$\int_{\Omega(P_1)} \left[ \int_{\Omega(P_2)} E(r(P_2, \omega_2) \rightarrow P_2) f_r(P_2, \omega_2 \rightarrow -\omega_1) \cos \theta_2 d\omega_2 \right]$$

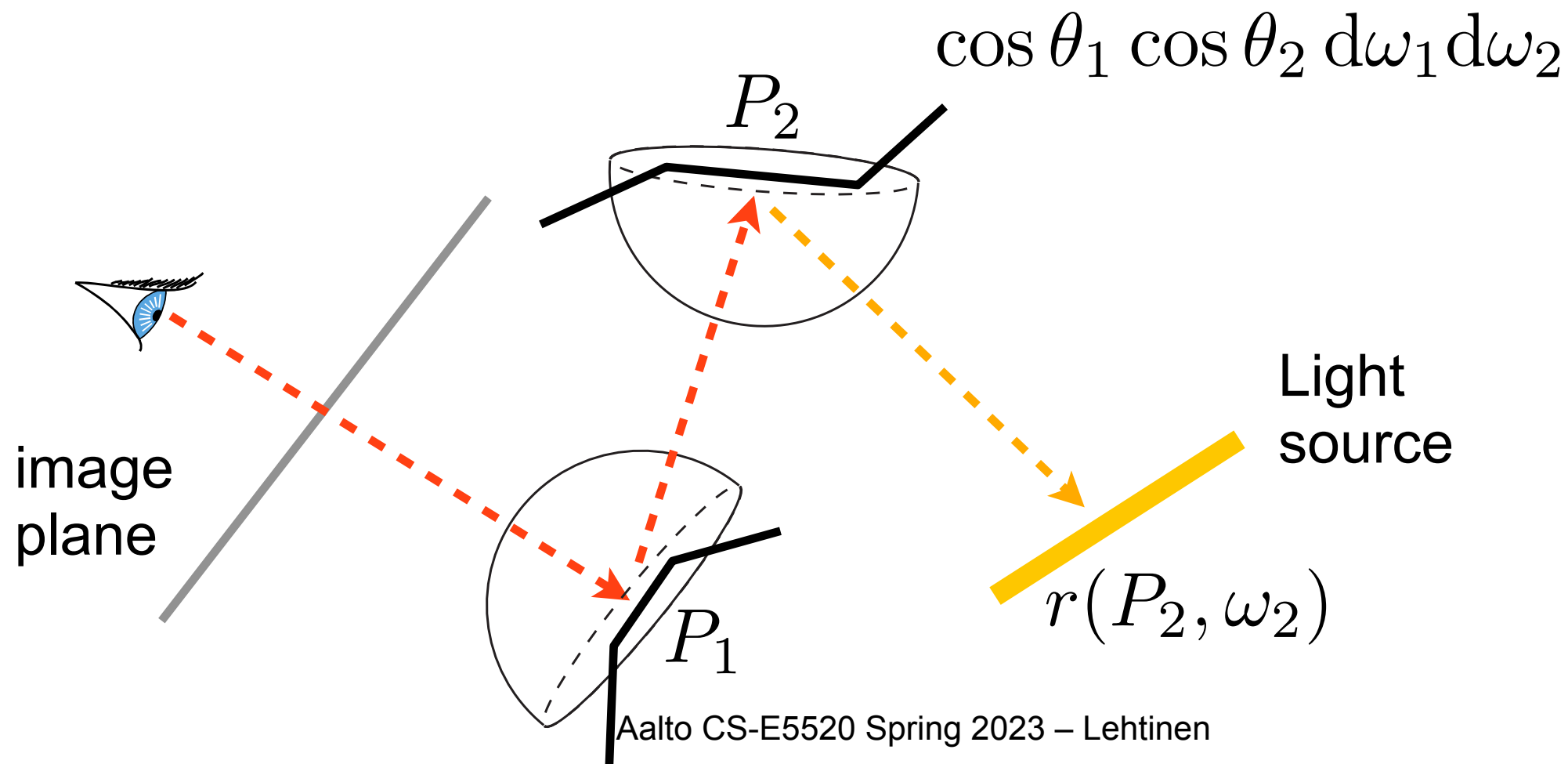
$$f_r(P_1, \omega_1 \rightarrow \text{eye}) \cos \theta_1 d\omega_1$$



# Example: 1 Indirect Bounce $P_2 = r(P_1, \omega_1)$

- Flat version, 4D integral

$$L_2(x, y) = \int_{\Omega(P_1) \times \Omega(P_2)} E(r(P_2, \omega_2) \rightarrow P_2) \times f_r(P_2, \omega_2 \rightarrow -\omega_1) f_r(P_1, \omega_1 \rightarrow \text{eye}) \times$$



**This really is just as simple as going from two nested 1D integrals to a 2D area integral!**

# Full Solution

- The full solution is a sum over paths of all lengths

$$L(x, y) = \sum_{i=0}^{\infty} L_i(x, y), \quad \text{with } L_0(x, y) = E(P_1 \leftarrow \text{eye})$$

- Notice how we've “unwrapped” the recursive rendering equation into a sum of terms

–  $n$  bounce lighting is an integral over screen  $\times \underbrace{\Omega \times \dots \times \Omega}_{n \text{ times}}$

– This is the same as directly evaluating the terms of the Neumann series  $E + TE + TTE + \dots$

# Sampling Paths

- “Local path sampling” proceeds bounce to bounce, always importance sampling according to local BRDF
- That is, for each sample (path):
  - First sample screen  $(x, y)$ , then trace ray
  - At primary hit, choose outgoing direction  $\omega_1$ , trace ray
  - At secondary hit, choose outgoing direction  $\omega_2$
  - Apply local PDFs at each step.. justification below
- Denote the full path  $\bar{x} = (x, y, \omega_1, \omega_2, \dots)$ 
  - Then  $p(\bar{x}) = p(x, y) p(\omega_1) p(\omega_2) \dots$
  - (This assumes independent choices at each bounce)
  - Easy to implement



# Brute Force Path Tracing, Eye Part

$$L(x \rightarrow \mathbf{v}) = \int_{\Omega} L(x \leftarrow \mathbf{l}) f_r(x, \mathbf{l} \rightarrow \mathbf{v}) \cos \theta \, d\mathbf{l} + E(x \rightarrow \mathbf{v})$$

```
for each pixel
  Lout = 0, w=0
  for i=1 to #samples
    generate xi,yi inside pixel with p(x,y)
    ray_i = generatecameraray(xi,yi)
    Lout += f(xi,yi) * trace(ray_i)/p(x,y)
    w += f(xi,yi)/p(x,y)
  endfor
  L(pixel) = Lout/w
endfor
```

(Assuming, for simplicity, that only one pixel filter is nonzero. Look back a few slides for full treatment.)

# Brute Force Path Tracing

$$L(x \rightarrow \mathbf{v}) = \int_{\Omega} L(x \leftarrow \mathbf{l}) f_r(x, \mathbf{l} \rightarrow \mathbf{v}) \cos \theta \, d\mathbf{l} + E(x \rightarrow \mathbf{v})$$

```
trace(ray)
hit = intersect(scene, ray)
result = emission(hit, -dir(ray)) // 0 if no light
// sample outgoing direction
[w, pdf] = sampleReflection(hit, dir(ray))
// recursively estimate incoming radiance, apply BRDF
result += BRDF(hit, -dir(ray), w) *
          cos(theta) *
          trace(ray(hit, w)) / pdf
return result
```

# Brute Force Path Tracing

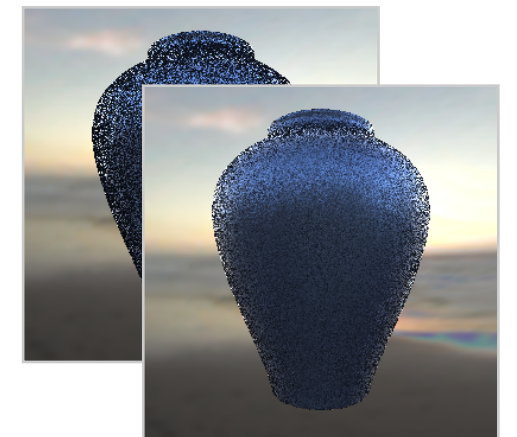
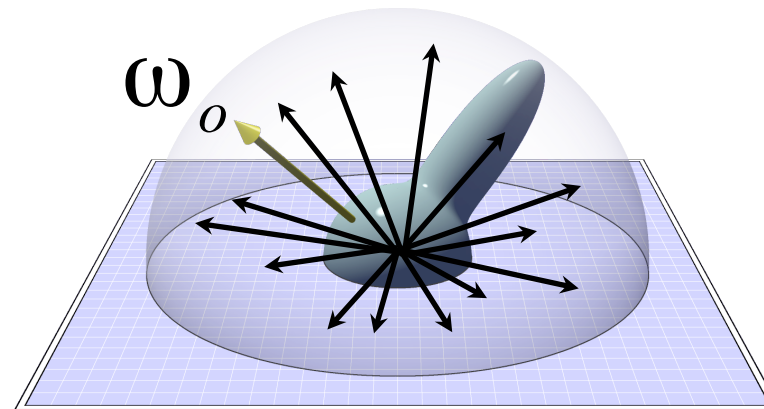
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// recursively estimate incoming radiance, apply BRDF
result += BRDF(hit, -dir(ray), w) *
        cos(theta) *
        trace(ray(hit, w)) / pdf
return result
// when we apply the PDF like this we are implicitly
// multiplying them for all bounces like shown before
```

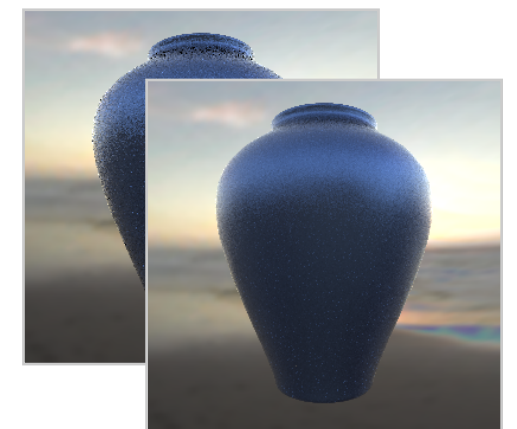
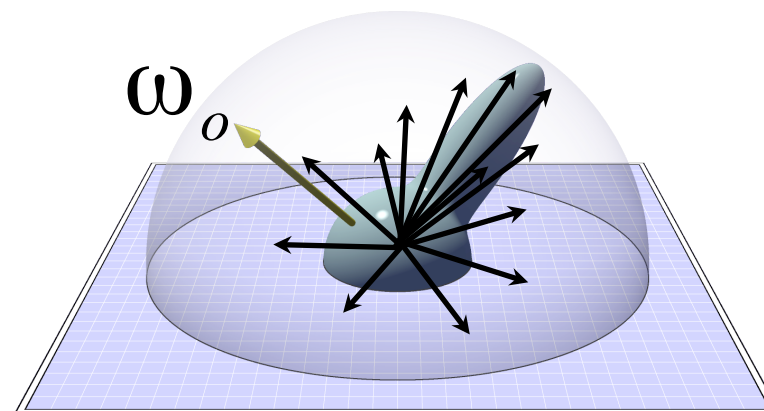
# Notes

- `sampleReflection()` chooses a direction with which to estimate reflectance integral for indirect part
  - I.e. importance sample according to BRDF

$$U(\omega_i)$$



$$P(\omega_i)$$

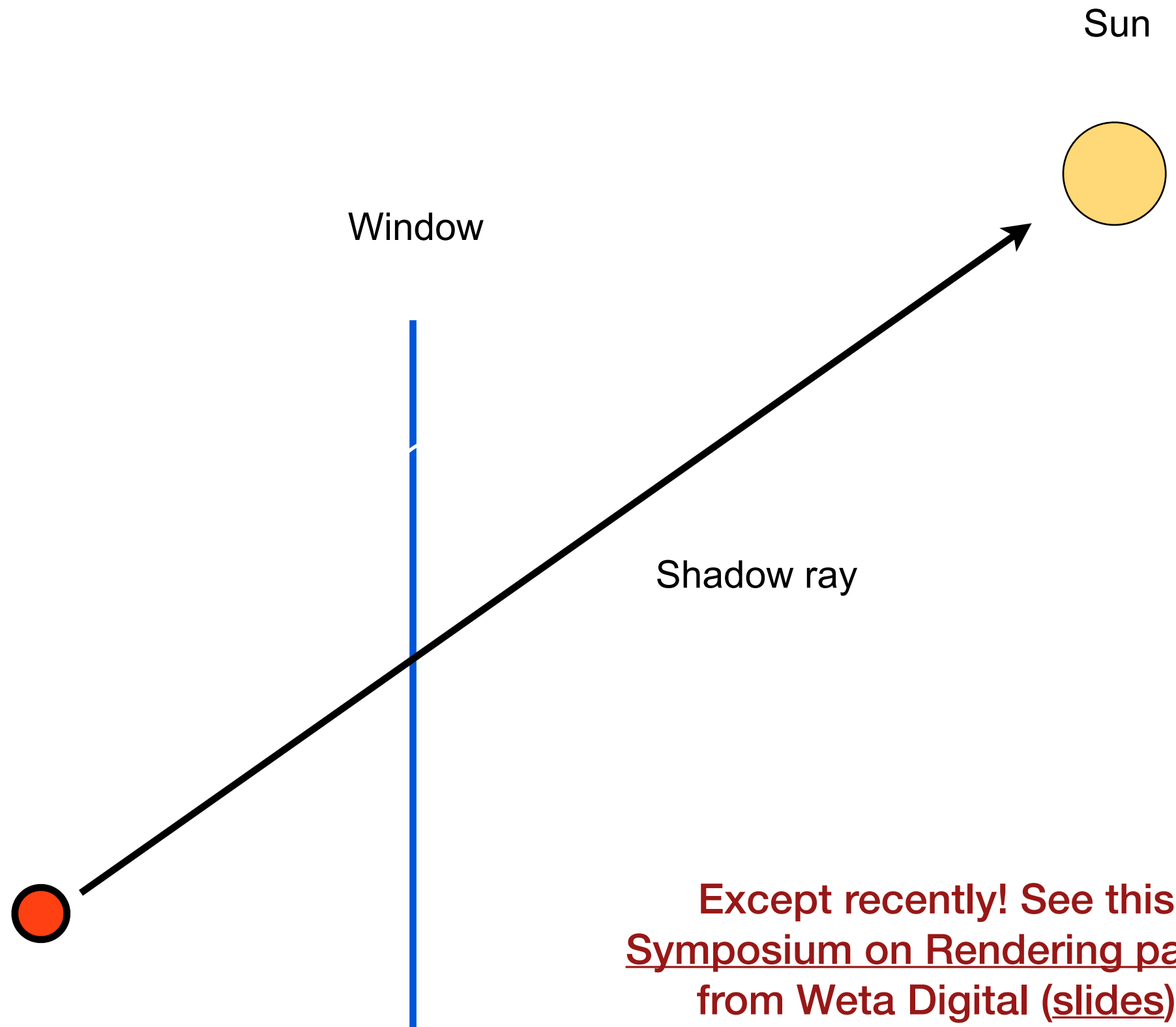




# Why “Brute Force”?

- We’re waiting for the sampler to hit the light on its own
  - Often not a good idea
  - But sometimes we can’t do too much else
  - Think of an architectural model where all the light comes through several specular bounces through windows
- In simple cases we can help by adding an explicit direct light sampling step to each bounce

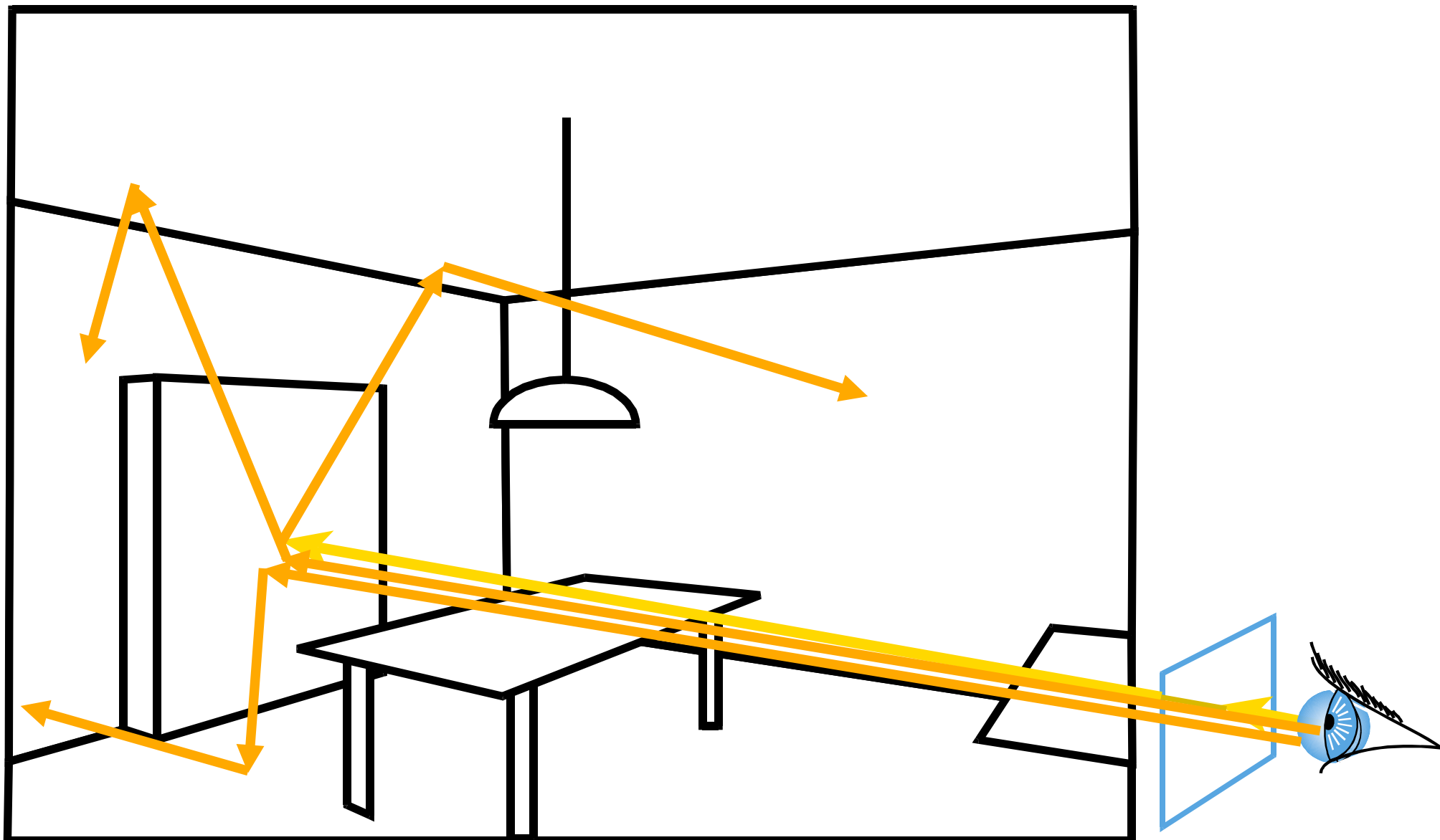
# ~~This Doesn't Work!~~



Except recently! See this [Symposium on Rendering paper](#) from Weta Digital ([slides](#))

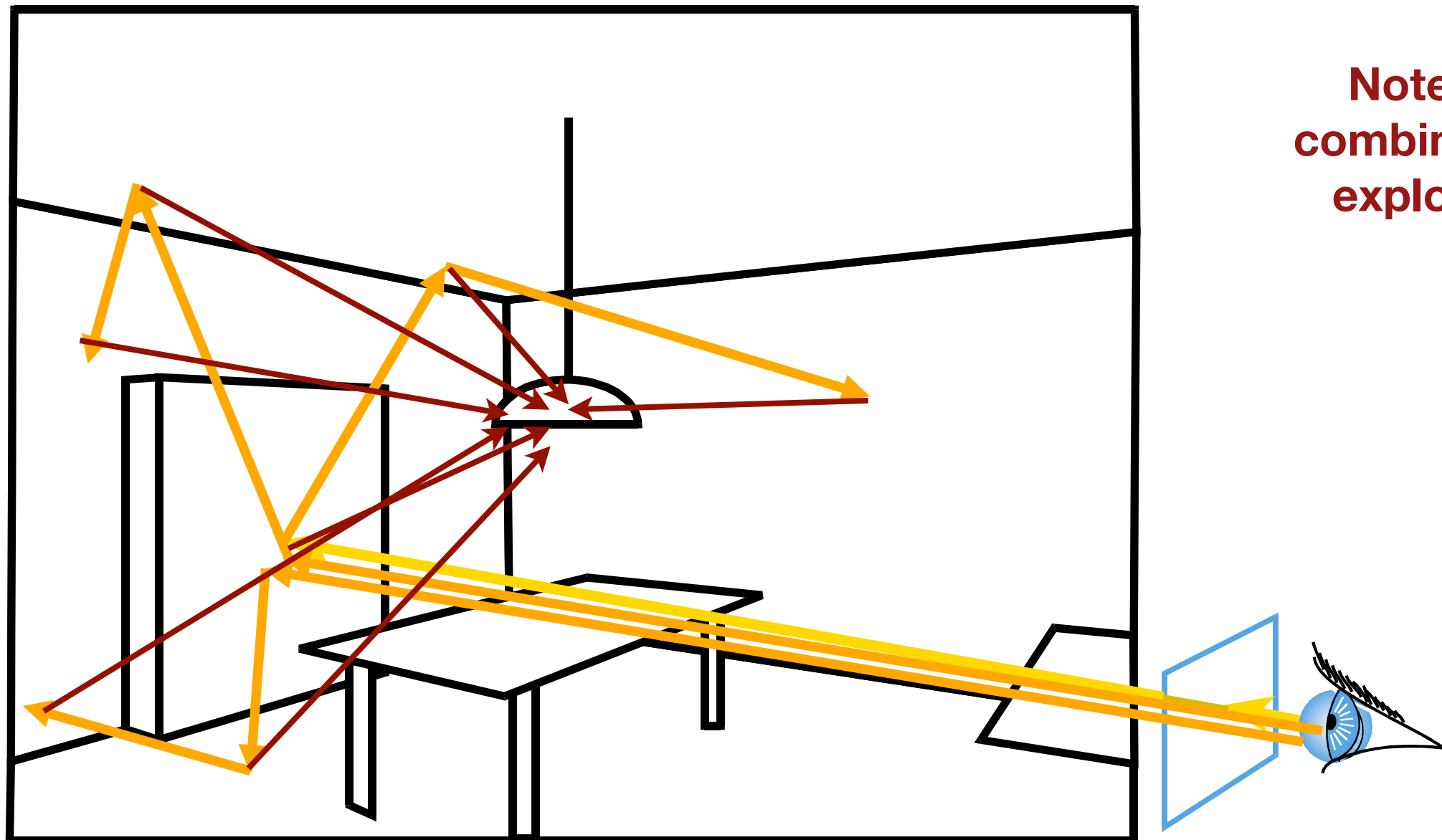
# Brute Force Path Tracing

- Trace only one secondary ray per recursion
  - Otherwise number of rays explodes!
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# Path Tracing w/ Light Sampling

- At each hit, also sample a light and shoot a shadow ray
- The standard way of doing path tracing
- Also called “next event estimation”

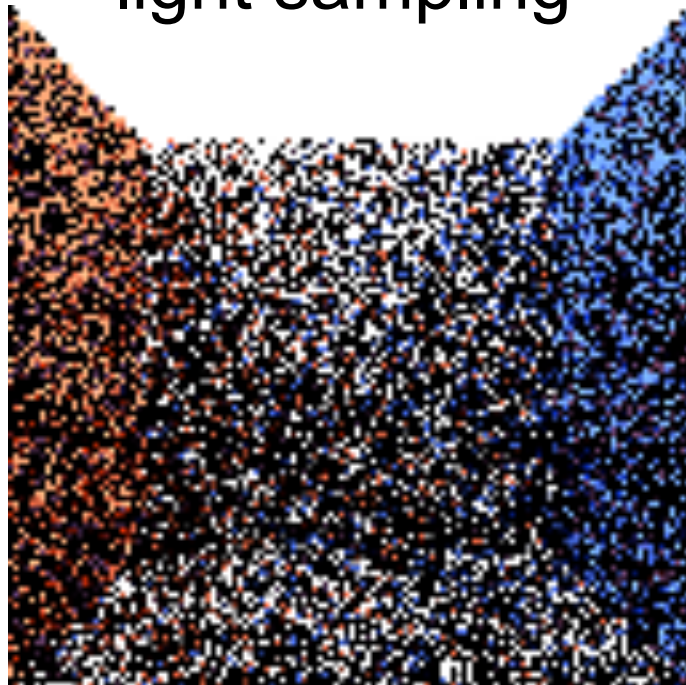


**Note: No  
combinatorial  
explosion!**



# Importance of Sampling the Light

Without explicit  
light sampling

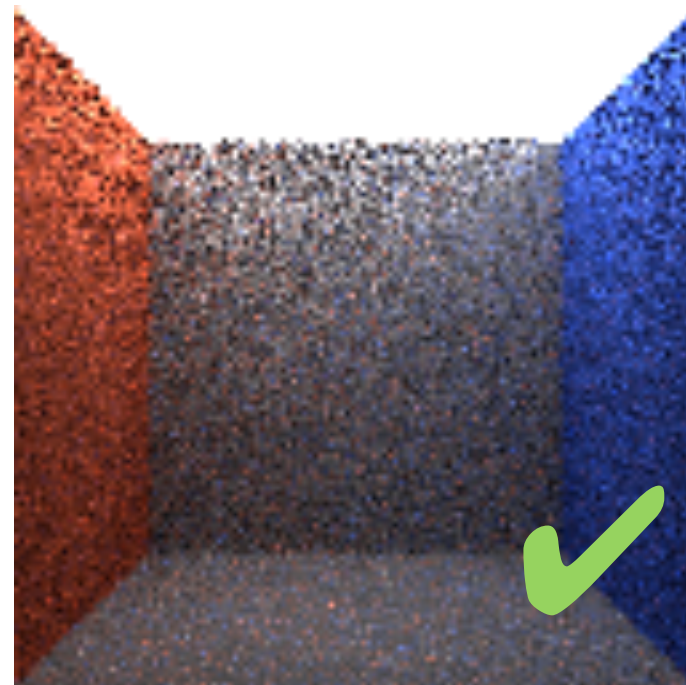


1 path  
per pixel

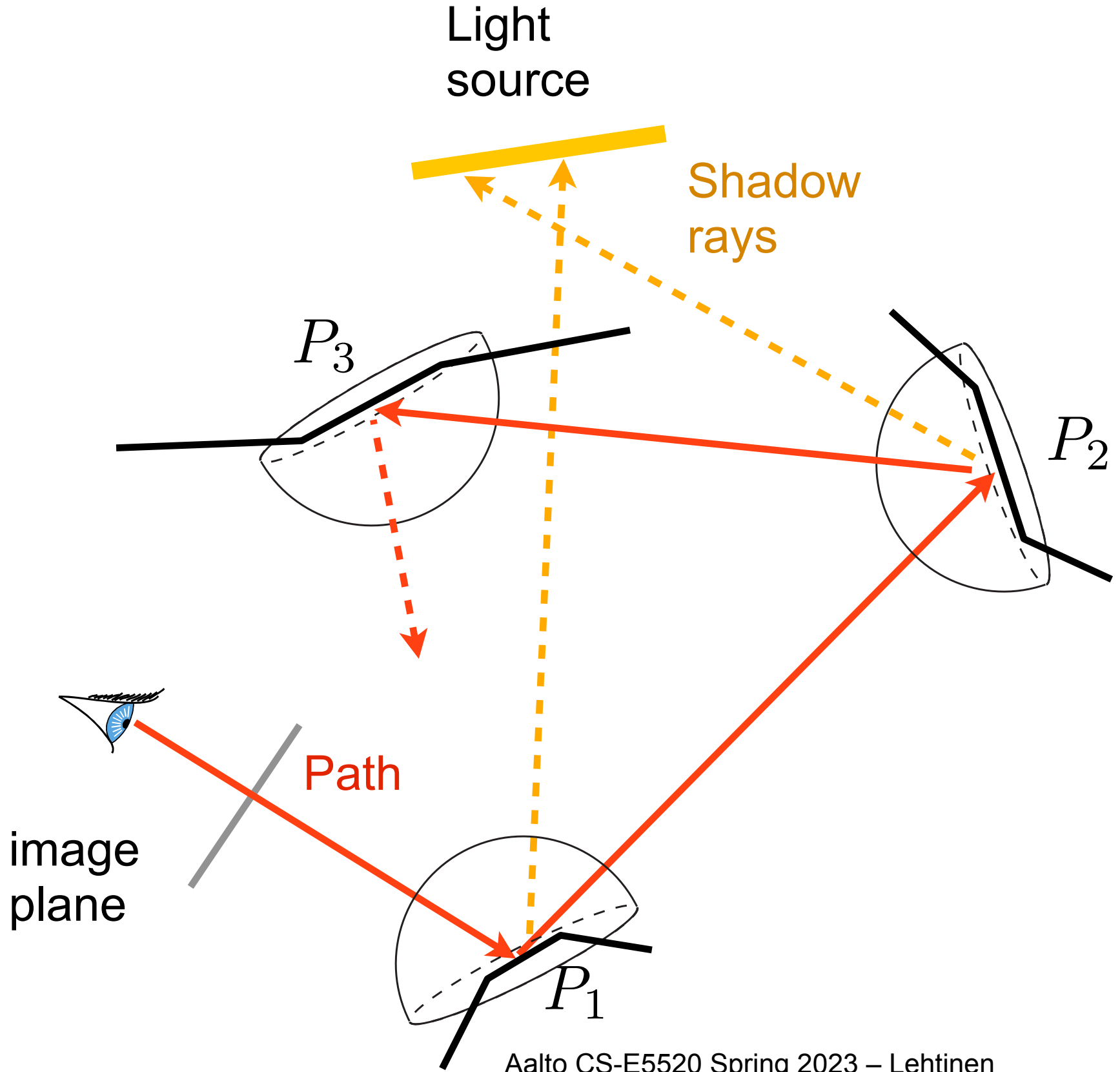
With explicit  
light sampling



4 paths  
per pixel



# Path Tracing w/ Light Sampling



# Interpretation of Shadow Rays

- Recall: the full lighting solution is a sum over paths of all lengths

$$L(x, y) = \sum_{i=0}^{\infty} L_i(x, y), \quad \text{with } L_0(x, y) = E(P_1 \leftarrow \text{eye})$$

- Notice how we've “unwrapped” the recursive rendering equation into a sum of terms
  - $n$  bounce lighting is an integral over screen  $\times \underbrace{\Omega \times \dots \times \Omega}_{n \text{ times}}$  (brute force PT)
  - But now we've replaced the final hemisphere with lights by solid-angle-to-area conversion: screen  $\times \omega \times \omega \dots \times$  lights

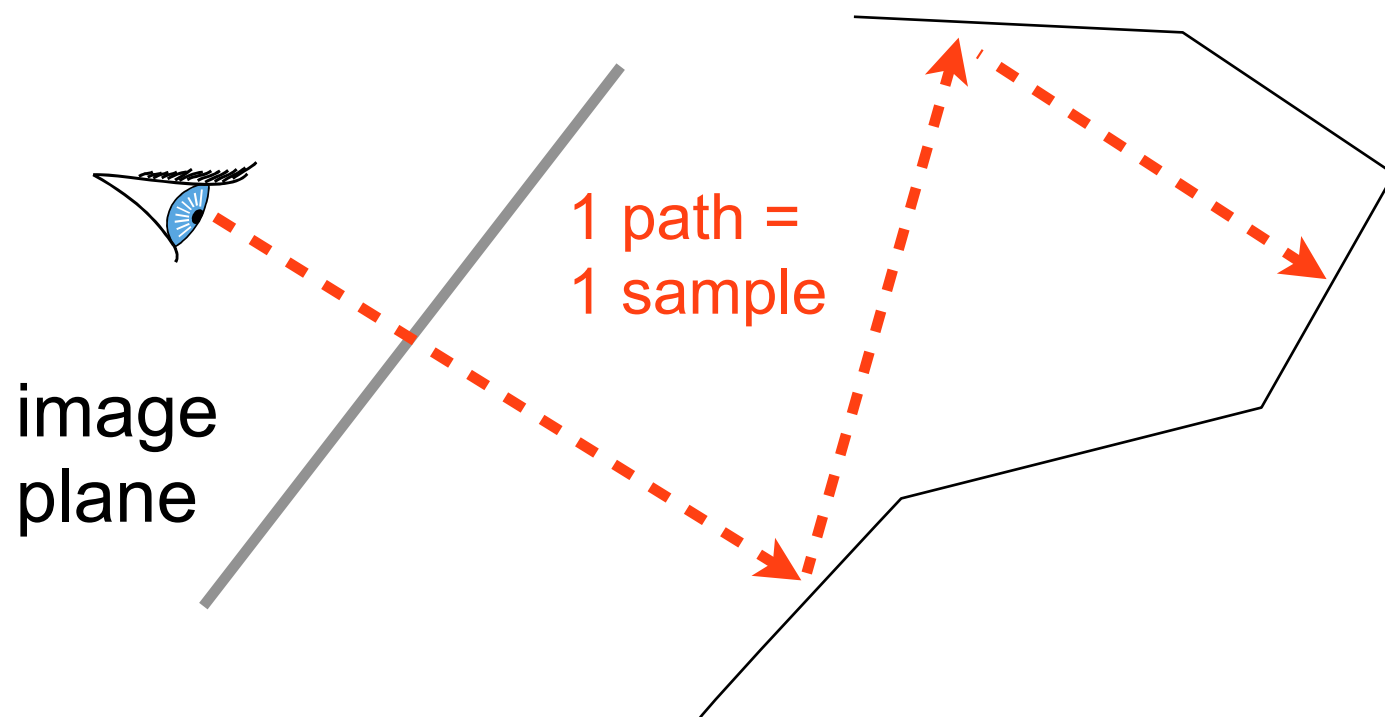
# A Different Parameterization

- In hemisphere form, the domain for  $n$  bounces is

$$\text{screen} \times \underbrace{\Omega \times \dots \times \Omega}_{n \text{ times}}$$

- For shadow ray sampling, it is

$$\text{screen} \times \underbrace{\Omega \times \dots \times \Omega}_{n-1 \text{ times}} \times \text{light area}$$





# Path Tracing Pseudocode

$$L(x \rightarrow \mathbf{v}) = \int_{\Omega} L(x \leftarrow \mathbf{l}) f_r(x, \mathbf{l} \rightarrow \mathbf{v}) \cos \theta \, d\mathbf{l} + E(x \rightarrow \mathbf{v})$$

```
trace(ray)
  hit = intersect(scene, ray)
  if ray is from camera // only add "very direct" light here
    result = emission(hit, -dir(ray))
  [y, pdf1] = sampleLightsource() // pick shadow ray dest.
  // G(hit, y) contains the usual cosine/r^2 of the
  // hemisphere-to-area variable change
  result += V(hit, y) * E(y, y->hit) * BRDF * cos * G(hit, y) / pdf1
  [w, pdf] = sampleReflection(hit, dir(ray)) // like before
  result += BRDF(hit, -dir(ray), w) *
    cos(theta) *
    trace(ray(hit, w)) / pdf
  return result
```

# Notes 2

- `sampleLightsource()` picks a point on the light source and evaluates its PDF
  - You're doing this in the first part of your radiosity assignment
  - ..and we saw this already on the first MC lecture
  - We're (again) applying the solid angle-to-area variable change (i.e. we're integrating over the surface of the light source)
- When you have multiple light sources, you pick *one* at random, and build this into the PDF
  - Simple: just multiply the light source  $p(y)$  with the probability of picking that particular light source

# Picking Lights

- It makes sense to importance sample the light you pick
- E.g. doesn't make sense to sample dim, far-away lights as often as bright, nearby ones!

# One Small Problem

# One Small Problem

- Yes, it doesn't terminate if you just keep going
  - Fortunately, there's still something we can do!

# Russian Roulette


- The usual MC estimate is  $E\left\{\frac{f(x)}{p(x)}\right\}_p$

–  $f/p$  is a random variable because  $x$  is a random variable



# Russian Roulette

- The usual MC estimate is  $E\left\{\frac{f(x)}{p(x)}\right\}_p$ 
  - $f/p$  is a random variable because  $x$  is a random variable
- Let's multiply this by another specially constructed random variable  $R$ 
  - $R(x)=0$  with probability  $\alpha(x)$ , and  $R = 1/(1 - \alpha)$  otherwise
  - Also assume  $\alpha$  and  $x$  are uncorrelated (independent). Then:

$$E\left\{\frac{R \cdot f(x)}{p(x)}\right\} = E\{R\} E\left\{\frac{f(x)}{p(x)}\right\} = E\left\{\frac{f(x)}{p(x)}\right\}$$


# Russian Roulette: What is Going On?

- $R(x)=0$  with probability  $\alpha(x)$ , and  $R = 1/\alpha$  otherwise

$$E\left\{\frac{R \cdot f(x)}{p(x)}\right\} = E\{R\} E\left\{\frac{f(x)}{p(x)}\right\} = E\left\{\frac{f(x)}{p(x)}\right\}$$

- *We've given ourselves permission to sometimes replace the value of the integrand with zero without introducing bias to the result*
  - When we don't set it to zero, we multiply the result by  $1/\alpha$
- This means, for instance, that we can probabilistically terminate light paths without tracing them to infinity

# Path Tracing w/ RR

$$L(x \rightarrow \mathbf{v}) = \int_{\Omega} L(x \leftarrow \mathbf{l}) f_r(x, \mathbf{l} \rightarrow \mathbf{v}) \cos \theta \, dl + E(x \rightarrow \mathbf{v})$$

```
trace(ray)
hit = intersect(scene, ray)
if ray is from camera // only add "very direct" light here
    result = emission(hit, -dir(ray))
[y, pdf1] = sampleLightsource() // pick shadow ray dest.
result += E(y, y->hit)*BRDF*cos*G(hit, y)/pdf1
[w, pdf] = sampleReflection(hit, dir(ray))
// russian roulette with alpha=0.5
terminate = uniformrandom() < 0.5
if !terminate
    result += BRDF(hit, -dir(ray), w)*
                cos(theta)*
                trace(ray(hit, w))/pdf/0.5 // 1/0.5 =mult. by 2!
return result
```

# “Path Space”

- Earlier we wrote n-bounce lighting as a simultaneous integral over n hemispheres
- We can just as well integrate over surfaces instead
  - We just need to add in the geometry terms like before
    - $1/r^2$ , visibility, the other cosine
- The space of paths of length n is then simply

$$\underbrace{S \times \dots \times S}_{n \text{ times}}$$

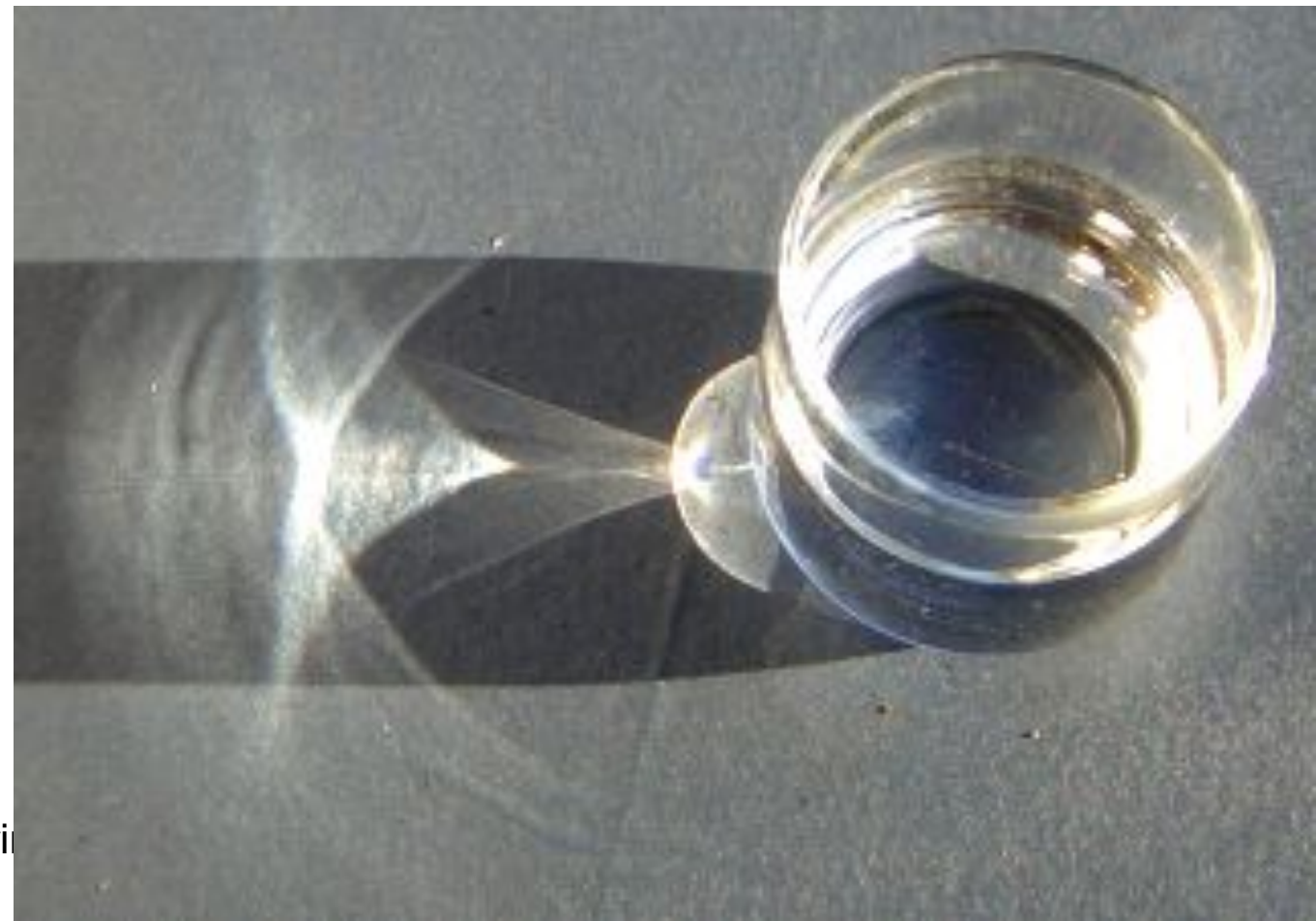
with S being the set of 2D surfaces of the scene

- See [Eric Veach’s PhD](#)

# Bigger Picture

- We are shooting rays from the camera, propagating them along, and kind of hoping we will find light
  - Actively try to hit it by the light source samples
- What about more difficult cases?
  - In a *caustic*, the light propagates through a series of specular refractions and reflections before hitting a diffuse surface

wikipedia



# Problem With Caustics

- All we can do is shoot shadow rays towards the light
  - Not very helpful here!

