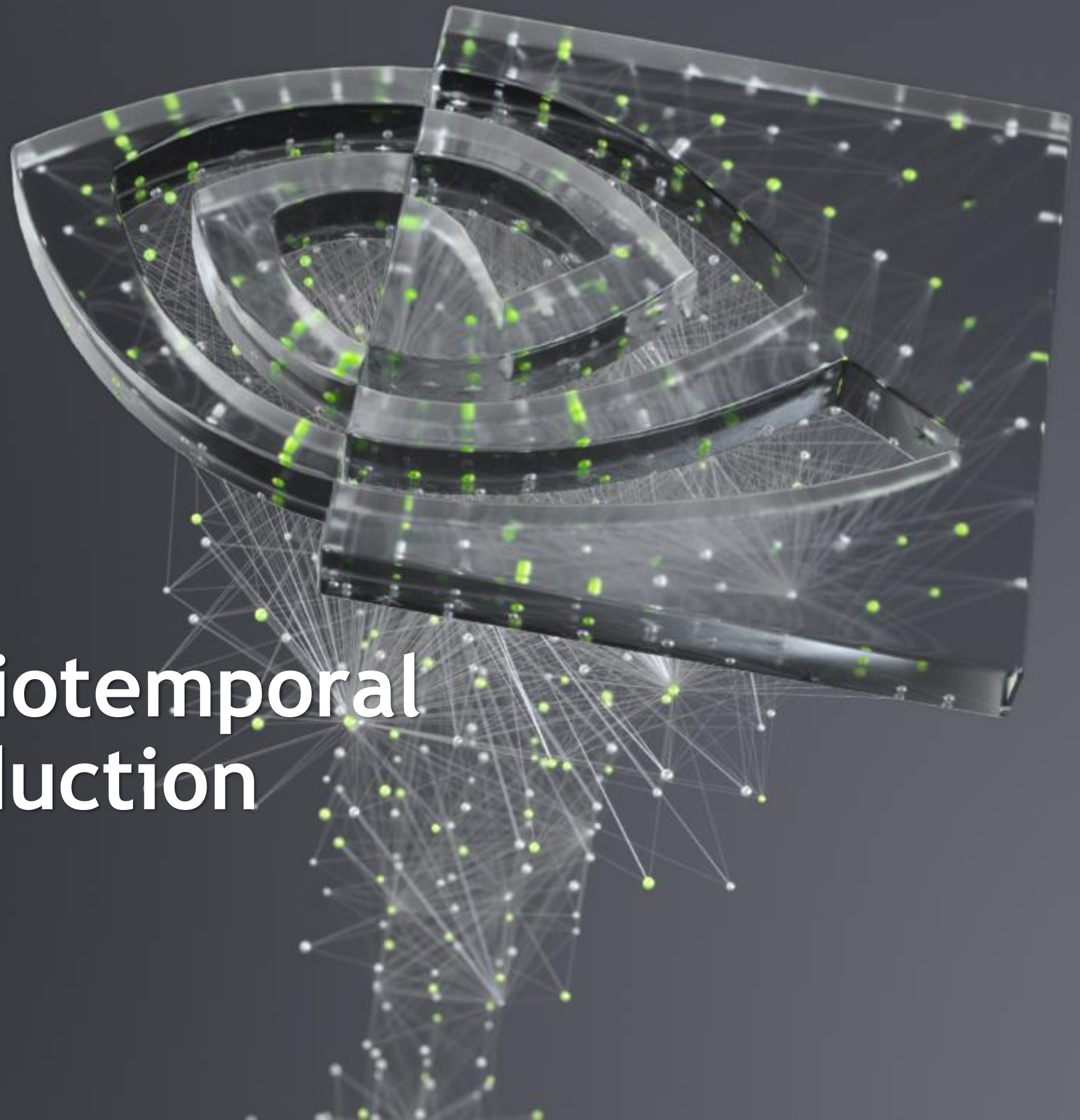




Rearchitecting Spatiotemporal Resampling for Production

Chris Wyman and Alexey Panteleev

High Performance Graphics, July 7, 2021

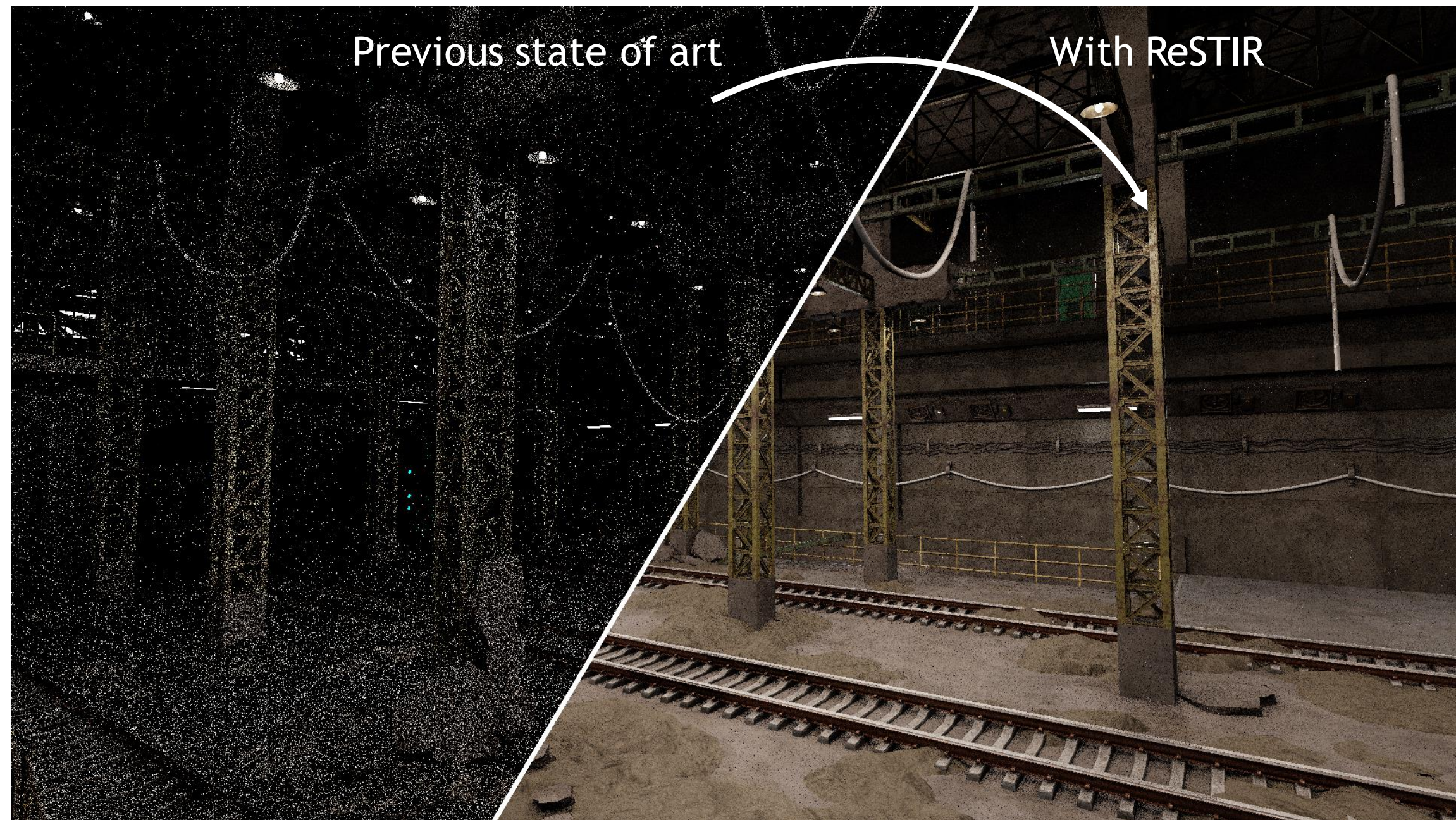


IMPORTANT RESAMPLING FOR DIRECT LIGHTING

Bitterli et al. 2020, “Spatiotemporal reservoir resampling for real-time ray tracing...”

Leverage correlations to improve quality

60x better than prior state of art



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For use in production, requires:

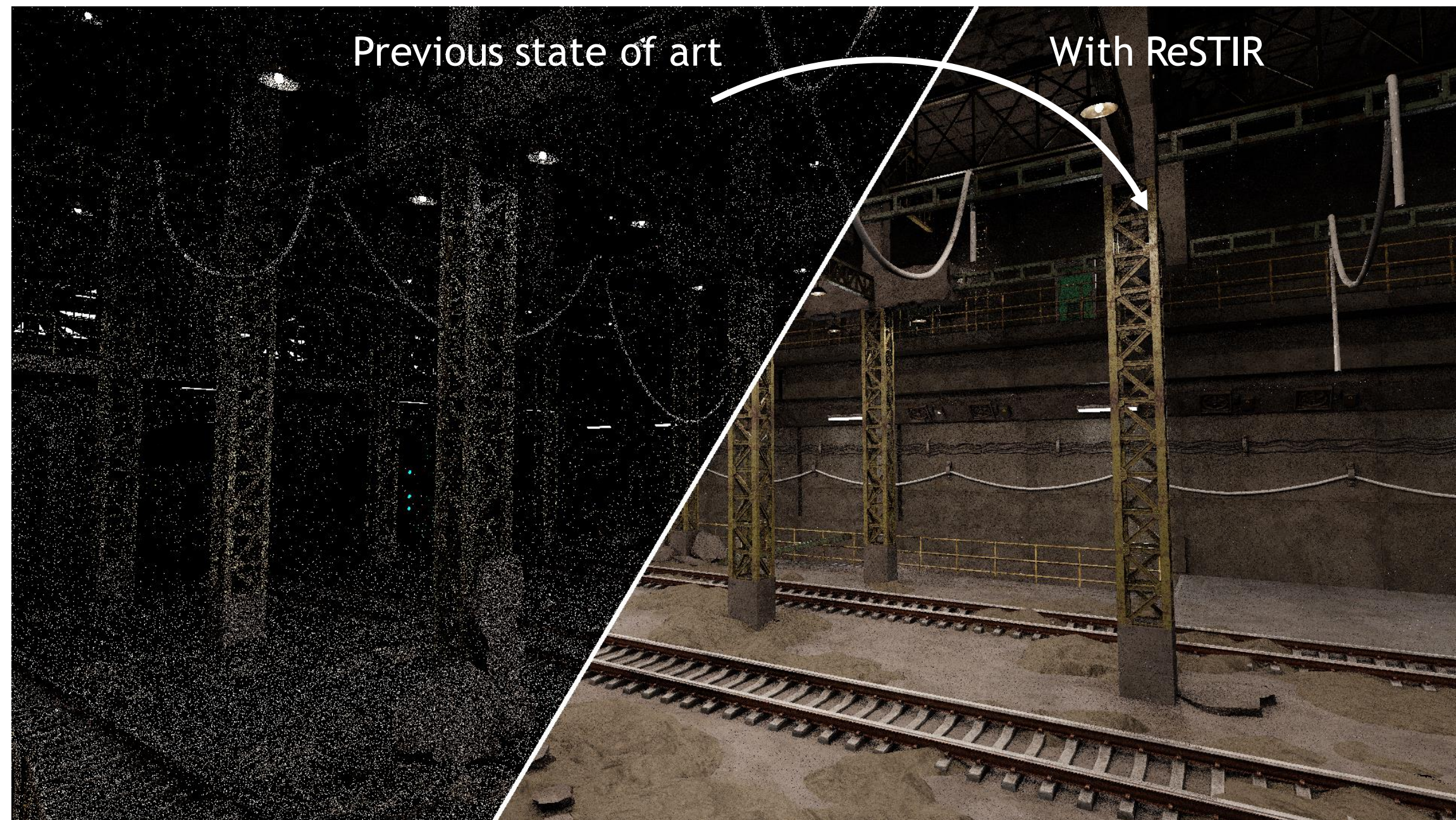
Lower, more consistent cost

Varied light primitives

Fewer shadow rays

Tunable quality / perf knobs

Better handle on bias



GOALS OF OUR HPG PAPER

Move ReSTIR from research prototype (closer) to “production ready”

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- Improve intuition for underlying mathematics

- Develop visual intuition for causes (and avoidance) of bias

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Improve memory coherence (use resampling reshape computations more efficiently)

Reduce number of shadow rays required

Decouple shading from reuse (improves quality at a give performance)

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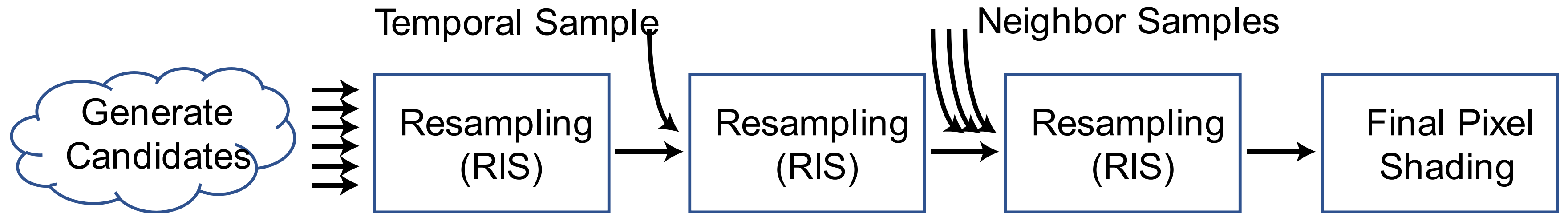
} Going to discuss today



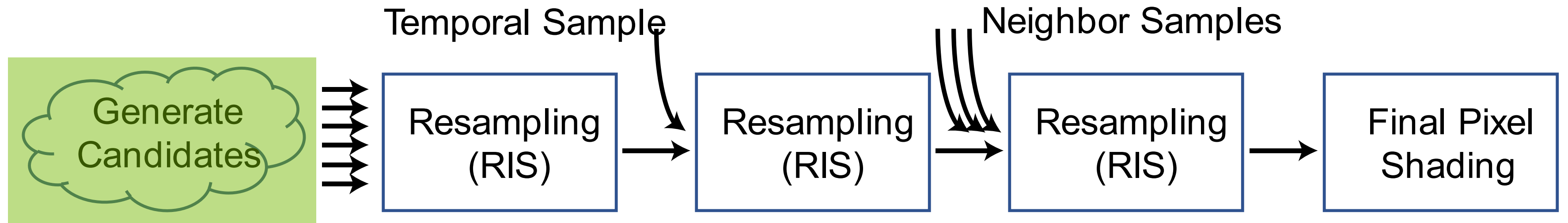
QUICK REVIEW

HOW DOES RESAMPLING WORK?

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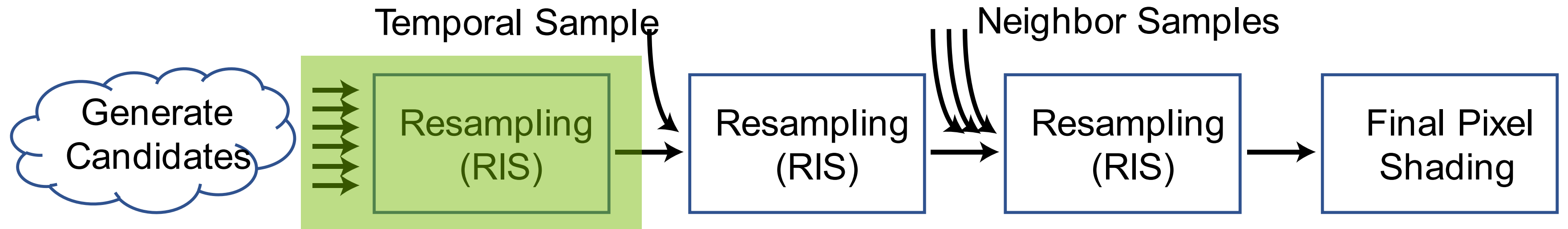


HOW DOES RESAMPLING WORK?



Each pixel (naively) selects a few candidate lights

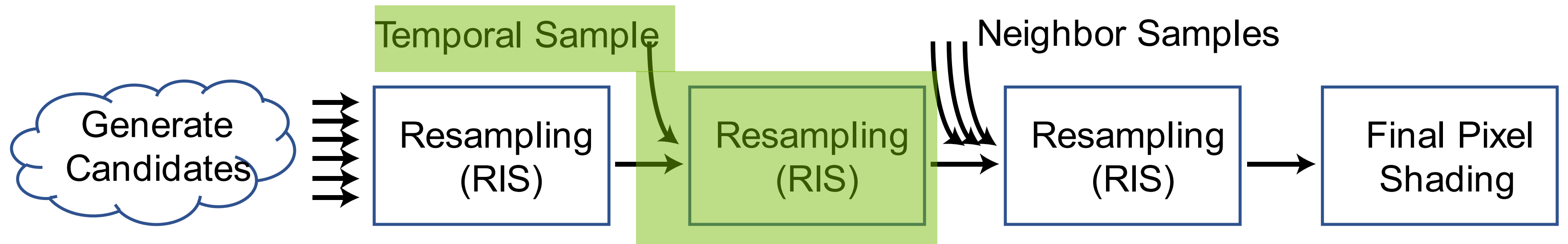
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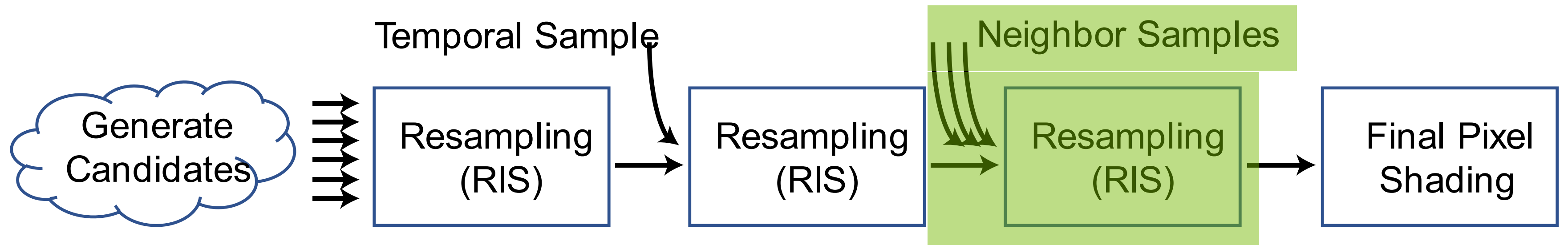


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Reuse (and reweight) last frame's final samples, to increase sample count

HOW DOES RESAMPLING WORK?



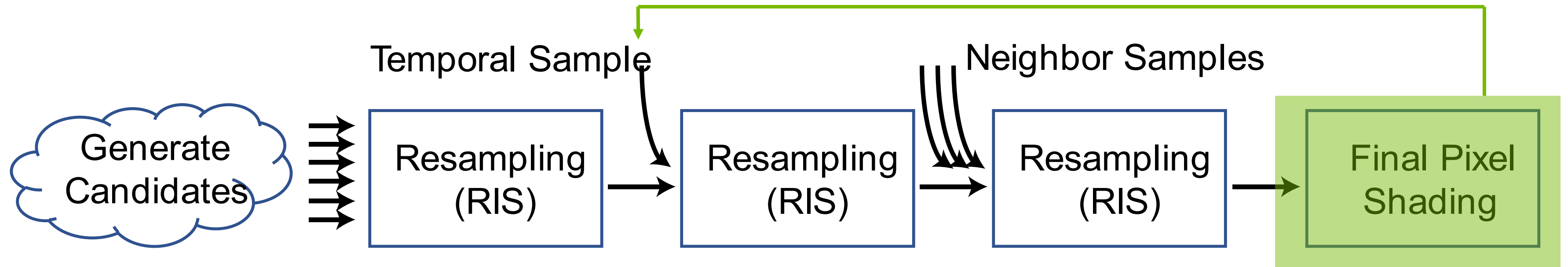
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HOW DOES RESAMPLING WORK?



Each pixel (naively) selects a few candidate lights

These get **reweighted** to select one, proportional to their contributions at the current pixel

Reuse (and reweight) last frame's final samples, to increase sample count

Reuse (and reweight) selected samples at neighbor pixels, to increase sample count

Shade the final light selections (after iterative reweighting)

(And save samples to reuse next frame)



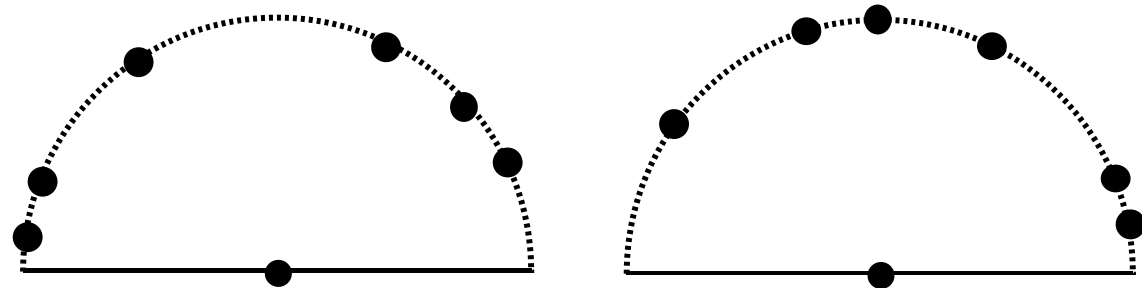
IMPROVING MEMORY COHERENCE

MEMORY INCOHERENCE

Why does it occur?

Complex scene with 3 million dynamic lights

Each pixel independently selects some



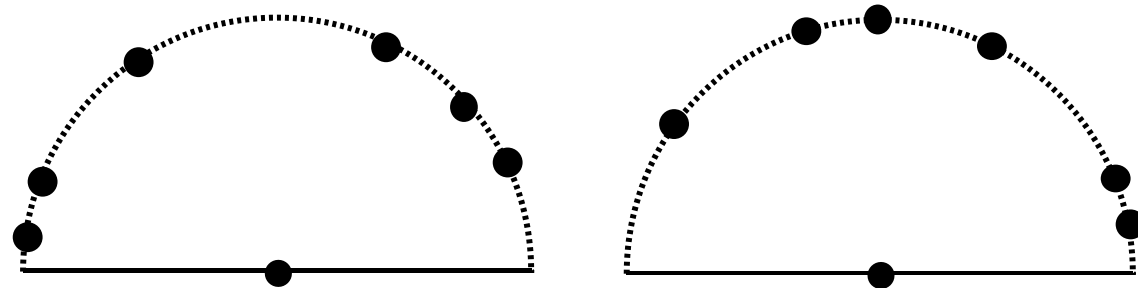
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Extremely incoherent; trashes cache



Roughly 60% of cost in [Bitterli et al. 2020]

MEMORY INCOHERENCE

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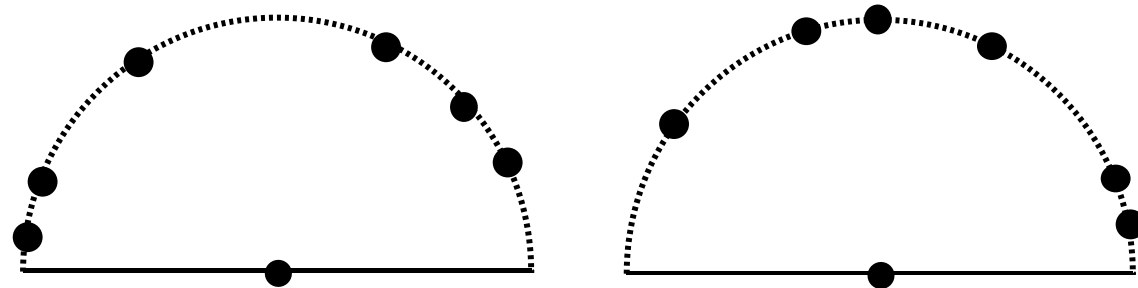
Complex scene with 3 million dynamic lights

Each pixel independently selects some

Extremely incoherent; trashes cache

Cost depends on cache hierarchy

Sampling varies >20x between scenes



Roughly 60% of cost in [Bitterli et al. 2020]

CAN WE MAKE LOOKUPS (MORE) COHERENT?

Ensure light samples for adjacent pixels are in same cache line?

CAN WE MAKE LOOKUPS (MORE) COHERENT?

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Use same 32 candidate lights for all pixels in a screen tile?

Standard, uncorrelated RIS

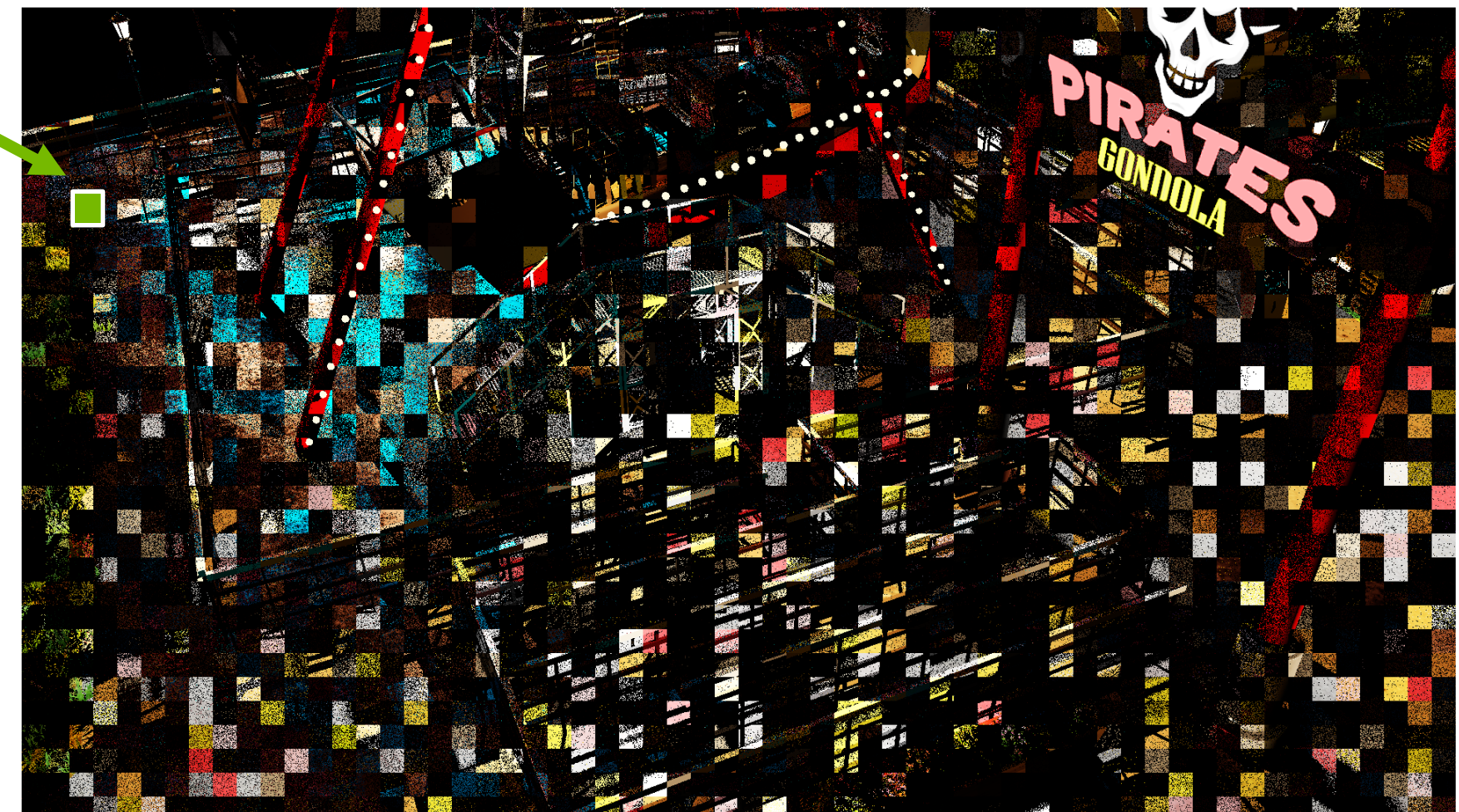
$$F \approx \frac{1}{N} \sum_{i=1}^N \left[\frac{f(\omega_i)}{\hat{p}(\omega_i)} \frac{1}{M} \sum_{j=1}^M \frac{\hat{p}(\omega_{ij})}{q(\omega_{ij})} \right]$$

Correlated form of RIS

$$\approx \left(\frac{1}{N} \sum_{i=1}^N \frac{f(\omega_i)}{\hat{p}(\omega_i)} \right) \left(\frac{1}{M} \sum_{j=1}^M \frac{\hat{p}(\omega_j)}{q(\omega_j)} \right)$$

I.e., $M=32$

The same 32 for all pixels in a block



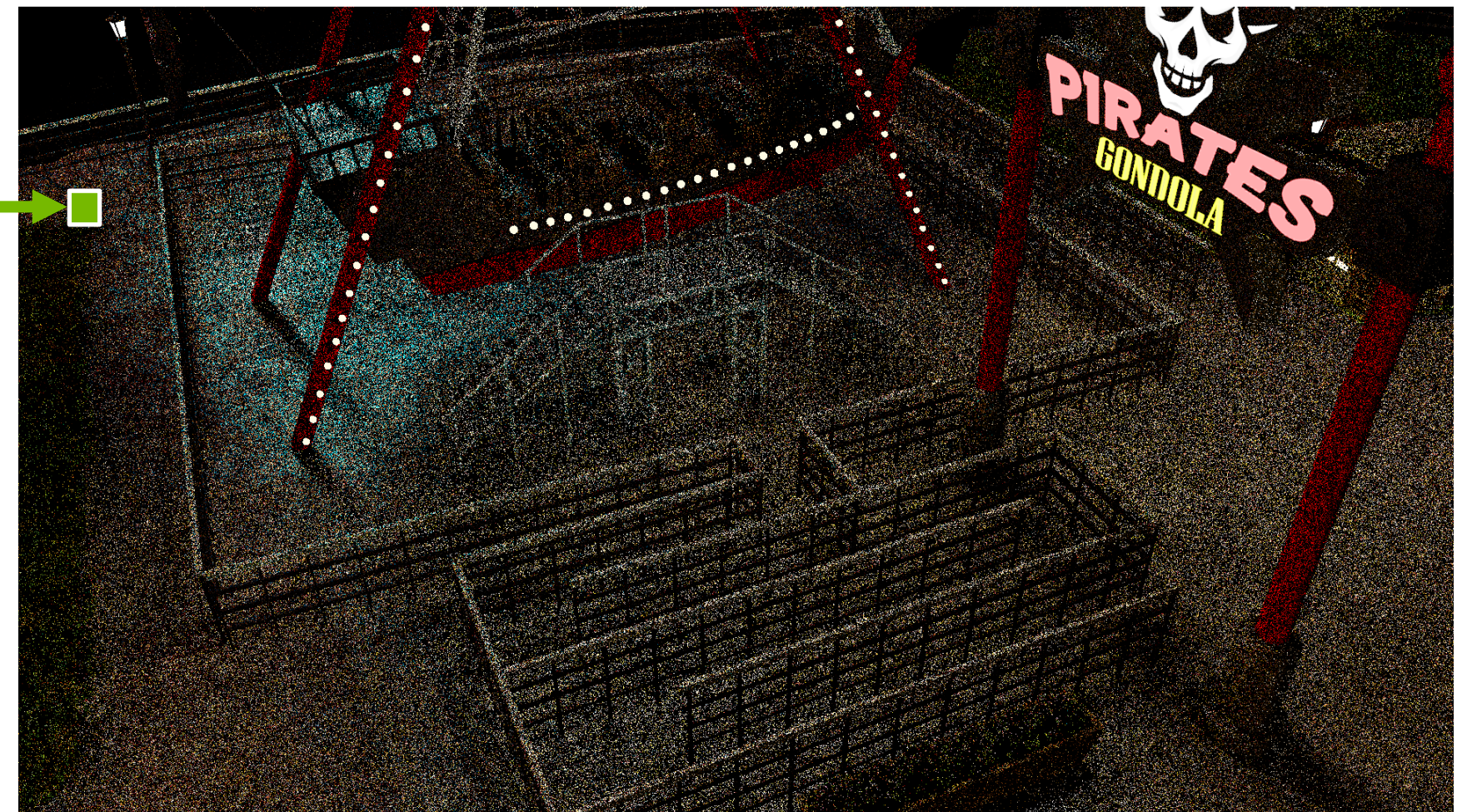
(Surprisingly after spatiotemporal reuse, this still looks decent; but spatial blocks are visible)

CAN WE MAKE LOOKUPS (MORE) COHERENT?

Ensure light samples for adjacent pixels are in same cache line?

~~Use same 32 candidate lights for all pixels in a screen tile?~~

Pick 16k lights per tile; each pixel picks 32 of those



(But this just moves incoherency from per-pixel to per-block sampling)

$$\approx \left(\frac{1}{N} \sum_{i=1}^N \frac{f(\omega_i)}{\hat{p}(\omega_i)} \right) \left(\frac{1}{M} \sum_{j=1}^M \frac{\hat{p}(\omega_j)}{q(\omega_j)} \right)$$

i.e., M=32

Pick different 32 samples from 16k lights for each tile

CAN WE MAKE LOOKUPS (MORE) COHERENT?

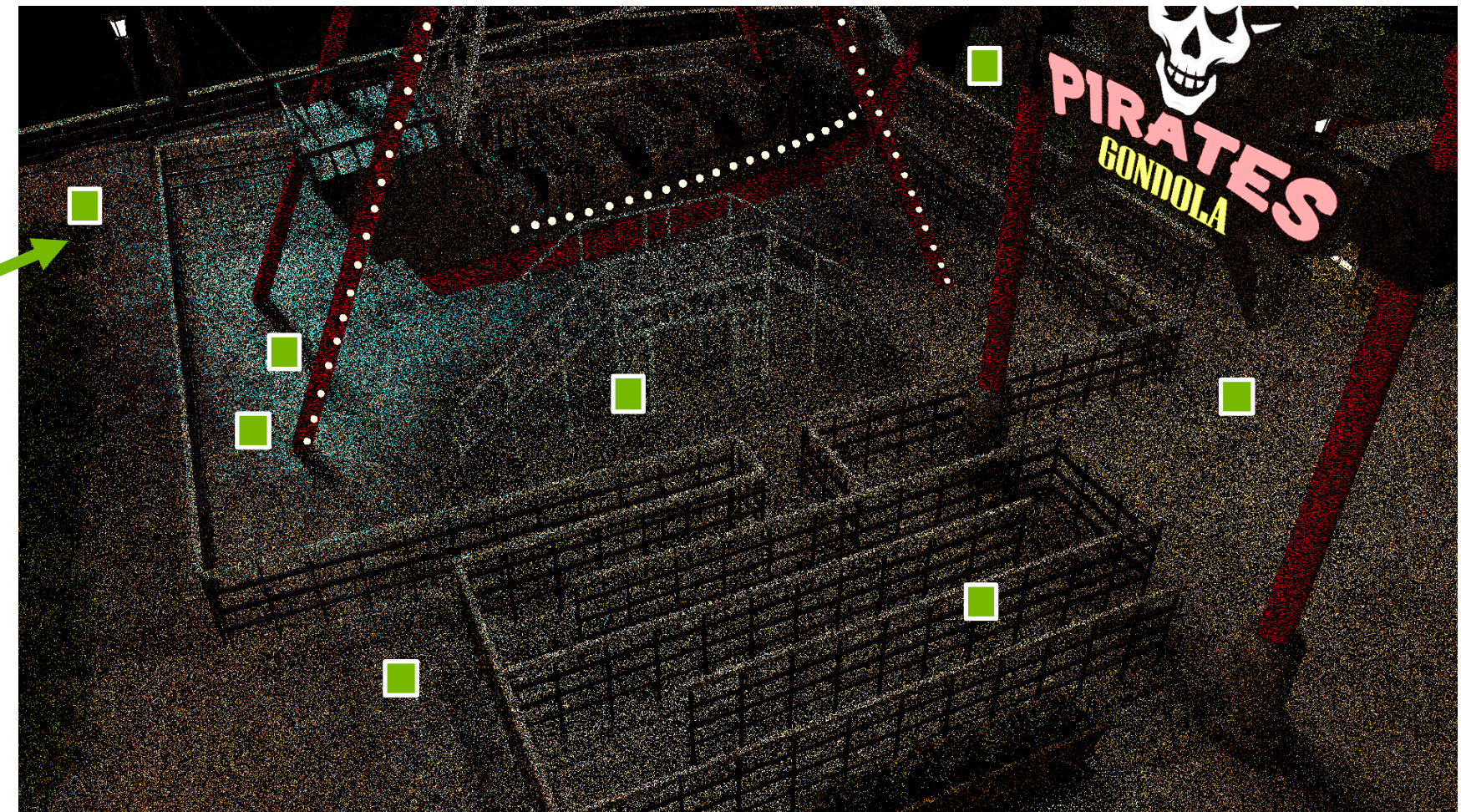
Ensure light samples for adjacent pixels are in same cache line?

~~Use same 32 candidate lights for all pixels in a screen tile?~~

~~Pick 16k lights per tile; each pixel picks 32 of those~~

Reuse a few blocks of lights over entire image? Say 256?

(Each block with 16k lights; a pixel picks 32 of them)



(Removes incoherency from inner loop; reduces number of incoherent lookups)

$$\approx \left(\frac{1}{N} \sum_{i=1}^N \frac{f(\omega_i)}{\hat{p}(\omega_i)} \right) \left(\frac{1}{M} \sum_{j=1}^M \frac{\hat{p}(\omega_j)}{q(\omega_j)} \right)$$

I.e., M=32

Pixels pick 32 from 16k lights; same 16k used for multiple tiles

CAN WE MAKE LOOKUPS (MORE) COHERENT?

Ensure light samples for adjacent pixels are in same cache line?

~~Use same 32 candidate lights for all pixels in a screen tile?~~

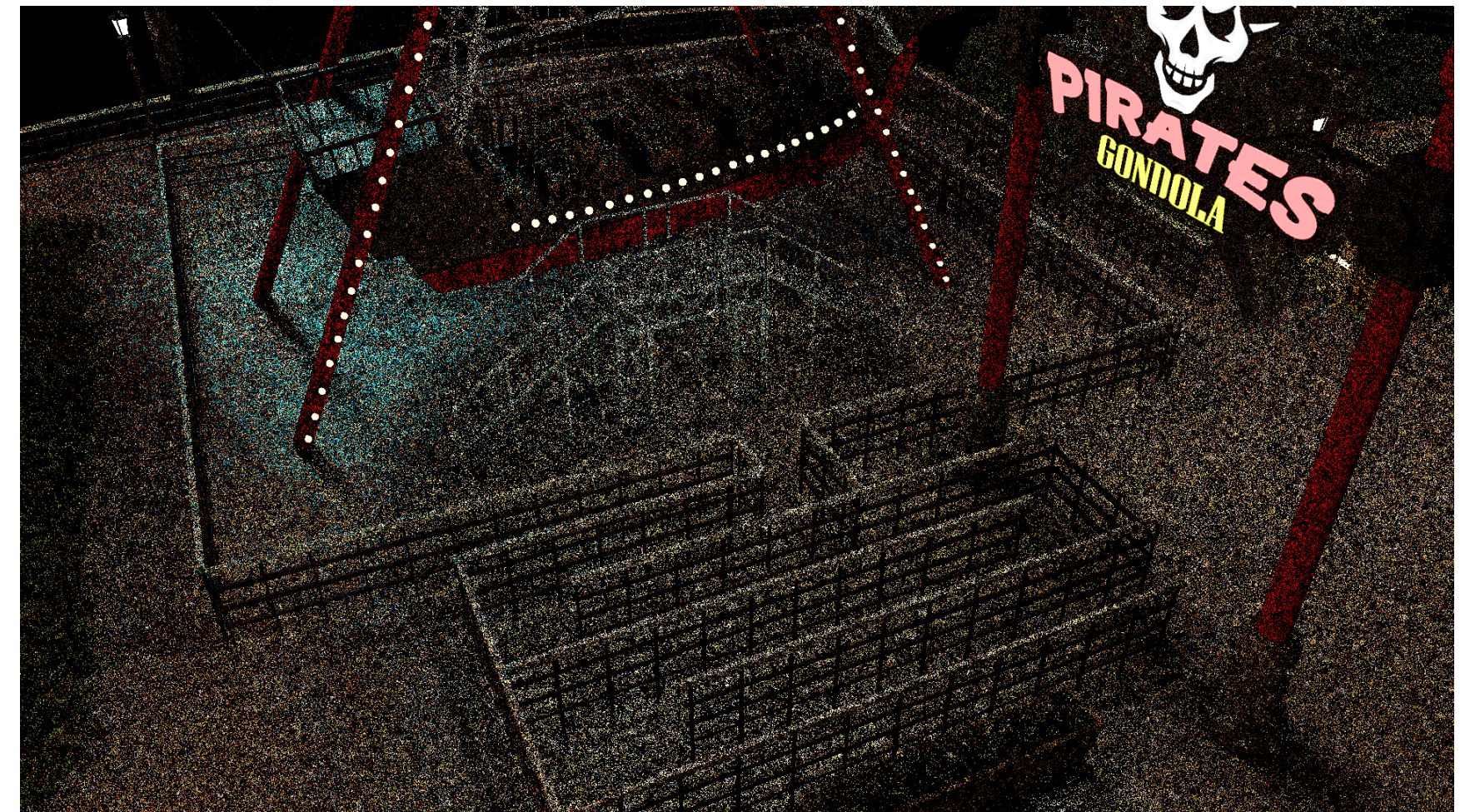
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~~Reuse a few blocks of lights over entire image? Say 256?~~

~~(Each block with 16k lights; a pixel picks 32 of them)~~

Optimizing params: 128 blocks of 1024 light samples each

Reused over 8x8 pixel tile; each pixel selects 32 lights



(Perf sweet spot across scenes; slight correlation noticeable in some scenes)

CAN WE MAKE LOOKUPS (MORE) COHERENT?

Ensure light samples for adjacent pixels are in same cache line?

~~Use same 32 candidate lights for all pixels in a screen tile?~~

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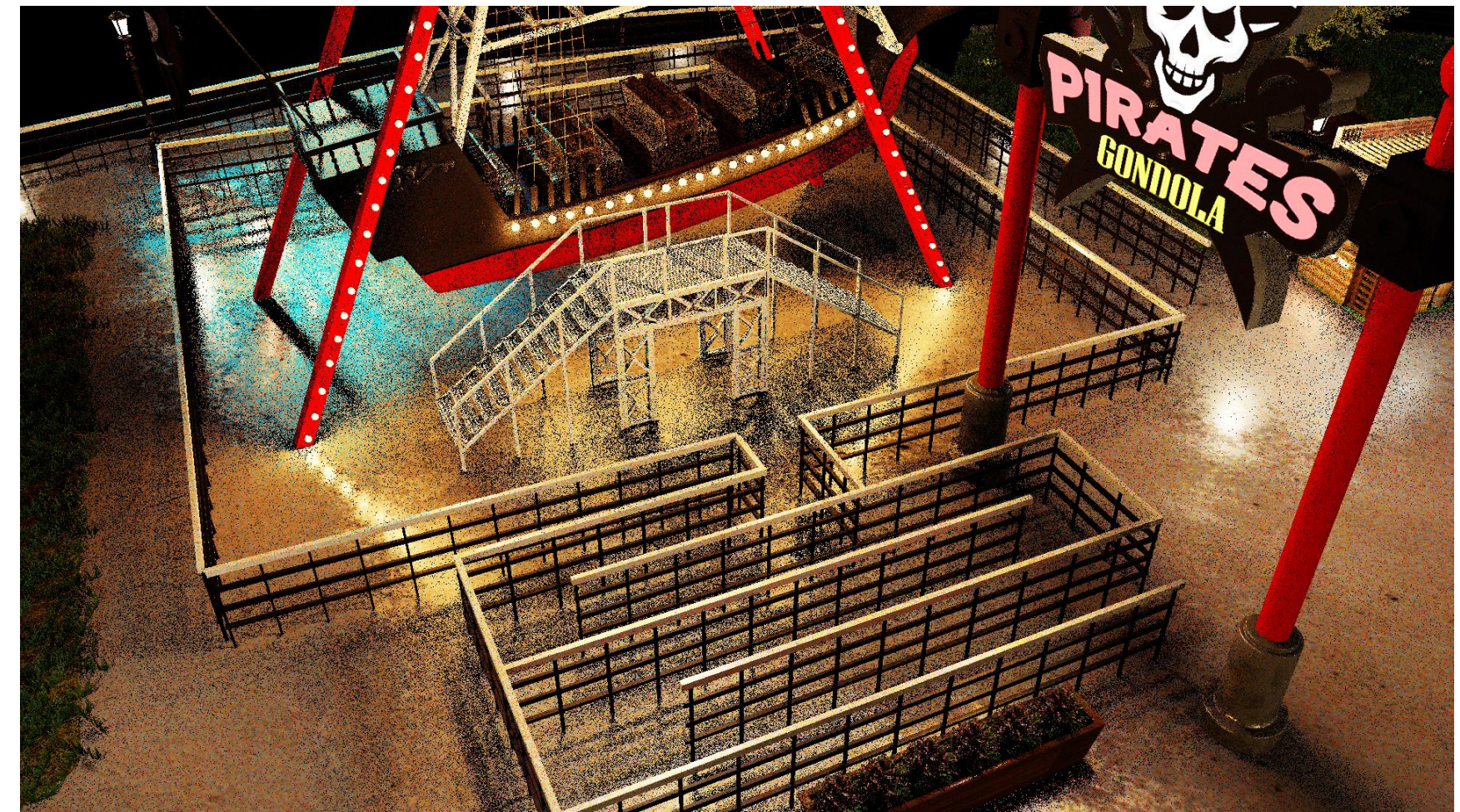
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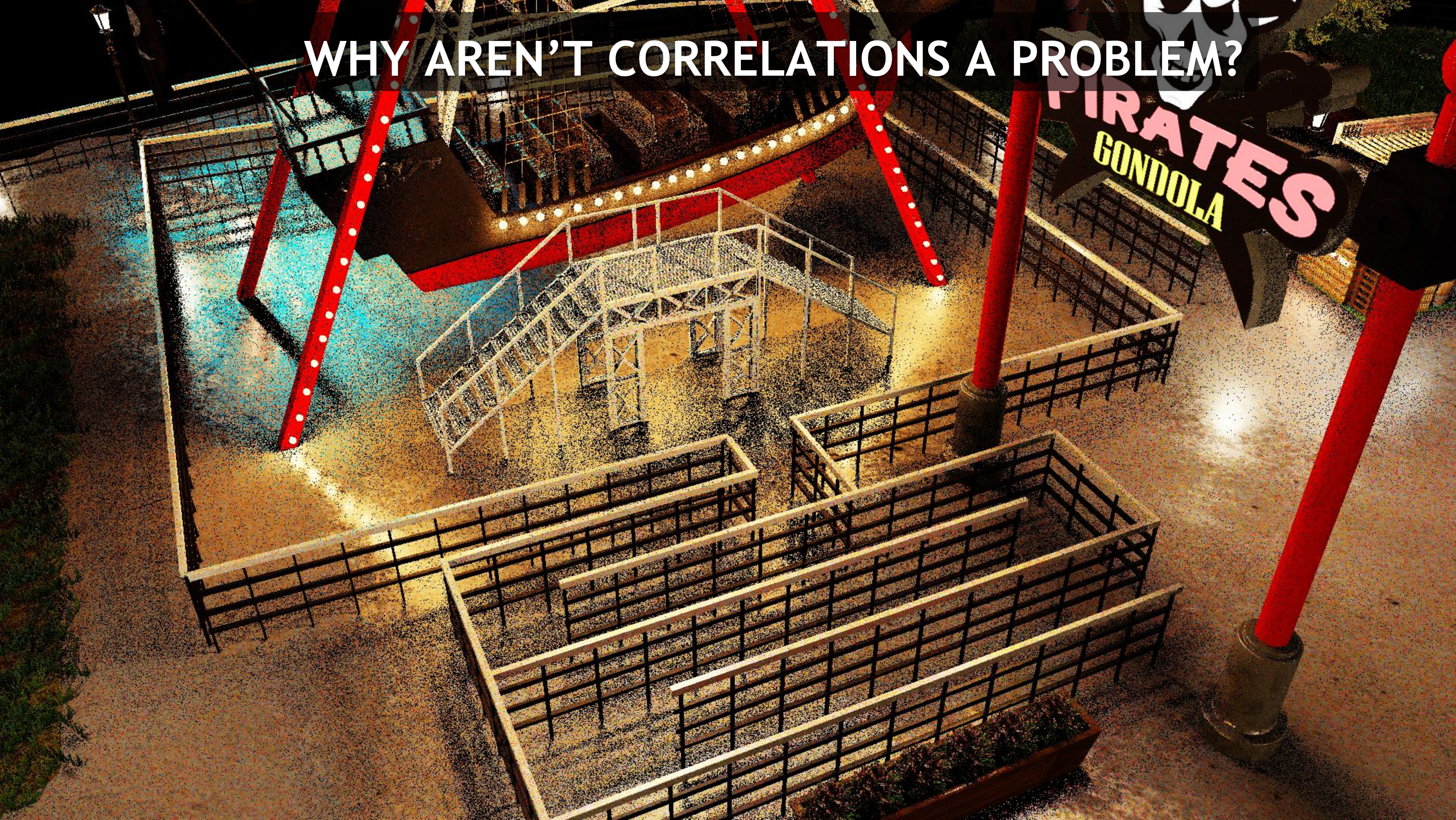
Reused over 8x8 pixel tile; each pixel selects 32 lights

Applying spatiotemporal resampling hides minor correlations

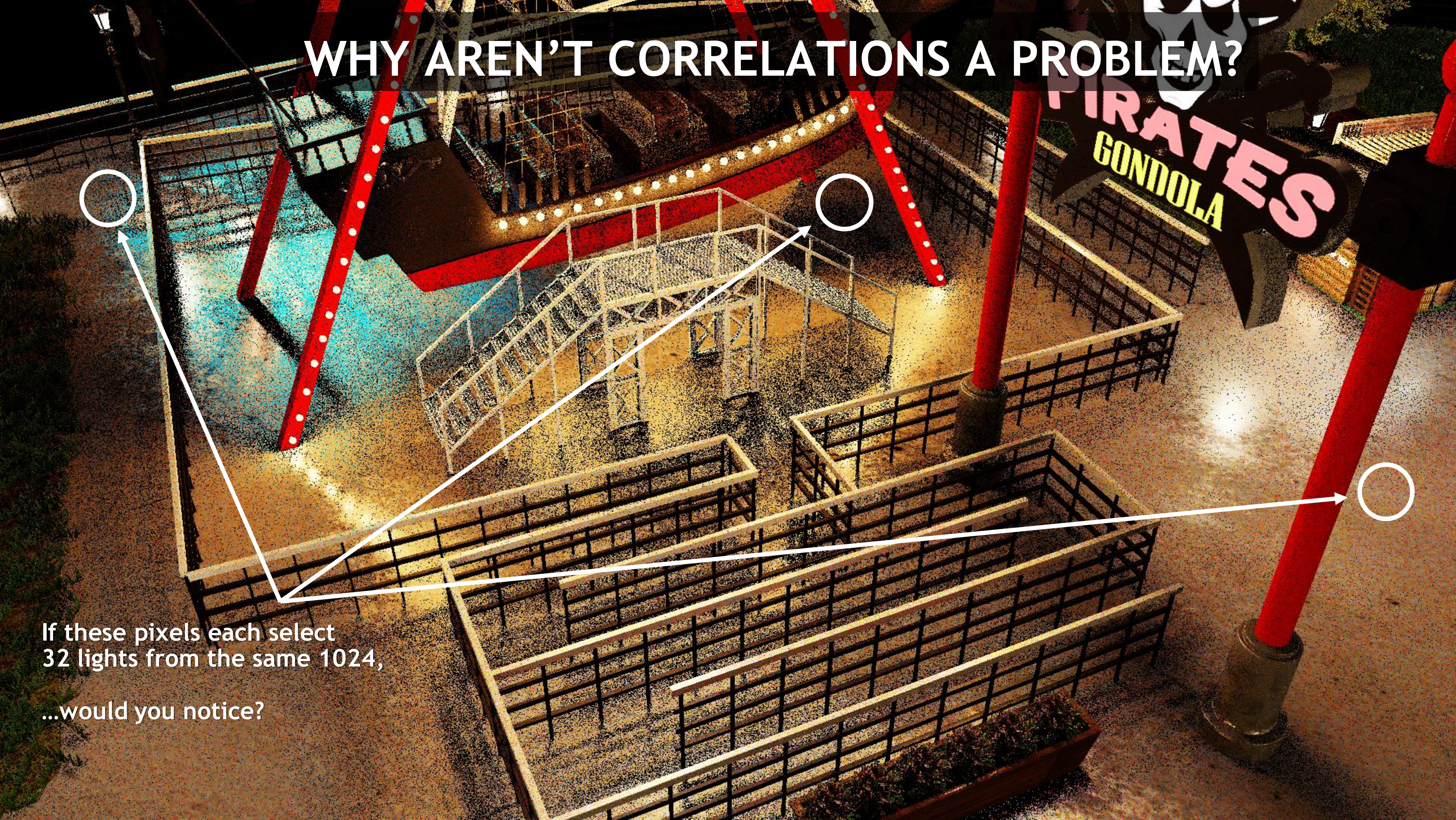


Sampling quality indistinguishable; 21x faster candidate sampling here
18.1 ms → 0.84 ms

WHY AREN'T CORRELATIONS A PROBLEM?

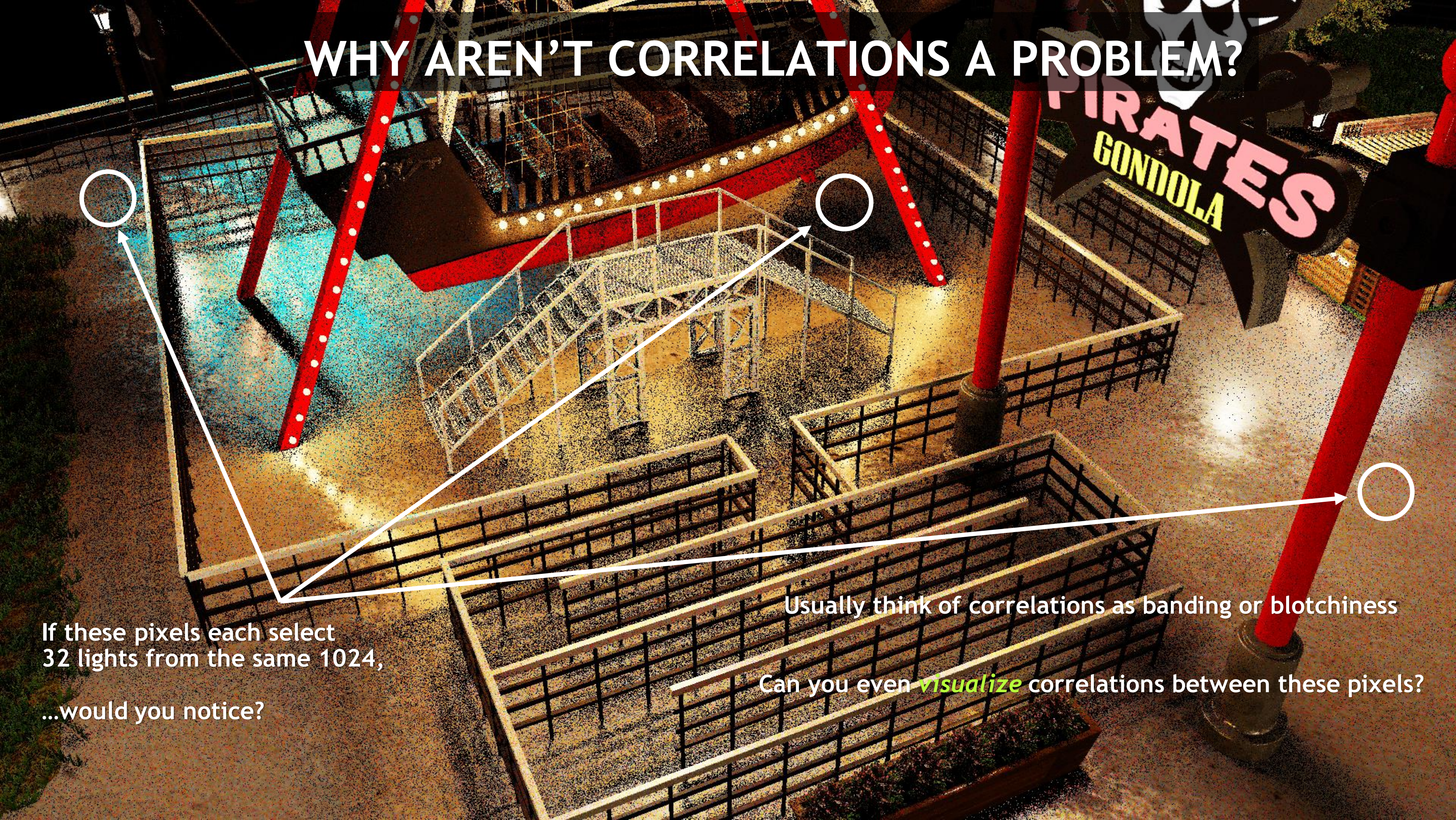


WHY AREN'T CORRELATIONS A PROBLEM?



If these pixels each select
32 lights from the same 1024,
...would you notice?

WHY AREN'T CORRELATIONS A PROBLEM?



If these pixels each select
32 lights from the same 1024,
...would you notice?

Usually think of correlations as banding or blotchiness

Can you even *visualize* correlations between these pixels?



REDUCING RAY TRACING
COSTS

CAREFUL SHADOW RAY SELECTION

Tracing rays has significant cost; up to 60% of original ReSTIR costs

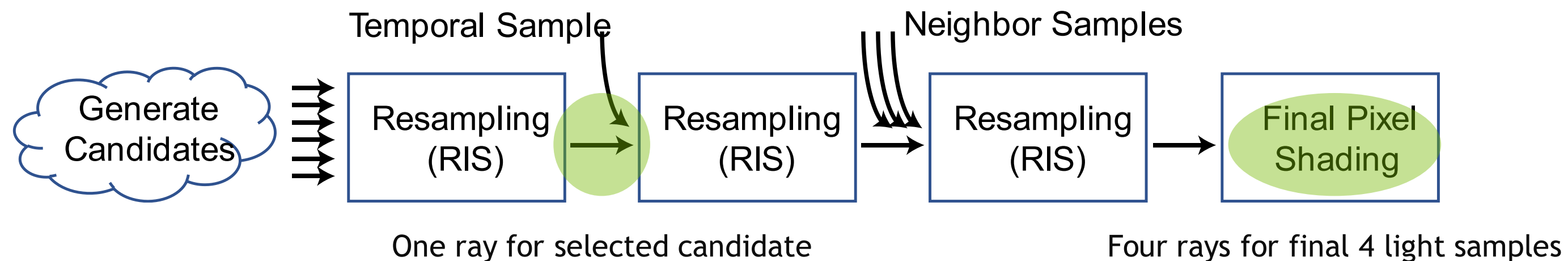
CAREFUL SHADOW RAY SELECTION

Tracing rays has significant cost; up to 60% of original ReSTIR costs

Bitterli et al. [2020] traced 5 rays per pixel

Some modern games use $\frac{1}{4}$ rays per pixel; so up to 20x current budgets!

Why 5 rays? How important are these?



WHICH RAYS ARE IMPORTANT?



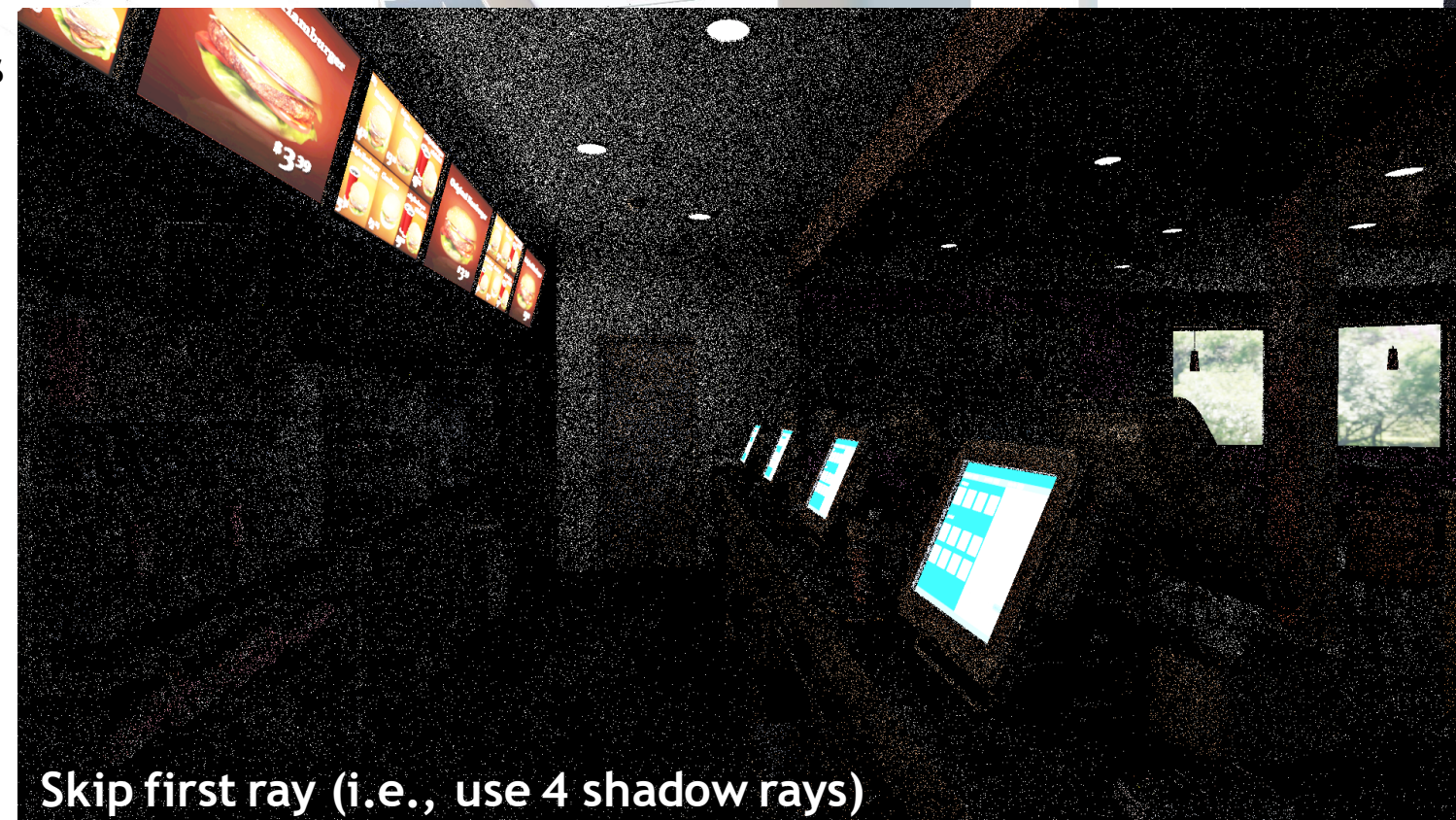
WHICH RAYS ARE IMPORTANT?



No shadow rays



All 5 shadow ray



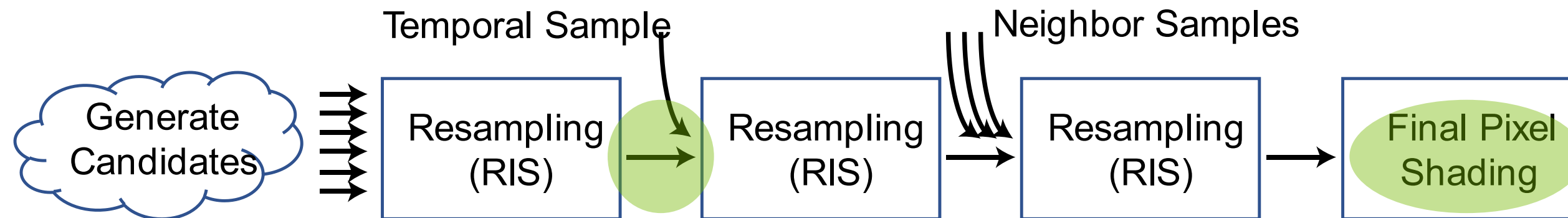
Skip first ray (i.e., use 4 shadow rays)



Use only first ray

FIRST RAY IS MOST IMPORTANT

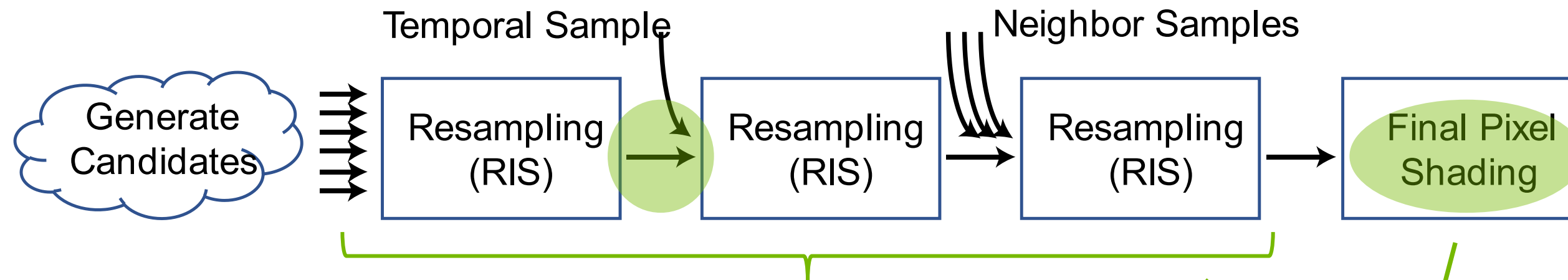
It prevents sample pollution (reusing really bad lights)...



Why allocate 1 important shadow ray and 4 less-important rays?

FIRST RAY IS MOST IMPORTANT

It prevents sample pollution (reusing really bad lights)...



Why allocate 1 important shadow ray and 4 less-important rays?

Idea: ReSTIR generally does not reduce visibility noise

So, need extra samples to reduce variance in final visibility

$$F \approx \frac{1}{N} \sum_{i=1}^N \left[\frac{f(\omega_i)}{\hat{p}(\omega_i)} \frac{1}{M} \sum_{j=1}^M \frac{\hat{p}(\omega_{ij})}{q(\omega_{ij})} \right]$$

HOW MUCH NEW INFORMATION DO 4 RAYS GIVE?



HOW MUCH NEW INFORMATION DO 4 RAYS GIVE?

White = All 4 samples duplicates
Black = All 4 samples unique

HOW MUCH NEW INFORMATION DO 4 RAYS GIVE?

Using 4 samples is least useful in shadowed regions

White = All 4 samples duplicates
Black = All 4 samples unique

HOW MUCH NEW INFORMATION DO 4 RAYS GIVE?

Having 4 unique samples isn't useful here; ReSTIR does fine where visibility is stable

White = All 4 samples duplicates
Black = All 4 samples unique

TAKE AWAY: NO MORE THAN 2 RAYS NEEDED!

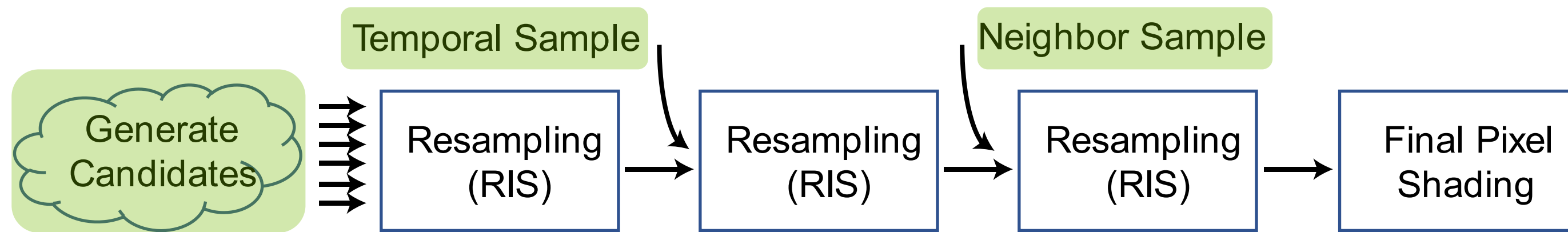
Extra rays wasted most of the time



DECOUPLING SHADING AND REUSE

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Decreasing parameters → Uncovered some “wasted” work going underused in ReSTIR



Each frame, we touch $M+2$ light samples

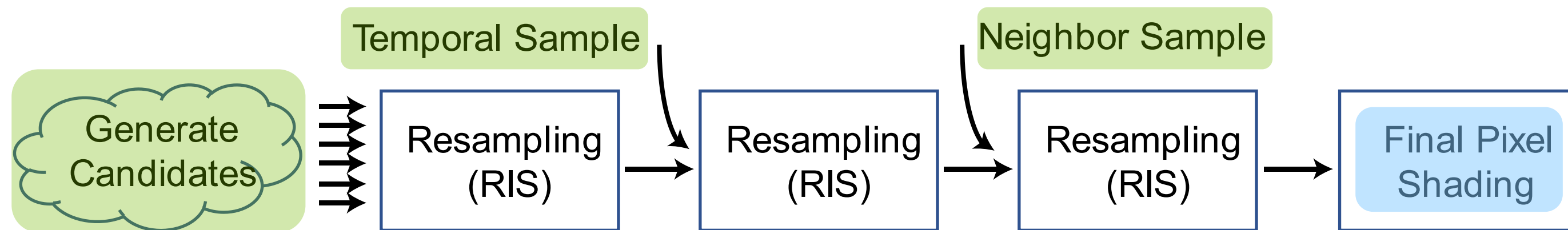
M initial candidates (32 in our paper)

1 reused temporal light

1 reused spatial light

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Each frame, we touch $M+2$ light samples

But we only shade one!

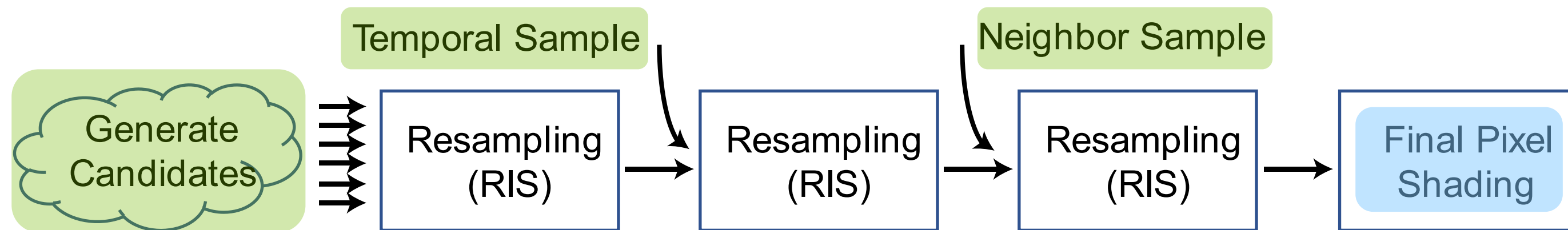
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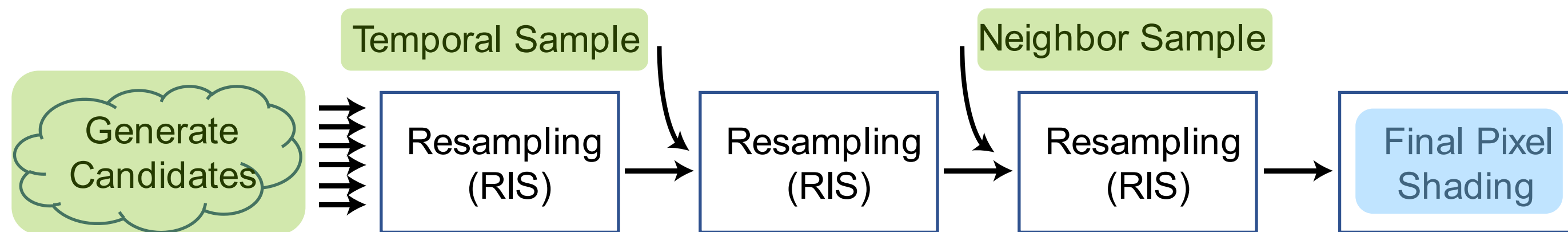
But we only shade one!

Do all computations for others

(Except shadow queries)

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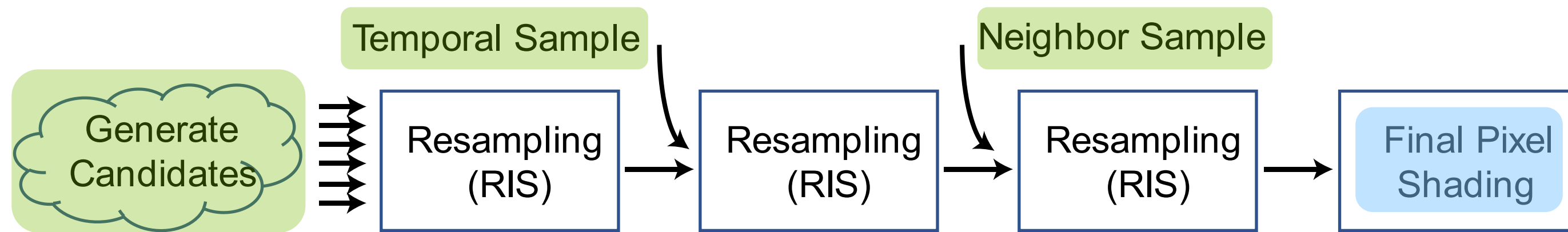
Goals of shading & reuse different

Shading = best quality this frame

Reuse = best quality in future

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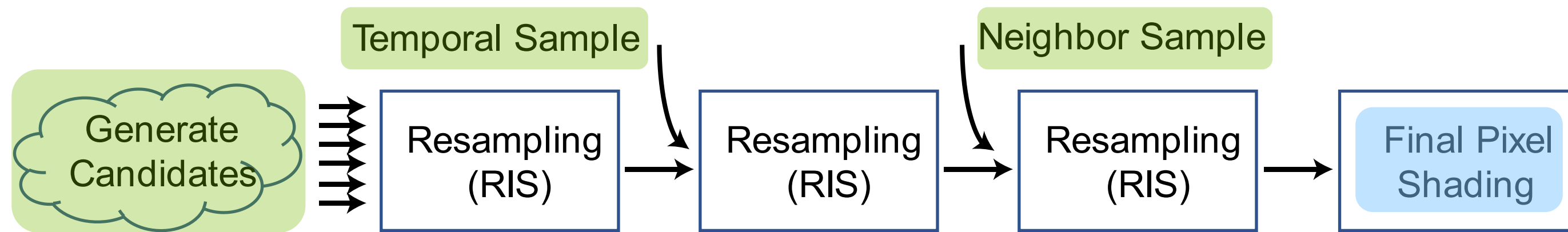
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Why not use all $M+2$ to shade?

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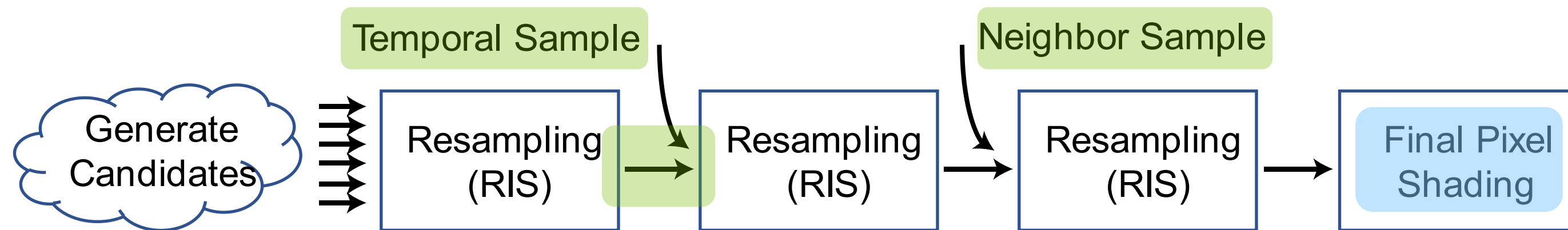
1 reused spatial light

Why not use all $M+2$ to shade?

... too many shadow rays!

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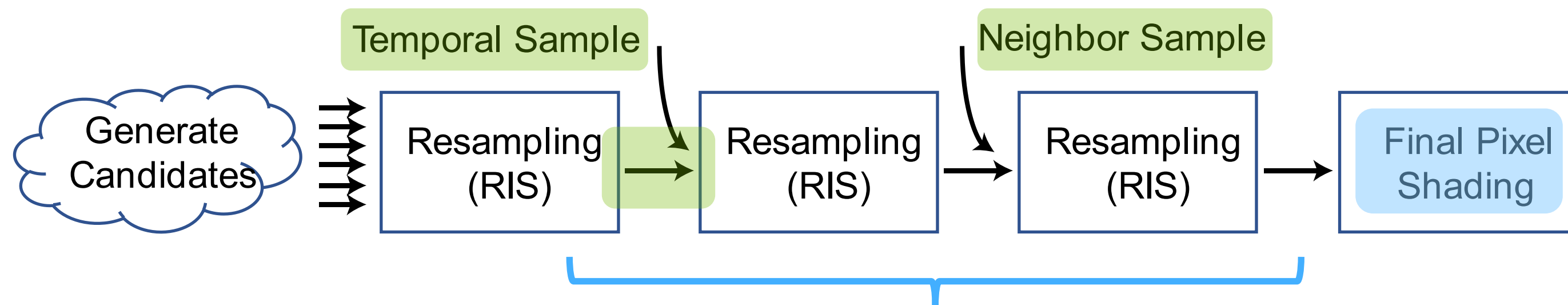


What if we ignore the M candidates?

Realize first RIS pass selects just one

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What if we ignore the M candidates?

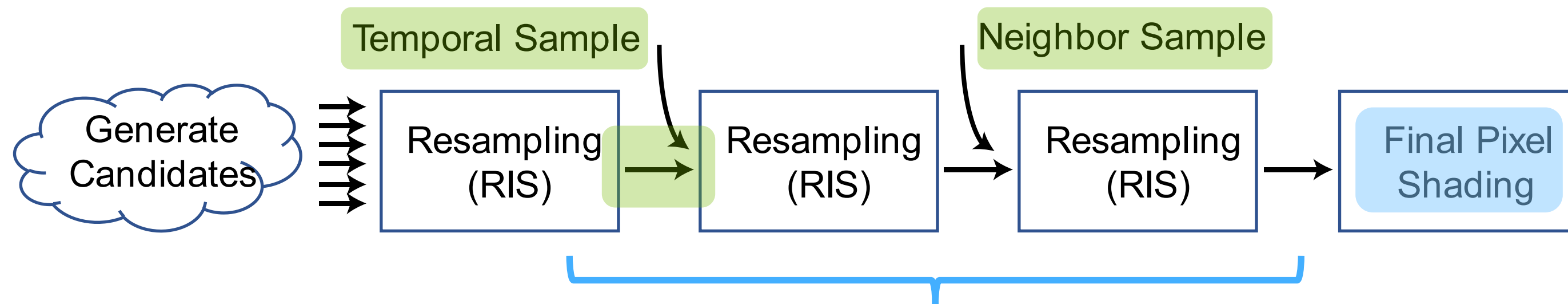
Realize first RIS pass selects just one

Three light samples; one selected for shading

Why not shade all three?

DECOUPLING SHADING AND REUSE

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What if we ignore the M candidates?

Realize first RIS pass selects just one

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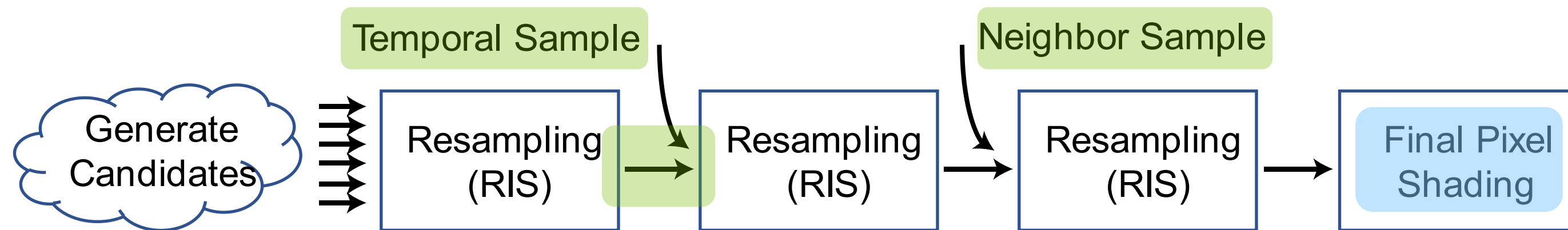
Why not shade all three?

... requires 3 rays per pixel (instead of 2)

... but also increase image quality

DECOUPLING SHADING AND REUSE

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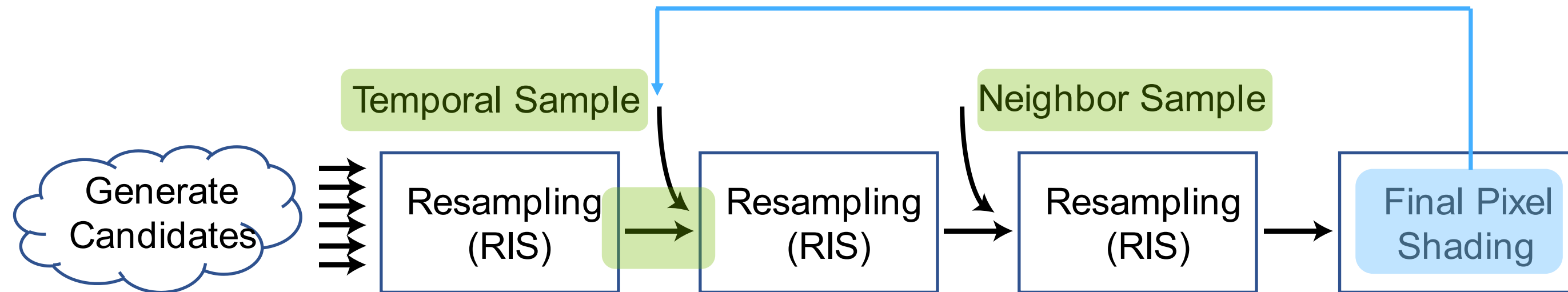


If we do this, consider...

Now have visibility for all 3 samples

DECOUPLING SHADING AND REUSE

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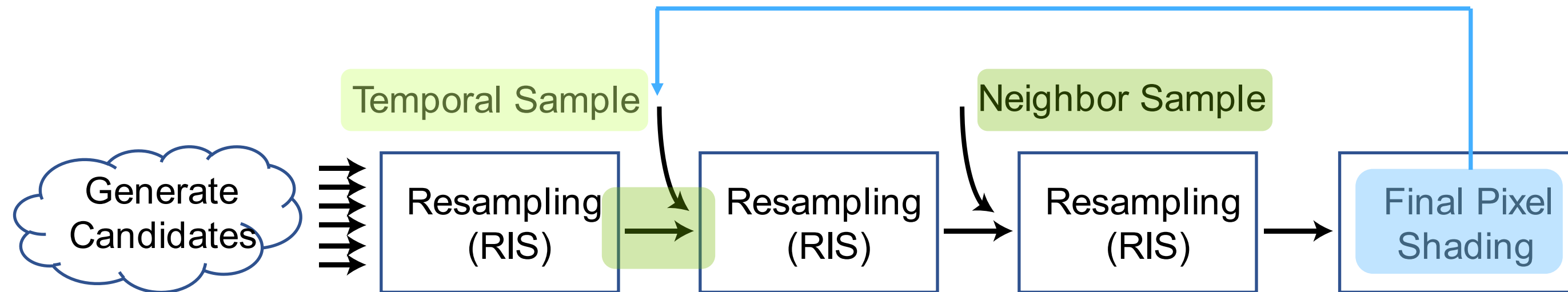
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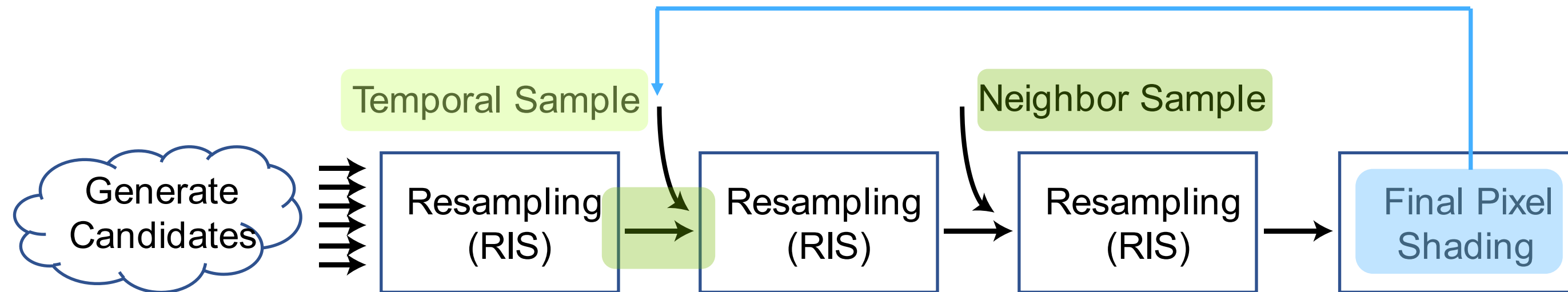
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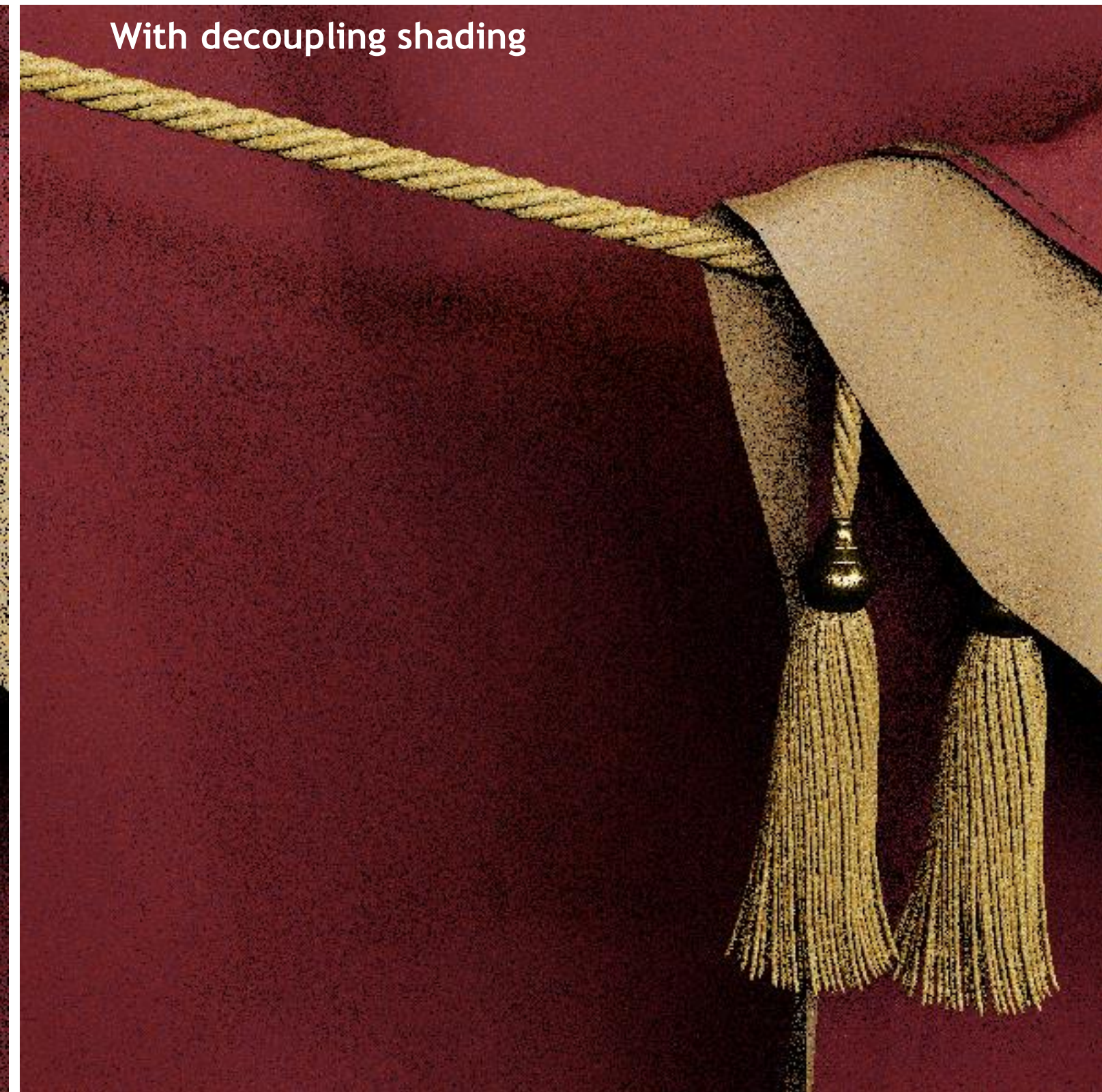
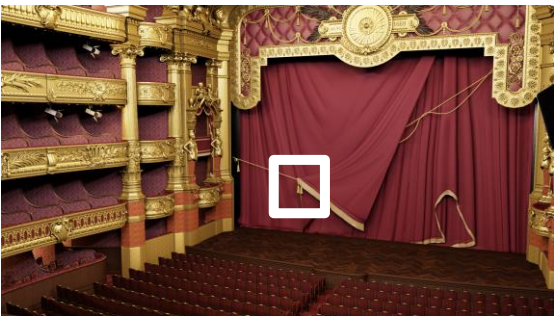
Reuse this visibility query? Then only 2 rays per pixel, again

May add some transient temporal bias

But I couldn't see to capture an example

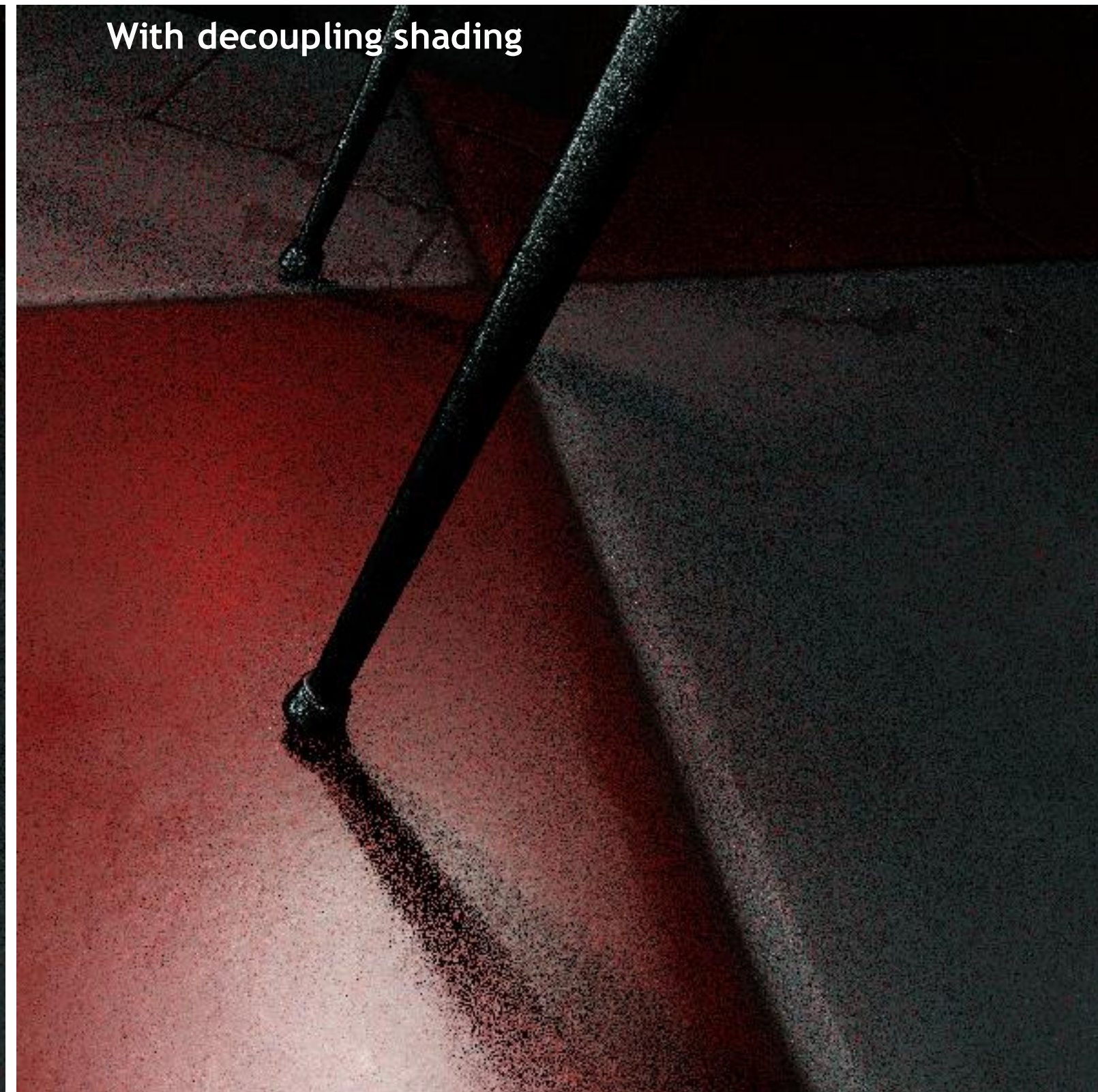
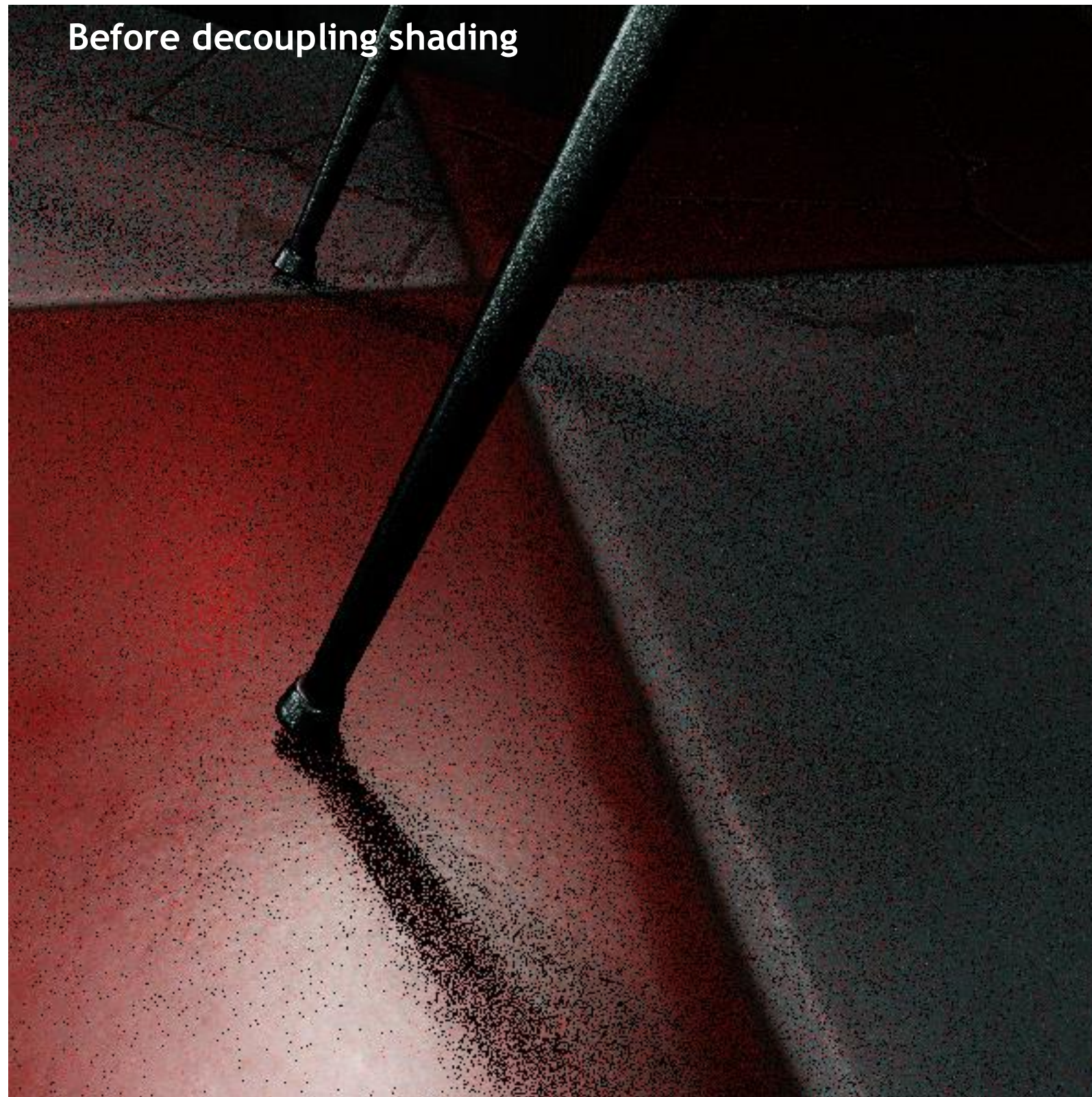
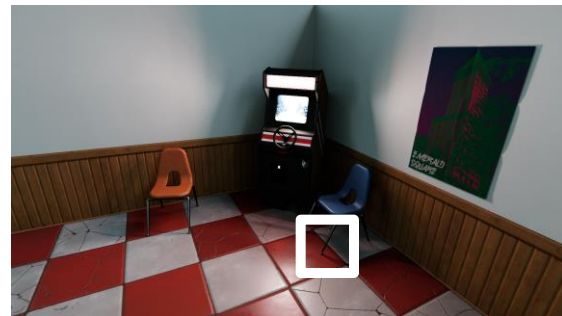
RESULTS OF DECOUPLING

Both the same cost; touching the same memory



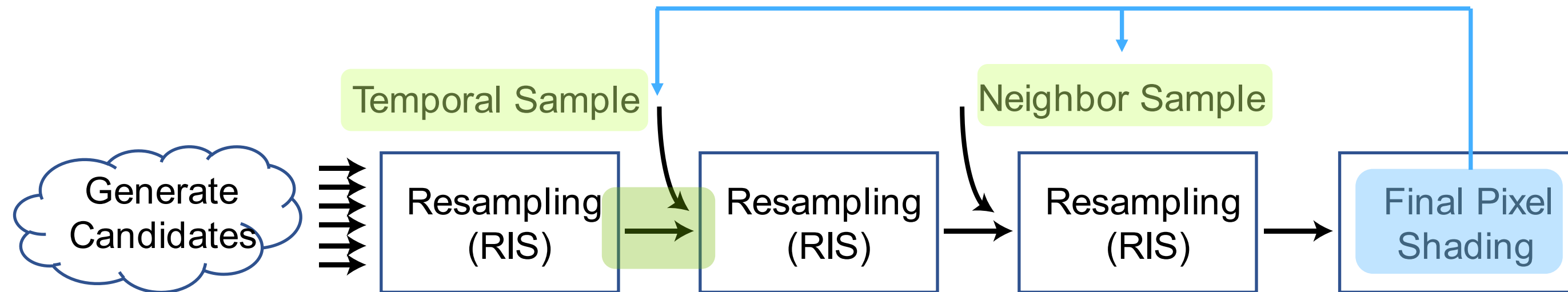
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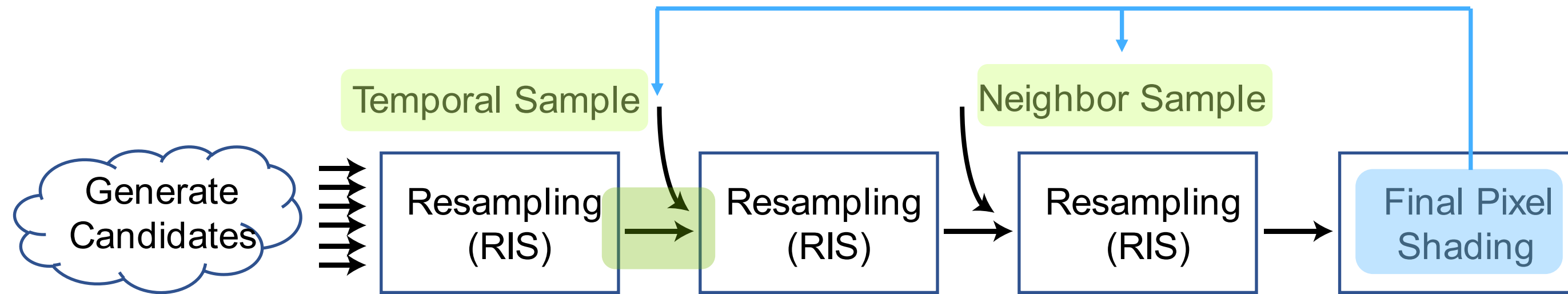


Can also ask:

Can we reuse visibility here? Reduces to 1 ray per pixel

DECOUPLING SHADING AND REUSE

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Can also ask:

Can we reuse visibility here? Reduces to 1 ray per pixel

This **does** add bias, but a controllable knob

TRADING QUALITY FOR PERFORMANCE

Reusing (some) neighbor shadow rays



2 rays per pixel
2.1 ms (3090)
6.3 ms (2080Q)

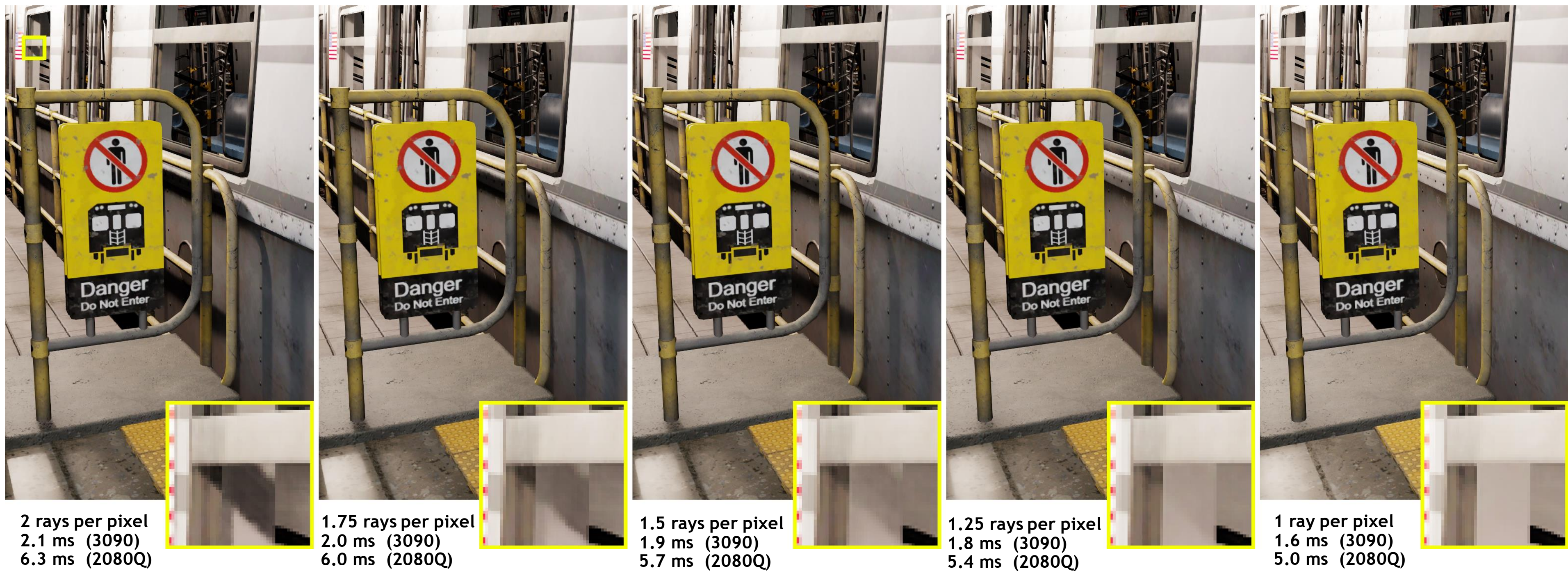
(No reuse for spatial samples)

1 ray per pixel
1.6 ms (3090)
5.0 ms (2080Q)

(Always reuse for spatial samples)

TRADING QUALITY FOR PERFORMANCE

Reusing (some) neighbor shadow rays



(No reuse for spatial samples)

Reuse visibility for neighbors within (varying) distances from current pixel

(Always reuse for spatial samples)



PERFORMANCE RESULTS

SOME PERFORMANCE COMPARISONS

On GeForce RTX 3090



Ours	Presampling	Candidates	Trace Rays	Reuse & Shade	Total Lighting
	0.02 ms	0.8 ms	0.5 ms	0.6 ms	1.9 ms

Bitterli et al.	Candidates	First Ray	Reuse	Shade & Trace	Total Lighting
	1.3 ms	0.3 ms	2.9 ms	2.1 ms	8.4 ms

Note: Times do not sum to total, thanks to uncounted synchronization costs

SOME PERFORMANCE COMPARISONS

On GeForce RTX 3090



Ours

Presampling	Candidates	Trace Rays	Reuse & Shade	Total Lighting
0.02 ms	0.8 ms	0.5 ms	0.6 ms	1.9 ms

Bitterli et al.

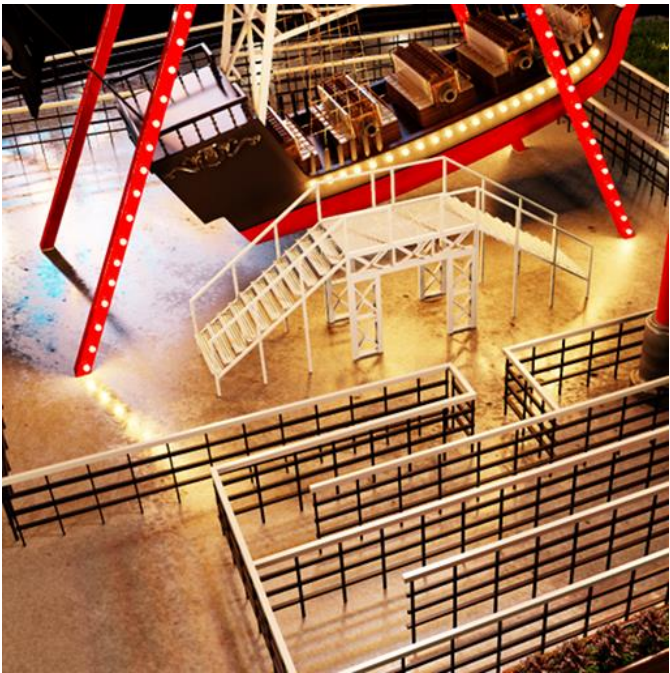
Candidates	First Ray	Reuse	Shade & Trace	Total Lighting
1.3 ms	0.3 ms	2.9 ms	2.1 ms	8.4 ms

Note: Times do not sum to total, thanks to uncounted synchronization costs

4.4x faster

SOME PERFORMANCE COMPARISONS

On GeForce RTX 3090



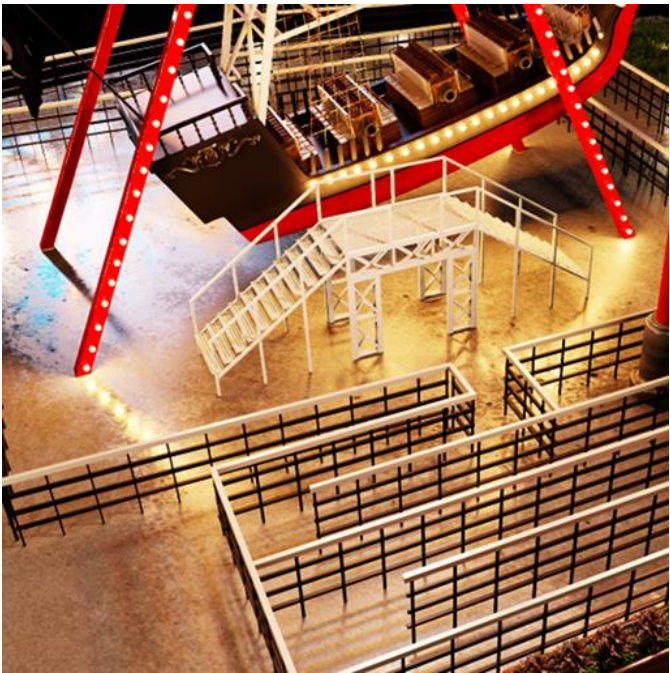
Ours	Presampling	Candidates	Trace Rays	Reuse & Shade	Total Lighting
	0.04 ms	0.8 ms	3.1 ms	0.6 ms	4.6 ms

Bitterli et al.	Candidates	First Ray	Reuse	Shade & Trace	Total Lighting
	18.3 ms	2.6 ms	3.9 ms	4.3 ms	31.0 ms

Note: Times do not sum to total, thanks to uncounted synchronization costs

SOME PERFORMANCE COMPARISONS

On GeForce RTX 3090



Ours

Presampling	Candidates	Trace Rays	Reuse & Shade	Total Lighting
0.04 ms	0.8 ms	3.1 ms	0.6 ms	4.6 ms

Bitterli et al.

Candidates	First Ray	Reuse	Shade & Trace	Total Lighting
18.3 ms	2.6 ms	3.9 ms	4.3 ms	31.0 ms

Note: Times do not sum to total, thanks to uncounted synchronization costs

6.7x faster

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Reshape computations, moving incoherent candidate generation out of inner loop

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Specific improvements:

- Reshape computations, moving incoherent candidate generation out of inner loop

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- Decouple sample shading and reuse; allows shading more than we reuse

Other aspects discussed in the paper:

- Reduce spatial samples reused; removed samples had high cost and little quality impact

- Unify heuristic-based techniques and MIS for reducing bias and noise

- Intuitive visual discussion of bias

- Aggregate ReSTIR math in one place



THANKS!

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Exemplar code & sample app:
<https://developer.nvidia.com/rtxdi>



