

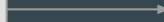
Joint Bilateral Upsampling

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Joyce Zhang, Jason Xu

Problem Description

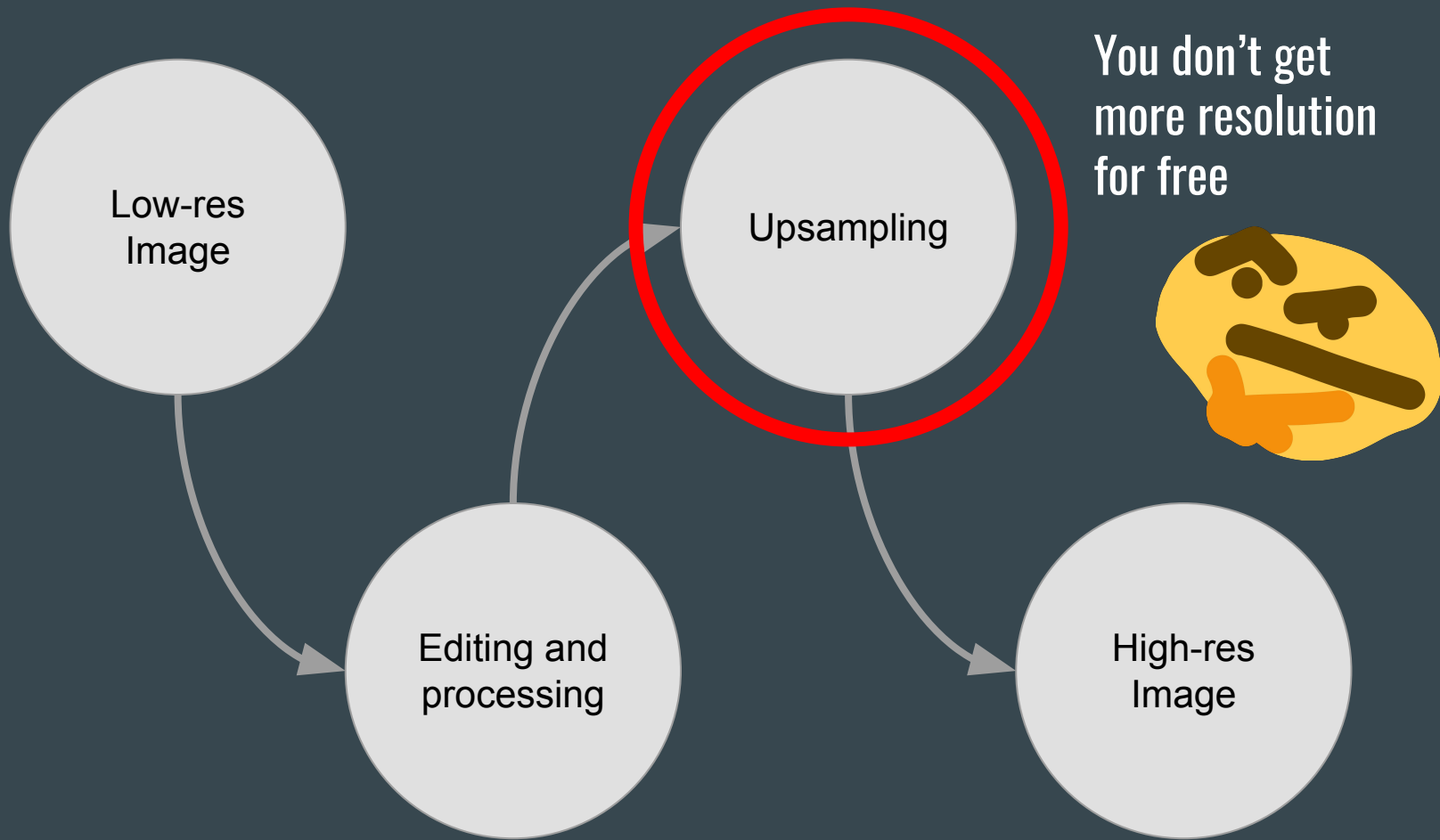
Images undergoing
resource-intensive
processing
(HDR tonemapping,
image stitching,
etc.)



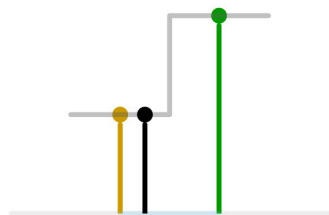
Compression

or

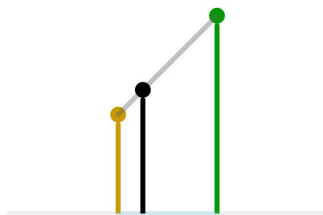
Low resolution info
(e.g. LiDAR depth
map)



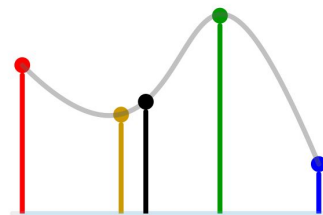
Common Upsampling Methods



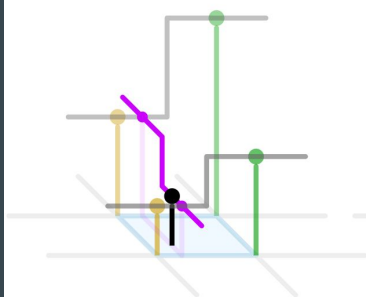
1D nearest-neighbour



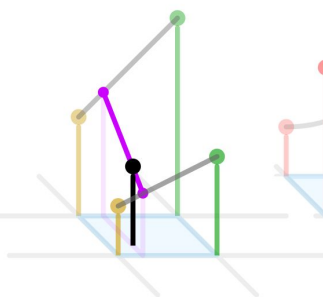
Linear



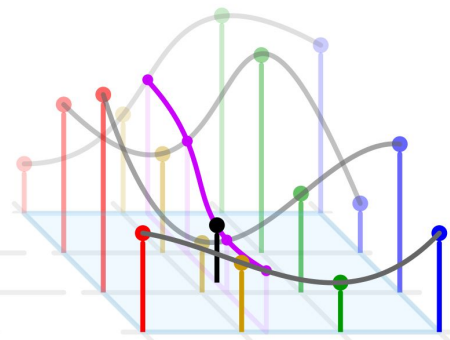
Cubic



2D nearest-neighbour



Bilinear



Bicubic

Bilateral & Joint Bilateral Filtering

Bilateral Filtering

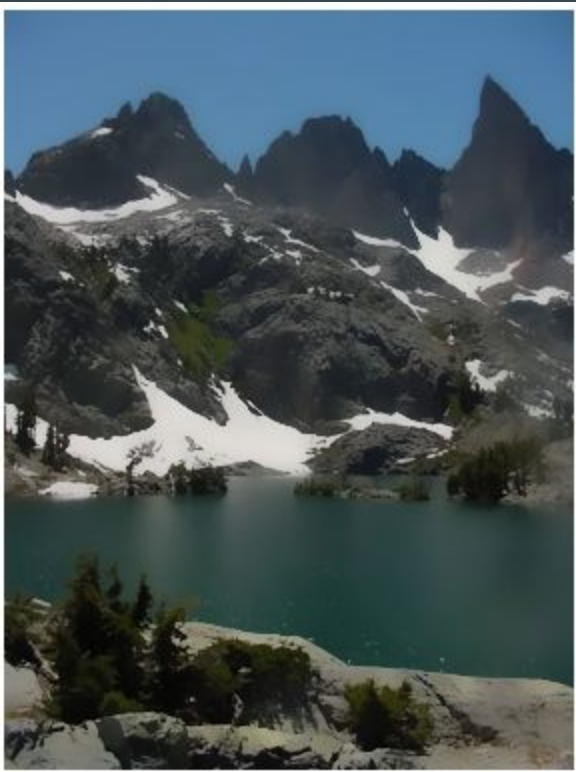
$$BF[I]_p = \frac{1}{W_p} \sum_{q \in S} G_{\sigma_s}(\|p - q\|) G_{\sigma_r}(|I_p - I_q|) I_q$$

Diagram illustrating the components of the Bilateral Filtering equation:

- Normalization Factor:** $\frac{1}{W_p}$
- Space Weight:** $G_{\sigma_s}(\|p - q\|)$
- Range Weight:** $G_{\sigma_r}(|I_p - I_q|)$

Visual representations of the weights:

- Space Weight:** A 2D Gaussian kernel visualization (a bright spot in the center fading to black).
- Range Weight:** A 1D Gaussian kernel visualization (a bell curve).



**Maybe we can use the intensity
kernel of another image?**

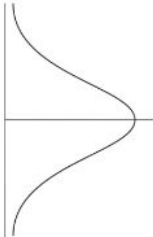
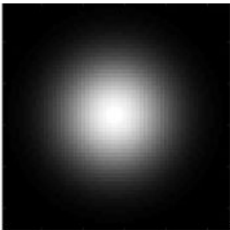
Joint Bilateral Filtering

$$BF[I]_p = \frac{1}{W_p} \sum_{q \in S} G_{\sigma_s}(\|p - q\|) G_{\sigma_r}(\|I_p - I_q\|) I_q$$

Diagram illustrating the components of the Joint Bilateral Filtering equation:

- Normalization Factor:** $\frac{1}{W_p}$
- Space Weight:** $G_{\sigma_s}(\|p - q\|)$
- Range Weight:** $G_{\sigma_r}(\|I_p - I_q\|)$

The Range Weight term is highlighted with a red oval and an arrow pointing to the text: "Replace with intensity kernel from another image".





Bilateral filter denoising



Joint bilateral filter denoising
(Intensity kernel from flash image)

Method in Paper

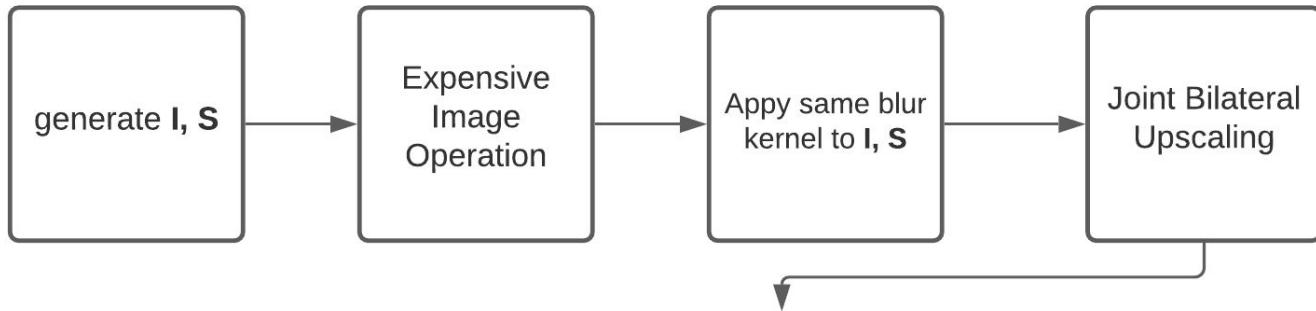
High Level Idea: Get the color information from the low res, and the details from the original.

S Low-resolution image

p_{\downarrow} and q_{\downarrow}
corresponding (possibly
fractional) coordinates

\tilde{I} full resolution image

p and q
integer coordinates

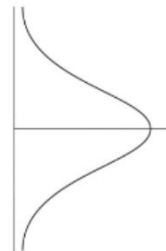
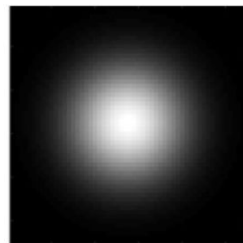


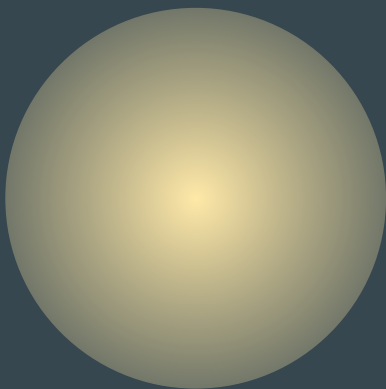
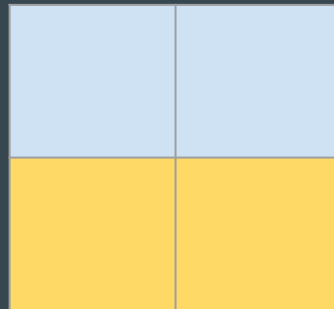
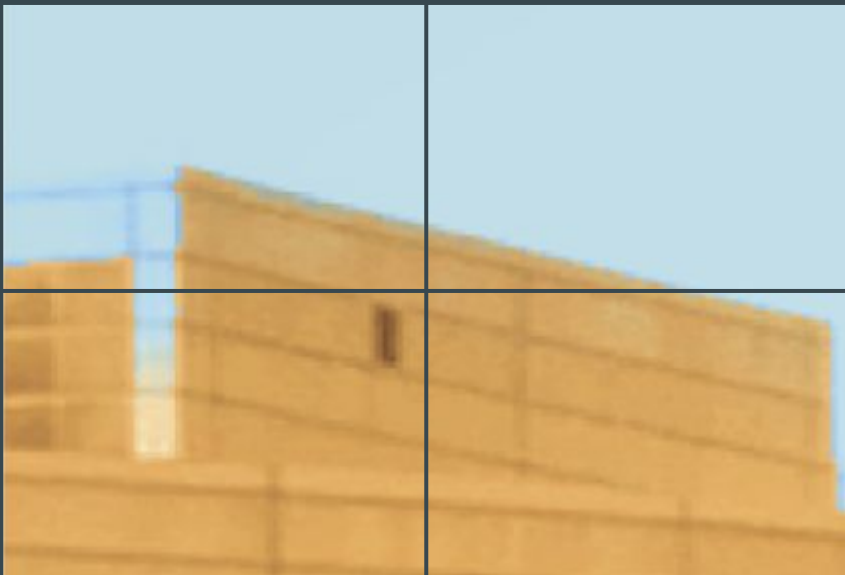
$$\tilde{S}_p = \frac{1}{k_p} \sum_{q_{\downarrow} \in \Omega} S_{q_{\downarrow}} f(\|p_{\downarrow} - q_{\downarrow}\|) g(\|\tilde{I}_p - \tilde{I}_q\|)$$

Spatial Range

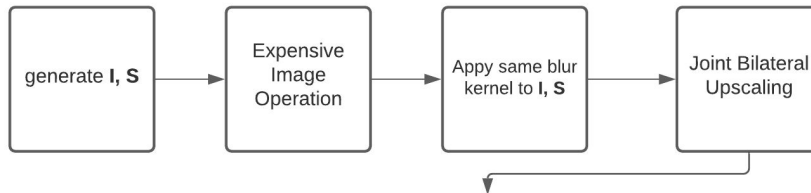
Range Weight

Note, that q_{\downarrow} takes only integer coordinates in the low resolution solution. Therefore the guidance image is only sparsely sampled process





High Level Idea: Get the color information from the low res, and the details from the original.



$$\tilde{S}_p = \frac{1}{k_p} \sum_{q_{\downarrow} \in \Omega} S_{q_{\downarrow}} f(\|p_{\downarrow} - q_{\downarrow}\|) g(\|\tilde{I}_p - \tilde{I}_q\|)$$

Spatial Range

Range Weight

Note, that q_{\downarrow} takes only integer coordinates in the low resolution solution. Therefore the guidance image is only sparsely sampled process

$O(Nr^2)$ where N is the output image size and r is the domain filter radius

Expensive Image operations such as...

- Stereo Depth
- Colorization
- Tone Mapping

Let's look at some examples...

Results

Colorization (Levin, Colorization using optimization)

Colorized black and white image based on user input



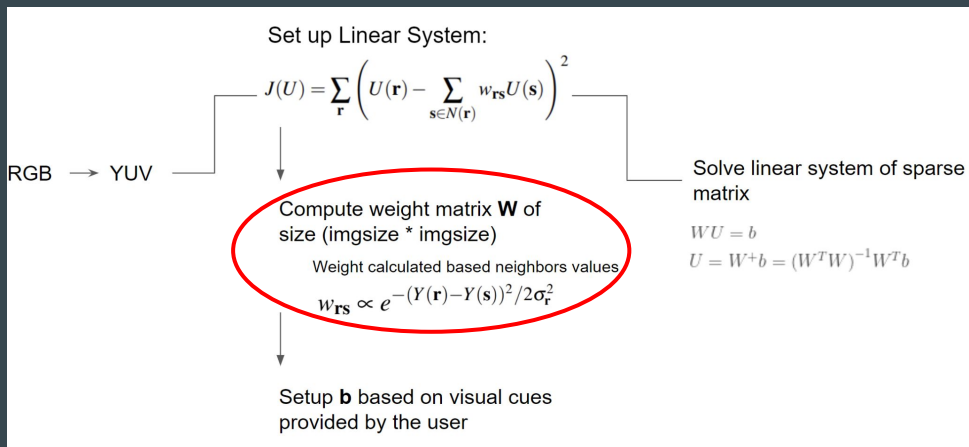
Algorithm:

Most important point:

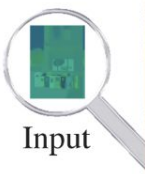
Problem gets a lot more complex the more pixels you have

But colorization results are better with more user input

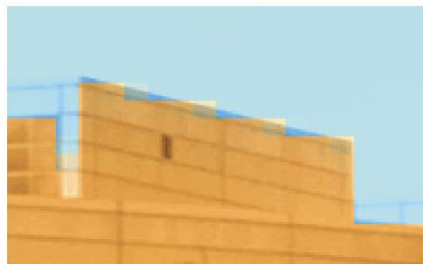
Which is why upsampling is desired!



From Joyce's CompPhoto Project last semester.



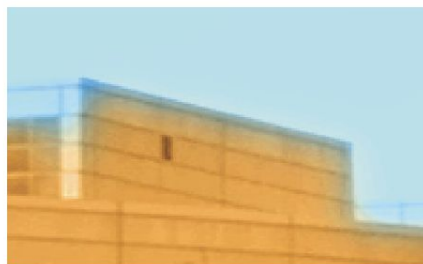
Upsampled Result



Nearest Neighbor Upsampling



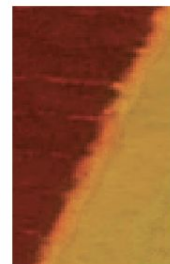
Bicubic Upsampling



Gaussian Upsampling



Joint Bilateral Upsampling



The low resolution pseudo-colored chrominance solution is at left. Note that the JBU result does not exhibit color spills!

Tone Mapping



Upsampled Result



Nearest Neighbor



Bicubic



Gaussian



Joint Bilateral



Ground Truth

Discussion

- Simple and massively resource-saving
 - ◆ Reduces thrashing
 - ◆ Only requires single sweep
- Limitation: Can only be applied to image processing that doesn't alter the scene layout
 - ◆ Adding a cloud in the low resolution will not translate well through upscaling as there's no information/detail to support it
 - ◆ If applying perceptive transformations into low resolution, similar changes also need to be applied to high resolution

References

- Joint Bilateral Upsampling, SIGGRAPH 2007
 - https://johanneskopf.de/publications/jbu/paper/FinalPaper_0185.pdf
- Image scaling, Wikipedia
 - https://en.wikipedia.org/wiki/Image_scaling
- Bilateral Filter, Wikipedia
 - https://en.wikipedia.org/wiki/Bilateral_filter
- Python: Bilateral Filtering, GeeksForGeeks
 - <https://www.geeksforgeeks.org/python-bilateral-filtering/>
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