GPU Based Bilateral Filtering for Images

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*Abstract*—A Bilateral filter smooths images while preserving edges, this is accomplished through nonlinear combination of a neighborhood of image values. The method combines colors or intensities based on geometric closeness and photometric similarities. Bilateral filters can enforce the perception metric of the CIE-Lab color space to smooth colors and preserve edges tuned to human perception. Bilateral filtering has the added benefit of an absence of phantom colors along the edges of a color image. A naïve, iterative solution to Bilateral filtering will iterates over all the input image’s pixels. The iterative and local nature of this algorithm has tremendous potential for parallel GPU implementations. (LENGTHEN)

Keywords—bilateral; parallel; filtering; GPU

# Introduction

One of the most fundamental operations of computer vision and image processing is filtering. Broadly defined, a value of a filtered image at some location is a function of color or intensity values in a neighborhood about the location. For example, a Gaussian low-pass filter, one of the most commonly used filters, computes a weighted average value for the location in question. The weights are computed to have a higher weight for values nearby the location and lower weights for values further away. A more formal explanation of the weight fall-off can be found [1], intuitively an image varies little over a small space, thus nearby pixels are going to be similar. By averaging these pixels together, the image function is smoothed and noise is removed.

The assumption of a slow spatial variation fails at edge cases, a pure Gaussian filter will blur image edges as it does not consider legitimate variations in pixel intensities or color values. This is a major issue for computer vision applications, cameras inherently introduce noise which could negatively alter feature matching techniques however if a standard Gaussian filter is applied to the image edge information can be completely lost. Edge based segmentation for example look for abrupt changes in intensity. However, if an image is not smoothed than false edges can be detected. There have been attempts to reduce the effect of smoothing as well as do without smoothing altogether [2] [3].

One popular answer to this problem is anisotropic diffusion [4]. In this approach, the local image variation is measured at every point with pixel values being averaged from neighborhoods with size and shape depending on local variation. Diffusion methods average over an extended region through solving partial differential equations and are thus iterative inherently. In addition to possible efficiency issues, iteration can raise issues of stability.

A scheme introduced by C. Tomasi and R. Manduchi [5] provides a non-iterative and simple scheme for smoothing that preserves edges. The basic idea of this approach is to do what traditional filters do in the image domain, in the image range. Two pixels can either be spatially near each other or have values near each other, in a perceptually meaningful way. Closeness is specific to the vicinity in the domain, while similarity refers to the vicinity in the range. A traditional filter is filters by domain, enforcing closeness by weighing pixel values with coefficients which fall off over a distance. Range filtering on the other hand, averages image values with weights decaying by similarity. A range filter is nonlinear as weights depend on intensity or color of the image.

In the scheme, spatial locality is not altogether disregarded. Range filtering alone will only distort the image’s color map. Thus, the scheme combines range and domain filtering. This is what is referred to as *bilateral* filtering [5].

As this *bilateral* filters have an explicit definition for distance in an image function’s domain and range, they can be applied to any function in which these distances can be defined. Applying this filter to a color image is just as simple as applying to black-and-white images. The CIE-Lab color space gives the color space a meaningful measure of color similarity which in short distances correlate with human color discrimination performance. A bilateral filter often uses this metric as it provides a smooth image with edges that are preserved in a way that is tuned to human performance. In other words, colors that are perceptually similar are averaged together and perceptually visible edges are preserved.

This scheme introduced by C. Tomasi and R. Manduchi [5] is non-iterative and so each pixel must only be evaluated once. This is a perfect candidate for implementation in a massively multi-threaded environment such as a GPU which is made up of hundreds if not thousands of computation units providing excellent throughput [6]. With no one output pixel depending on the output of another pixel and a pixel’s output depending upon a single set of calculations, a GPU’s high throughput can be used to great effect.

# Overview

A low-pass filter applied to an image produces an output defined as:

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where is the measure of the closeness in geometric terms between the center and a point nearby . Both the output function **h** and input function **f** can be multiband. If low-pass filtering is to preserve the dc component of low-pass signals

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| --- | --- | --- |
|  |  | 2 |

If filter is shift-invariant than is purely a function of the vector difference and will be constant.

Like domain filtering, range filtering is defined as:

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|  |  | 3 |

where is the measure of the photometric similarity between the pixel value at the center and some nearby point . The similarity function therefore deals with the range of the image function, while closeness function operates in the domain of the image function. The constant for normalization ( 2 ) is replaced in the range domain by

|  |  |  |
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Instead of depending on the distance from center as the function does, the normalization for the similarity function is dependent upon the image function. The similarity function is said to be *unbiased* if it depends on the difference alone.

In these equations, the spatial distribution of the image intensities has no role in range filtering alone. However, a combination of intensities from the entire image does not make much sense as values a large distance from should have no bearing on the final value at location . An appropriate solution to this shortcoming in range filtering is to combine both range and domain filtering into one filter. This achieves both geometric and photometric locality. Combination of the filters is simply:

|  |  |  |
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with the normalization as a simple combination of domain and range normalization

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The combination of the two filters is termed *bilateral filtering*. This filter replaces the pixel value at a point with an average of similar and nearby pixel values. Regions without edges have pixel values that are similar to each other which results in ( 4 ) being close to one. Thus, the filter in these regions is essentially a domain filter, averaging away weakly correlated pixel differences that are caused by noise. When considering a function which has

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Define abbreviations and acronyms the first time they are used in the text, even after they have been defined in the abstract. Abbreviations such as IEEE, SI, MKS, CGS, sc, dc, and rms do not have to be defined. Do not use abbreviations in the title or heads unless they are unavoidable.

## Units

* Use either SI (MKS) or CGS as primary units. (SI units are encouraged.) English units may be used as secondary units (in parentheses). An exception would be the use of English units as identifiers in trade, such as “3.5-inch disk drive”.
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Number equations consecutively. Equation numbers, within parentheses, are to position flush right, as in (1), using a right tab stop. To make your equations more compact, you may use the solidus ( / ), the exp function, or appropriate exponents. Italicize Roman symbols for quantities and variables, but not Greek symbols. Use a long dash rather than a hyphen for a minus sign. Punctuate equations with commas or periods when they are part of a sentence, as in

*a**b* 

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* The subscript for the permeability of vacuum **0, and other common scientific constants, is zero with subscript formatting, not a lowercase letter “o”.
* In American English, commas, semi-/colons, periods, question and exclamation marks are located within quotation marks only when a complete thought or name is cited, such as a title or full quotation. When quotation marks are used, instead of a bold or italic typeface, to highlight a word or phrase, punctuation should appear outside of the quotation marks. A parenthetical phrase or statement at the end of a sentence is punctuated outside of the closing parenthesis (like this). (A parenthetical sentence is punctuated within the parentheses.)
* A graph within a graph is an “inset”, not an “insert”. The word alternatively is preferred to the word “alternately” (unless you really mean something that alternates).
* Do not use the word “essentially” to mean “approximately” or “effectively”.
* In your paper title, if the words “that uses” can accurately replace the word “using”, capitalize the “u”; if not, keep using lower-cased.
* Be aware of the different meanings of the homophones “affect” and “effect”, “complement” and “compliment”, “discreet” and “discrete”, “principal” and “principle”.
* Do not confuse “imply” and “infer”.
* The prefix “non” is not a word; it should be joined to the word it modifies, usually without a hyphen.
* There is no period after the “et” in the Latin abbreviation “et al.”.
* The abbreviation “i.e.” means “that is”, and the abbreviation “e.g.” means “for example”.

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1. Table Type Styles

| Table Head | Table Column Head | | |
| --- | --- | --- | --- |
| Table column subhead | Subhead | Subhead |
| copy | More table copya |  |  |

1. Sample of a Table footnote. (*Table footnote*)
2. Example of a figure caption. (*figure caption*)

Figure Labels: Use 8 point Times New Roman for Figure labels. Use words rather than symbols or abbreviations when writing Figure axis labels to avoid confusing the reader. As an example, write the quantity “Magnetization”, or “Magnetization, M”, not just “M”. If including units in the label, present them within parentheses. Do not label axes only with units. In the example, write “Magnetization (A/m)” or “Magnetization {A[m(1)]}”, not just “A/m”. Do not label axes with a ratio of quantities and units. For example, write “Temperature (K)”, not “Temperature/K”.

##### Acknowledgment *(Heading 5)*

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1. G. Eason, B. Noble, and I. N. Sneddon, “On certain integrals of Lipschitz-Hankel type involving products of Bessel functions,” Phil. Trans. Roy. Soc. London, vol. A247, pp. 529–551, April 1955. *(references)*

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1. J. Clerk Maxwell, A Treatise on Electricity and Magnetism, 3rd ed., vol. 2. Oxford: Clarendon, 1892, pp.68–73.
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6. M. Young, The Technical Writer’s Handbook. Mill Valley, CA: University Science, 1989.