

Computational Photography



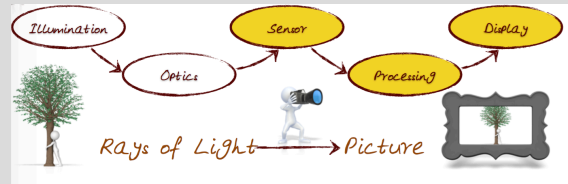
CS 4475/6475
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The Digital Image

- What is a Digital Image?
- How to Make an Image a Computable Entity
- Convert 3D Scene to a 2D



- **Today: How the digital information of the sensor can be used to generate a representation that we can image process**

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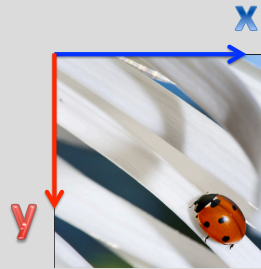
Objectives

- Digital Image - pixels and image resolution
- Discrete (matrix) and Continuous (function) representations
- Grayscale and Color Images
- Digital Image formats

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A Digital Image (W X H)

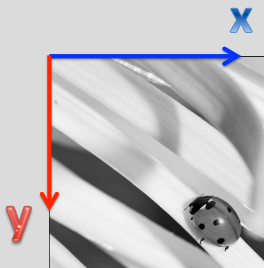


- Width and Height
- Example:
512 x 512
262,144 pixels
0.26 MP Image

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A Digital Image (W X H)

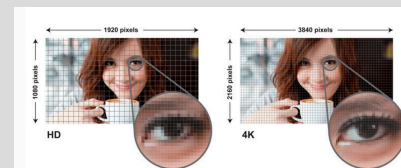
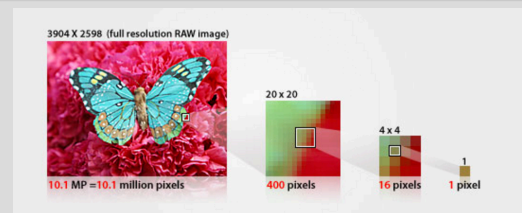


- Numeric representation in 2-D (x and y)
Referred to as $I(x,y)$ in continuous function form, $I(i,j)$ in discrete
- Image Resolution: expressed in terms of Width and Height of the image

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Resolution

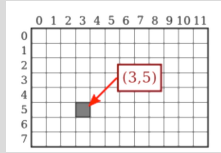


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Pixel

- A “picture element” that contains the light intensity at some location
- (i,j) in the image



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Characteristics of a Digital Image



- A two-dimensional array of pixels and respective intensities
- Image can be represented as a Matrix
Intensity Values range from 0 = Black to 255 = White

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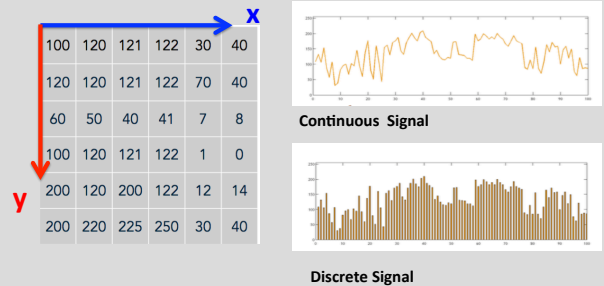
Common data types

- Data types used to store pixel values:
 - unsigned char
 - Uint8
 - unsigned char 8bit
 - 2^n ($2^1, 2^2, \dots, 2^8$) [$2^8 = 256$]

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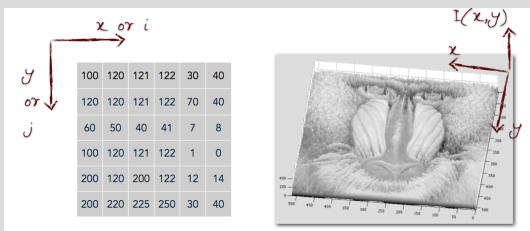
Digital Image is a Function



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Digital Image is a Function



- Typically, the functional operation requires discrete values
Sample the two-dimensional (2D) space on a regular grid
Quantize each sample (rounded to “nearest integer”)
- Matrix of integer values (Range: 0-255)

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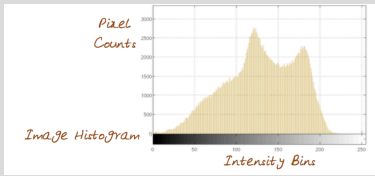
Black/White Digital Image: An Example



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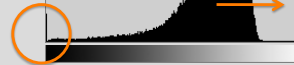
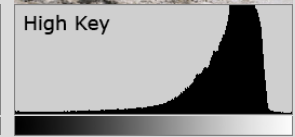
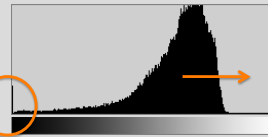
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Image Statistics

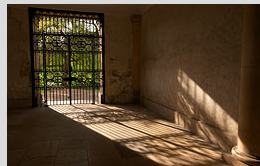


- Digital Image Statistics
- Pixel Counts
- Image Histogram
- Image statistics - average, median, mode
- Scope - entire image or smaller windows/regions
- Histogram - distribution of pixel intensities in the image
- Can be separate for each channel, or region-based too

Histogram

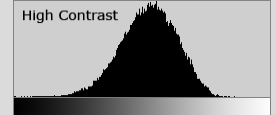
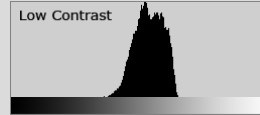
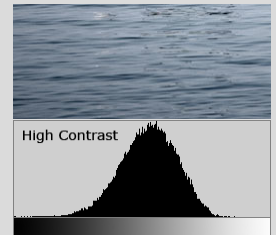


- Underexposed originally left (made it grey)
- Corrected on the right



- Overexposed: clipped/blown channels

Contrast



- Narrow range low contrast e.g., (fog no texture on the left)
- Broad range, high contrast e.g., (texture water with a range of tones).

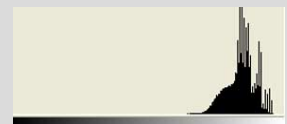
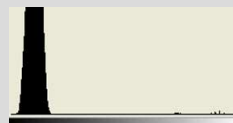
Impossibilities



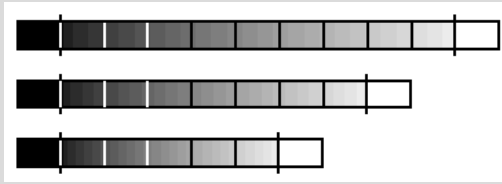
8 Stops



Bad Histograms?



How much latitude in Camera?



- Nine stops (each stop is double in brightness from its neighbor) contrast range, plus all black and all white
 - (12 stops Hasselblad, 10 stops Nikon D3X)
- Seven stop contrast range, plus all black and all white
- **Five stop** contrast range, plus all black and all white

<http://www.forphotography.com/how-tos/zone/zone1.html>

Color Digital Image: An Example



Red Channel Green Channel Blue Channel

- Color image = 3 color channels (images, with their own intensities) blended together
- Makes 3D data structure of size: Width X Height X Channels
Each pixel has therefore 3 intensities: Red (R), Green (G), Blue (B)

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Digital Image Formats

- Raster image formats store a series of colored dots “pixels”
- Number of bits for each pixel represents the depth of color
 - 1 bit-per-pixel: 2 colors (black or white, binary)
 - 4 bits-per-pixel: 16 colors
 - 8 bits-per-pixel: **256 different colors** { 2^8 }
 - One per channel {24 bits} {8+8+8}
 - Usually means 8 bits per color

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Digital Image Formats

- Images can also be 16, 24, 32 bits-per-pixel:
- 24 bits per pixel usually means 8 bits per color
- At the two highest levels, the pixels themselves can carry up to 16,777,216 different colors
- Common raster image formats:
- GIF, JPG, PPM, TIF, BMP, etc.
- Will discuss Camera RAW format later

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Exercise

- Read and Write Image
- `import cv2`
- `img = cv2.imread('input.png')`
- `cv2.imwrite('output.png', img)`
- `print cv2img`
- `cv2greyimg = cv2.cvtColor(cv2img, cv2.COLOR_RGB2GRAY)`
- `print cv2greyimg`
- `width = data_array.shape[1]`

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- **Break** then we will go over
 - Point processes (we will use slides from last year0)

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Wednesday

- Blend Modes
- Image Smoothing
- Start on Image Filters

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Part 2: Image Processing and Filtering

- Point-process Computations on an Image
- How to combine intensities from 2 images?

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Lesson Objectives

- Point-process Computations:
- Add/Subtract Images
- α -blending & its applications
- Image Histograms

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Review: Digital Image

- How to obtain discrete values?
Sample the two-dimensional (2D) space on a regular grid Quantize each sample (round to “nearest integer”)
- Result: Matrix of integer values (range, e.g.: 0-255)

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Arithmetic Practice

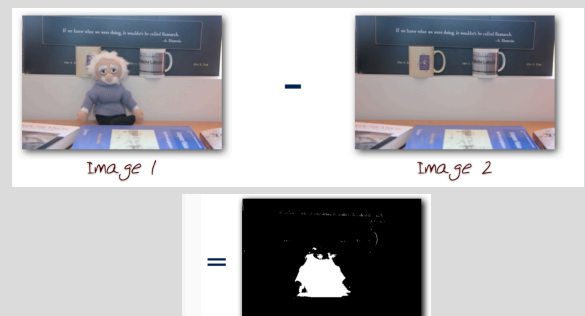
120 122 140 142 143		120 122 140 142 143		240 244 280 284 286
121 120 141 144 147		121 80 40 144 10		121 200 181 288 157
122 121 144 146 11	+	122 81 40 0 151		122 202 184 146 162
125 121 144 145 10		125 80 40 0 152	=	125 201 184 145 164
126 121 145 147 13		126 70 40 0 153		126 191 185 147 166
120 122 140 142 143		120 122 140 142 143		0 0 0 0 0
121 120 141 144 147		121 80 40 144 10		0 40 101 0 137
122 121 144 146 11	-	122 81 40 0 151	=	0 40 104 146 -140
125 121 144 145 10		125 80 40 0 152		0 40 104 145 -142
126 121 145 147 13		126 70 40 0 153		0 191 185 147 -140

- On the data structure

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Pixel/Point Arithmetic: An Example



- Subtraction
- Binary Result

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Pixel Operations: Another Example

- 3 Images Added Together
- Step 1. Too bright
- Step 2. Weigh (normalize) their contribution to the final image

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Alpha Blending

- $.34 \times CD + .34 \times AE + .34 \times LD =$
- Transparency (Conversely, Opacity!)
Usually represented as: α
 α varies from 0 to 1.0 (0=invisible, 1.0=fully visible)
- RGB $\rightarrow \alpha$ RGB

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Part 3:

- Blend two pixels from two images
- Examples
 - averages
 - $f_{blend}(a,b) = (a+b) / 2$
 - $f_{blend}(a,b) = b$
 - Top layer in photoshop or gimp

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Blending Modes (simple)

- **Divide** ('standardize) pixel value first to be between $[0, 1] \rightarrow 0$ (black, 0) – 1 (white, 255)
– Brightens photos if standardized, otherwise it would darken.
- **Addition** (too many whites)
- **Subtract** (too many blacks)
- **Difference** (subtract with scaling)
- **Darken:** $f_{blend}(a, b) = \min(a, b)$ for RGB
- **Lighten:** $f_{blend}(a, b) = \max(a, b)$ for RGB

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Advanced Modes

- Photoshop uses standardized numbers
White (255) becomes 1, black (0) is 0
 - » .80 (light gray)
 - » .50 (middle gray)
 - » .40 (dark gray)
- **Multiply** $f_{blend}(a,b) = ab$
 - $.3 * .8 = .64$ darker than original
 - $.4 * .4 = .16$ darker
- **Screen** $f_{blend}(a,b) = 1 - (1-a)(1-b)$
 - brighter $f(.8,.8) = 1 - (.2)(.2) = 1 - .04 = .96$



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Advanced Modes

- **Overlay** $f_{blend}(a, b) = \begin{cases} 2ab & \text{if } a < 0.5 \text{ (dark)} \\ 1 - 2(1-a)(1-b) & \end{cases}$
 - Top looks like “multiply” (when $a < .5$, darker than middle gray), and
 - “screen” when a is greater (or brighter than middle gray).
 - Pulls the values further away from middle gray.
 - Recall **0 is black** .5 grey and 1 is white when standardized.



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Commutated Blend Model

- Apply the ‘other blend mode’ in reverse order you get the same result.
- Overlay and Hard Light
 - $\text{Overlay}(a, b) = \text{HardLight}(b, a)$
- Luminosity and Color
 - $\text{Luminosity}(a, b) = \text{HardLight}(b, a)$

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Other Modes for Reference

Darkens:

- Burn Tool darkens an area without affecting saturation or color (different from the below modes).
- Color Burn $f_{\text{blend}}(a, b) = 1 - (1 - b) / a$ (SP8)
- Linear Burn $f_{\text{blend}}(a, b) = a + b - 1$ (SP8)

Lightens:

- Dodge Tool: Lightens specified area different from below modes.
- Color Dodge $f_{\text{blend}}(a, b) = b / (1 - a)$ (SP8)
- Linear Dodge $f_{\text{blend}}(a, b) = a + b$ (SP8)

<http://photoblogstop.com/photoshop/photoshop-blend-modes-explained>

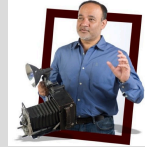
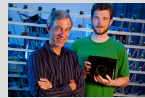
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Sources & Inspiration

Contributors of Course Material:

- **Irfan Essa** & Frank Dellaert (Georgia Tech)
 - Also early adopters
- Marc Levoy (Stanford)– taught computational photography since 2002:
 - A leader in the field : Frankecamera
- Frédo Durand (MIT)
- Jack Tumblin (Northwestern)
- Wikipedia
- http://www.all-art.org/history658_photography1.html
- “Photography”, London, Stone, Upton



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