# Augmented Reality on FPGA Realtime Object Recognition and Image Processing

#### Logan Williams José E. Cruz Serrallés

6.111 Fall 2011

15 November 2011

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- Overlay a digital image on a physical object in realtime.
- In this case, we want to identify a picture frame in captured video, and output video with another image distorted to fit on top of the picture frame.

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# Example Image



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# Example Image



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# Example Image



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# **Top-Level Overview**



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#### projective\_transform: Purpose



Skew to any arbitrary convex quadrilateral

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- 1 Calculate the distance of line  $\overline{A/D}$  and assign it to  $d_{ad}$ .
- 2 Do the same for  $\overline{B/C/}$  and assign it to  $d_{bc}$ .
- 3 Create two "iterator points," point  $I_A$  and  $I_B$  initially located at A' and B'.
- 4 Let  $o_x = 0$  and  $o_y = 0$
- 5 Calculate the distance between the iterator points, assign it to  $d_i$ .
- 6 Create a third iterator point,  $I_C$  at the location  $I_A$ .



7 Assign the pixel value of  $I_C$  to pixel  $(o_x, o_y)$  in the original image.

- 8 Move  $I_C$  along line  $\overline{I_A I_B}$  by an amount  $= \frac{d_i}{width_{original}}$ .
- 9 Increment  $o_x$ .
- 10 Repeat steps 7–9 until  $I_C = I_B$ .

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11 Move  $I_A$  along line  $\overline{A'D'}$  by an amount  $= \frac{d_{ad}}{height_{original}}$ .

- 12 Move  $I_B$  along line  $\overline{B/C}$  by an amount  $= \frac{d_{bc}}{height_{original}}$ .
- 13 Increment  $o_y$ .
- 14 Repeat steps 5–13 until  $I_A = D'$  and  $I_B = C'$ .

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11 Move  $I_A$  along line  $\overline{A'D'}$  by an amount  $= \frac{d_{ad}}{height_{original}}$ .

- 12 Move  $I_B$  along line  $\overline{B/C}$  by an amount  $= \frac{d_{bc}}{height_{original}}$ .
- 13 Increment  $o_y$ .
- 14 Repeat steps 5–13 until  $I_A = D'$  and  $I_B = C'$ .



#### Figure: The original image

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- Straightfoward implementation of the above algorithm
- Uses coregen Divider modules for the divisions
- Requires only 2\*640\*480 + 4\*480 multiplications per clock cycle
- Uses an iterative algorithm for finding distances (pipelined at the end of each line of the image)
- Processes pixels "on-the-fly" from LPF
- Negligible memory requirements (a handful of registers)

#### projective\_transform: How it Interfaces



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#### object\_recognition



- Mark corners of frame with four differently colored dots.
- Recognition begins in the ntsc\_capture module, which detects these colors as it is capturing data and sends the pixel info to the object\_recognition module.

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- Take linear weighted center of mass for each image
- Sums the (x,y) coordinates for each color as it receives them. (8 running sums, 2 for each color)
- When the frame is done, divide each sum by the number of summed items
- The resulting 4 (x,y) pairs are the corners of the frame
- By looking for pixels in ntsc\_capture we significantly reduce the amount of time spent in object\_recognition

• projective\_transform  $\rightarrow$  aliasing



Original

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- projective\_transform  $\rightarrow$  aliasing
- Aliasing reduces the quality of an image



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Original

Aliased

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- projective\_transform  $\rightarrow$  aliasing
- Aliasing reduces the quality of an image
- Lowpass filtering prevents aliasing



Original

Aliased



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- projective\_transform  $\rightarrow$  aliasing
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Original



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- projective\_transform  $\rightarrow$  aliasing
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Original

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- projective\_transform  $\rightarrow$  aliasing
- Aliasing reduces the quality of an image
- Lowpass filtering prevents aliasing
- Information of an image is mostly phase



Original

Aliased



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Filtered

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- projective\_transform → aliasing
- Aliasing reduces the quality of an image
- Lowpass filtering prevents aliasing
- Information of an image is mostly phase
- Symmetric Type I FIR filter  $\rightarrow$  0 phase distortion



Original

Aliased



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Filtered

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- projective\_transform → aliasing
- Aliasing reduces the quality of an image
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- Symmetric Type I FIR filter  $\rightarrow$  0 phase distortion
- Parks-McClellan: reasonable accuracy, symmetric, easily calculable



Original

Aliased



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- projective\_transform  $\rightarrow$  aliasing
- Aliasing reduces the quality of an image
- Lowpass filtering prevents aliasing
- Information of an image is mostly phase
- Symmetric Type I FIR filter  $\rightarrow$  0 phase distortion
- Parks-McClellan: reasonable accuracy, symmetric, easily calculable
- FIR PM filter reduces mem. accesses to 1.5/pixel



Original

Aliased



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Given an arbitrary image & skewing coefficients M<sub>x</sub> & M<sub>y</sub>.





F.T. Original

**Original Image** 

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- Given an arbitrary image & skewing coefficients M<sub>x</sub> & M<sub>y</sub>.
- 2 Fetch a filter with cutoff  $\frac{\pi}{M_v}$ .



F.T. Original

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1D FIR,  $\omega_c = \frac{\pi}{8}$ 

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- Given an arbitrary image & skewing coefficients  $M_x \& M_y$ .
- 2 Fetch a filter with cutoff  $\frac{\pi}{M_{\nu}}$ .
- Filter each column and store in memory.



F.T. Original

1D FIR,  $\omega_c = \frac{\pi}{8}$ 



F.T. Filtered

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- Filter each column and store in memory.
- Fetch a filter with cutoff  $\frac{\pi}{M_{\star}}$ .





F.T. Filtered

1D FIR,  $\omega_c = rac{\pi}{16}$ 

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- Given an arbitrary image & skewing coefficients  $M_x \& M_y$ .
- 2 Fetch a filter with cutoff  $\frac{\pi}{M_v}$ .
- Filter each column and store in memory.
- Fetch a filter with cutoff  $\frac{\pi}{M_{\star}}$ .
- Filter each row and output to projective\_transform.





F.T. Filtered

1D FIR,  $\omega_c = rac{\pi}{16}$ 





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- Given an arbitrary image & skewing coefficients  $M_x \& M_y$ .
- 2 Fetch a filter with cutoff  $\frac{\pi}{M_v}$ .
- Filter each column and store in memory.
- Fetch a filter with cutoff  $\frac{\pi}{M_{\star}}$ .
- Filter each row and output to projective\_transform.
- Repeat this process every refresh cycle.



Original F.T. of Process



Output

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• 1 image is a lot of data:  $640 \cdot 480 \cdot 24$  bits  $\approx 0.88$ MiB

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- 1 image is a lot of data:  $640 \cdot 480 \cdot 24$  bits  $\approx 0.88$ MiB
- Total BRAM: 0.316MiB

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- Total BRAM: 0.316MiB
- We need to store 4 images in memory!

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- 1 image is a lot of data:  $640 \cdot 480 \cdot 24$  bits  $\approx 0.88$ MiB
- Total BRAM: 0.316MiB
- We need to store 4 images in memory!
- Let's use the ZBT RAM: 2 · 2.25MiB

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- Not so fast: 1 clock cycle per memory access

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- Total BRAM: 0.316MiB
- We need to store 4 images in memory!
- Let's use the ZBT RAM: 2 · 2.25MiB
- Not so fast: 1 clock cycle per memory access
- 1 pixel per address would require a clock speed > 100*MHz*

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- 1 image is a lot of data:  $640 \cdot 480 \cdot 24$  bits  $\approx 0.88$ MiB
- Total BRAM: 0.316MiB
- We need to store 4 images in memory!
- Let's use the ZBT RAM: 2 · 2.25MiB
- Not so fast: 1 clock cycle per memory access
- 1 pixel per address would require a clock speed > 100*MHz*
- Let's store store 18 bits per pixel or 2 per address

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#### memory\_interface: operation

Four images in memory:

displaying

next\_display

capture

processing

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Four images in memory:



Shift every refresh cycle

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## system io: ntsc\_capture & vga\_write

ntsc\_capture

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#### system io: ntsc\_capture & vga\_write

ntsc\_capture

• Image data streaming from camera

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#### system io: ntsc\_capture & vga\_write

#### ntsc\_capture

- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds

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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website

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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)

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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

#### vga\_write

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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

#### vga\_write

Image data streamed to monitor

- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

- Image data streamed to monitor
- New image every  $\frac{1}{60}$  seconds

- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

- Image data streamed to monitor
- New image every  $\frac{1}{60}$  seconds
- Module will be adapted from Lab 2 VGA code

- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

- Image data streamed to monitor
- New image every  $\frac{1}{60}$  seconds
- Module will be adapted from Lab 2 VGA code
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- Image data streaming from camera
- New image every  $\frac{1}{30}$  seconds
- Module will be adapted from NTSC code on 6.111 website
- Requires own clock (ISE)
- Outputs two pixels to memory\_interface

- Image data streamed to monitor
- New image every  $\frac{1}{60}$  seconds
- Module will be adapted from Lab 2 VGA code
- Requires own clock (ISE)
- memory\_interface will feed properly formatted pixels

#### timeline

11-11-2011 Finalized block diagram

- **11-18-2011 First drafts of** projective\_transform **and** memory\_interface **written**
- 11-22-2011 First drafts of object\_recognition, LPF, vga\_write, and ntsc\_capture first drafts written; projective\_transform and memory\_interface fully tested
- 11-28-2011 ntsc\_capture and vga\_write fully tested; start of basic integration
- **11-31-2011** object\_recognition and LPF fully tested; start of full integration
- 12-05-2011 Full integration complete
- 12-12-2011 Final report due