

# Hardware Implementation of Motion Blur Removal

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# Problem and Motivation

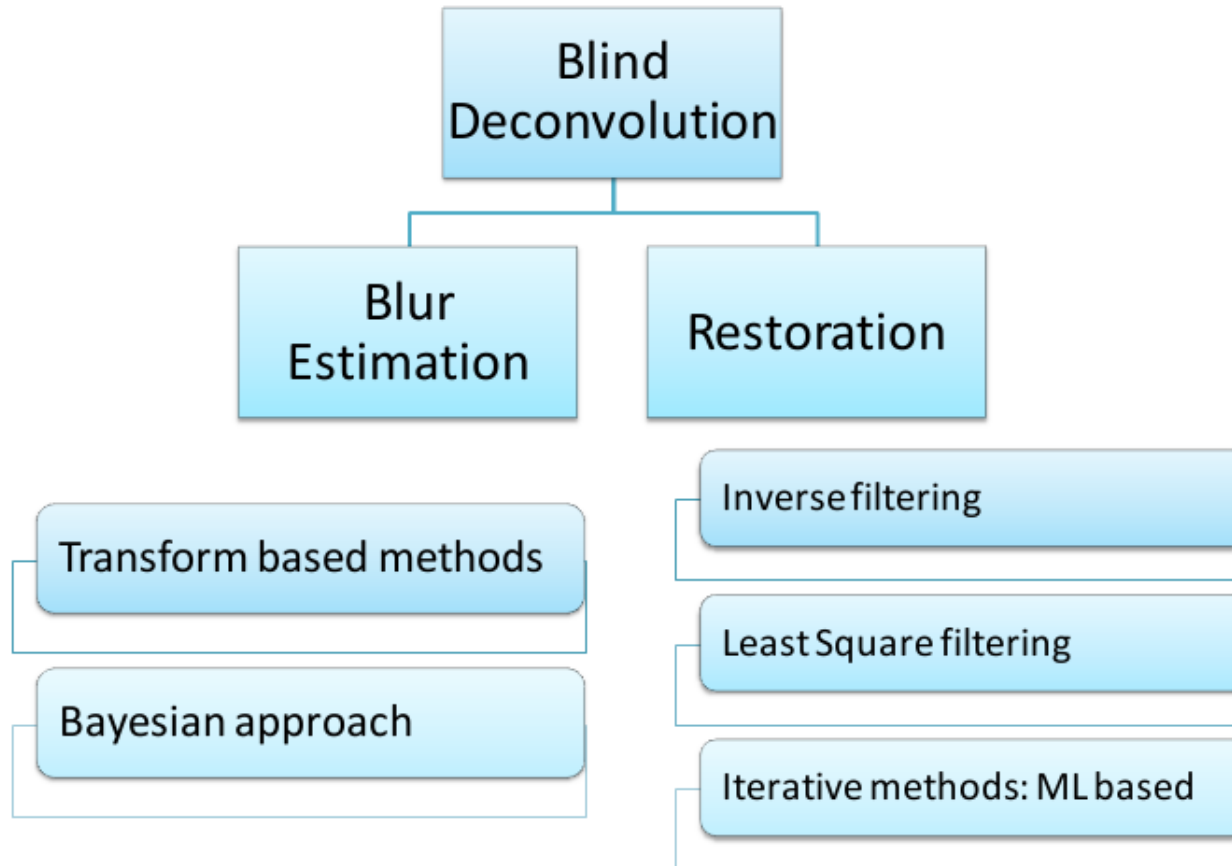
- Photographic images and videos are highly susceptible to **Motion Blur** due to **camera shakes**
- To remove **Uniform** motion blur with **only** the image(s) itself is form of **Blind deconvolution**
  - Algorithms are complex,
  - Usually implemented in Software.
  - Difficult to achieve real-time performance



# Problem and Motivation cont'd..

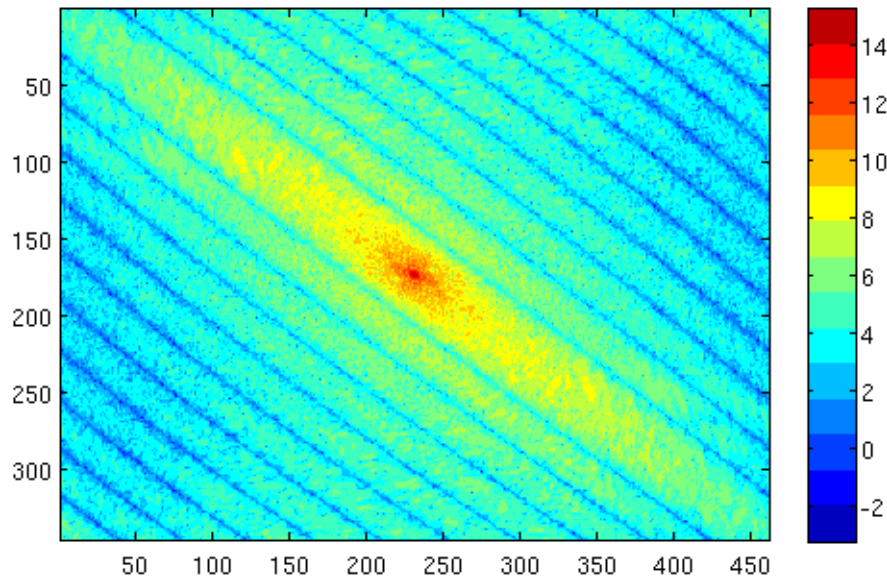
- One to one hardware mapping from software to hardware must be done carefully.

# Algorithm Development

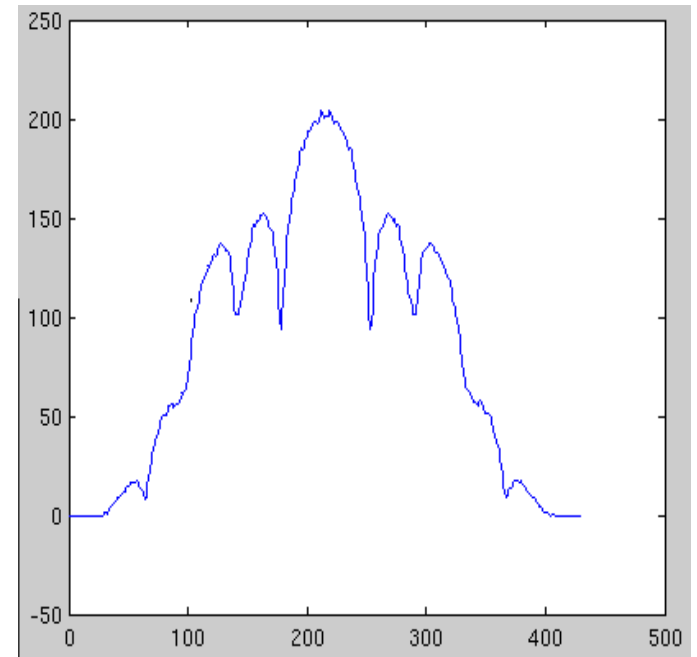


# Blur Kernel Identification

## Fourier domain

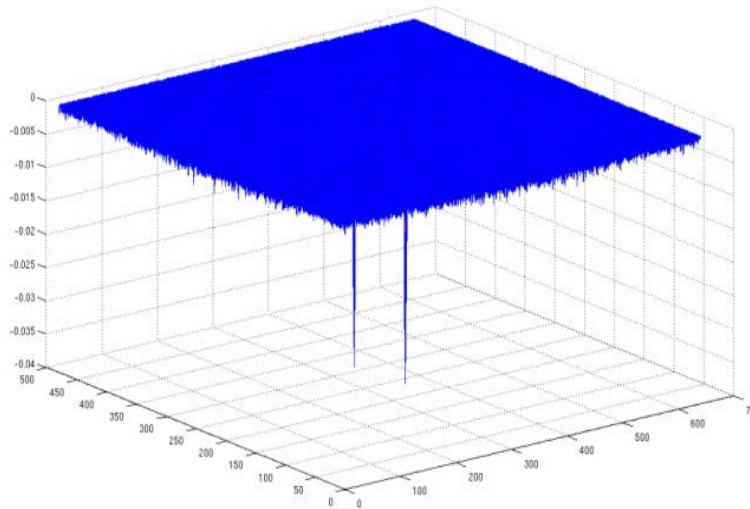


## Radon transform



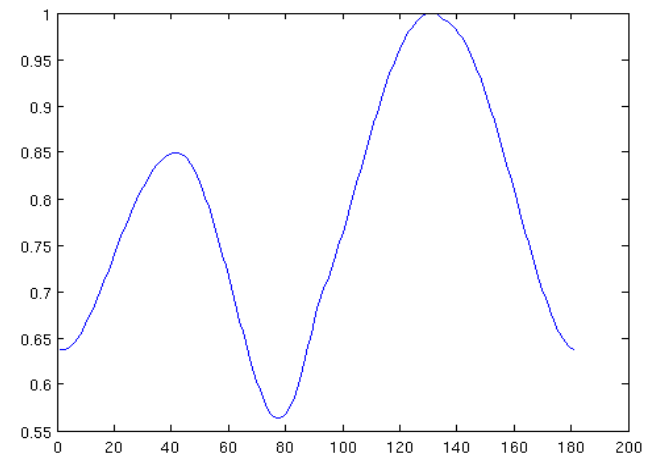
# Blur Kernel Identification cont'd...

## Cepstrum domain extraction



Two negative peaks -blur direction and the blur length

## Directional Derivative method



Lowest value occurs at the direction of the blur

# Blur Kernel Identification cont'd ...

## ■ Strengths and Weaknesses

### □ Fourier Domain

- Difficult to obtain quantitative values

### □ Radon Transform

- Non iterative
- Computational complexity relatively high

### □ Cepstrum method

- Non iterative
- Requires comparatively less memory
- Acceptable accuracy

### □ Directional Derivative method

- Requires isotropic images
- High memory usage
- Calculation complexity is high to obtain good accuracy

# Restoration Methods

## Strengths and Weaknesses

- **Least Mean Square filter (Wiener filter model)**
  - Non iterative
  - Introduces ringing effects
- **Lucy Richardson algorithm**
  - Iterative
  - Good accuracy
- **Regularized inverse method (Stationary Wiener filter model)**
  - Non iterative
  - Computational cost is relatively low

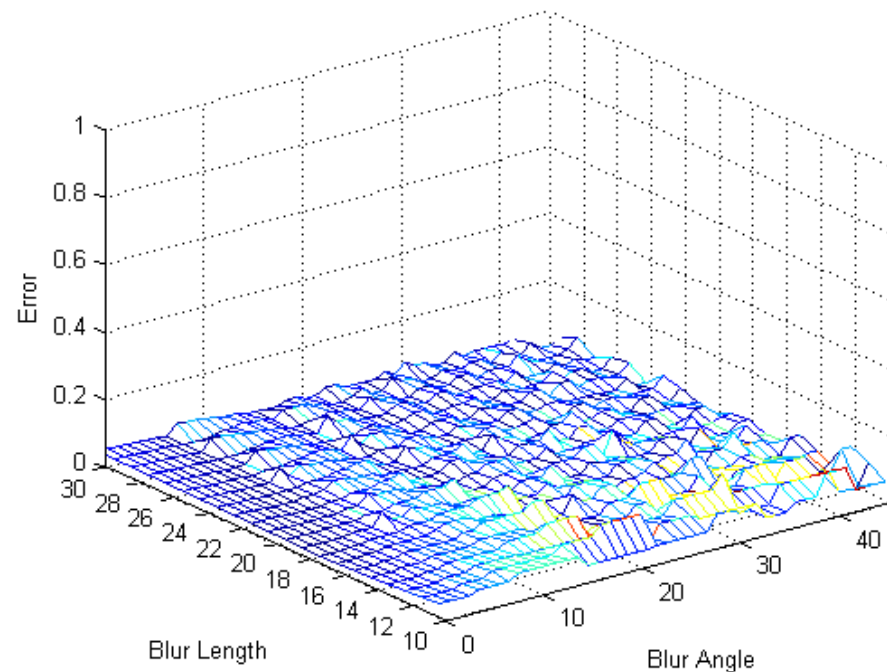


# Software Implementation - Detection

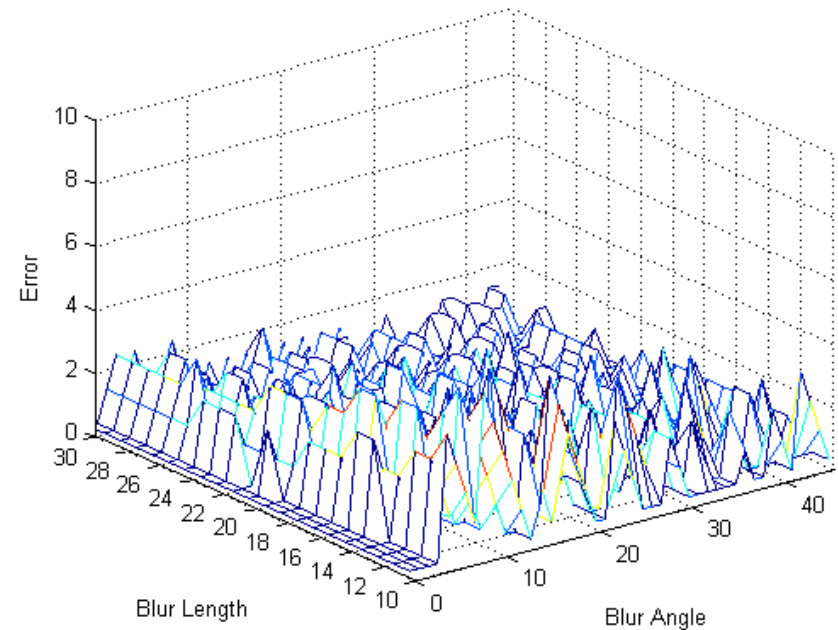
## Cepstrum Method: Analysis of Errors

- Length detection error
- Angle detection error

Normalized Blur Length Error



Normalized Blur Angle Error



# Software Implementation - Restoration

## Regularized inverse filter based method

Blurred image

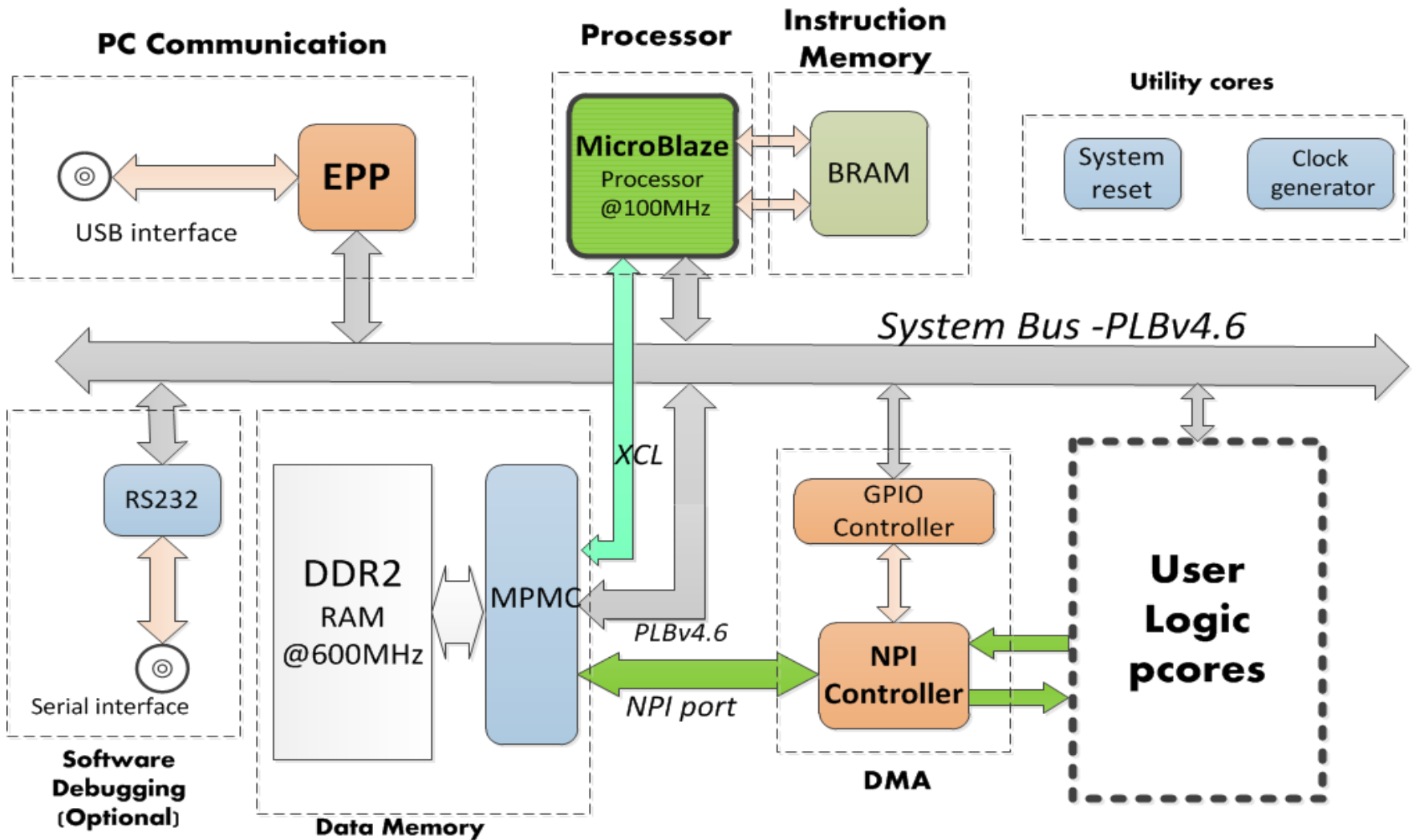


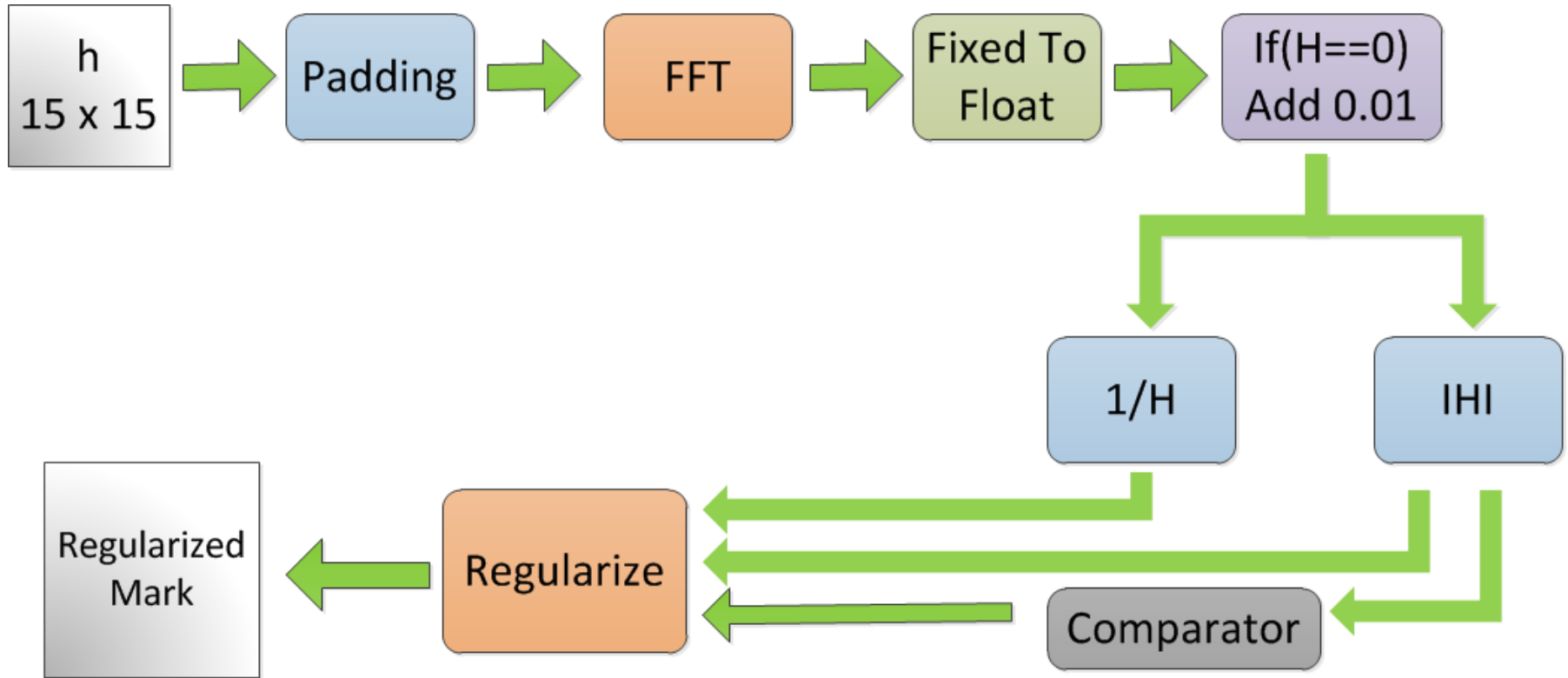
Filtered image



Time: For 1280x720 frame:  
**1.125 s** (Core2 Duo with 4GB  
RAM at 1066MHz)

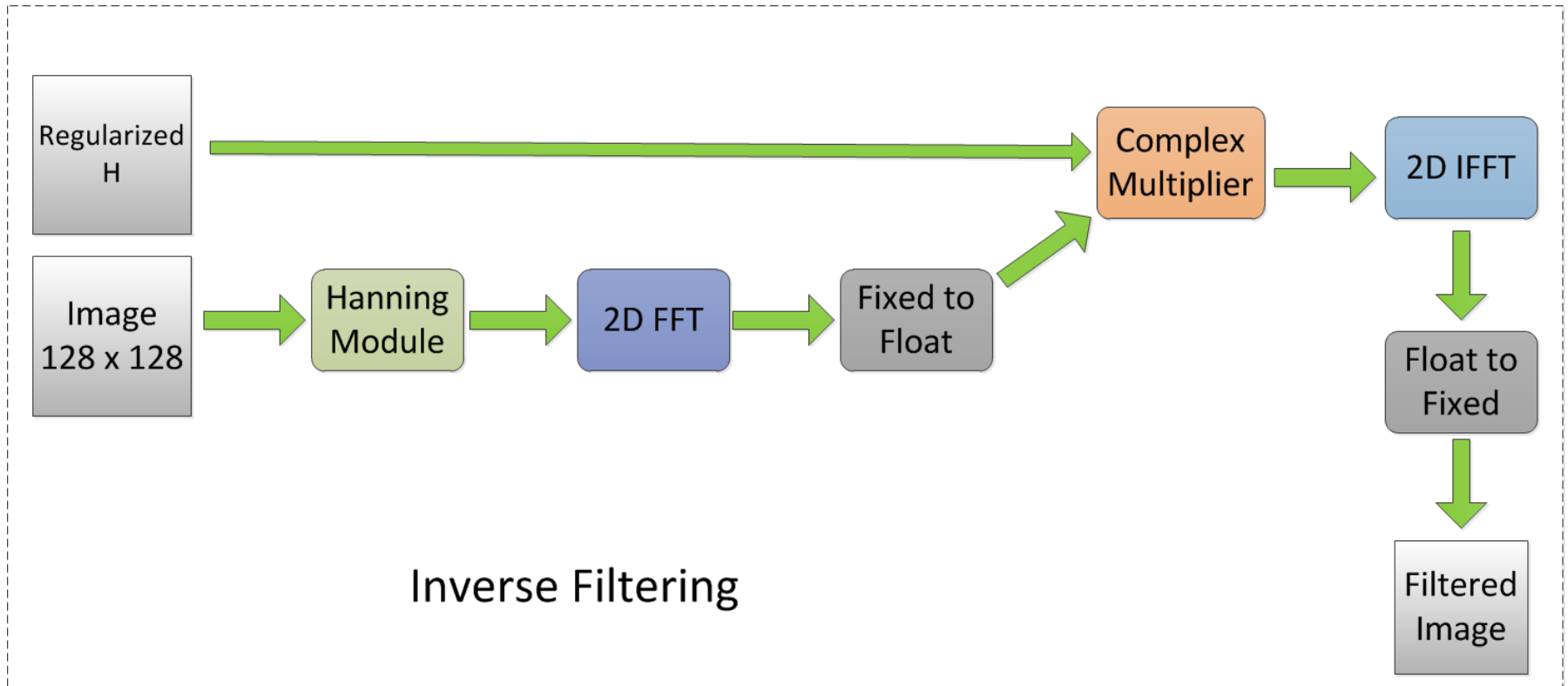
# Hardware Implementation





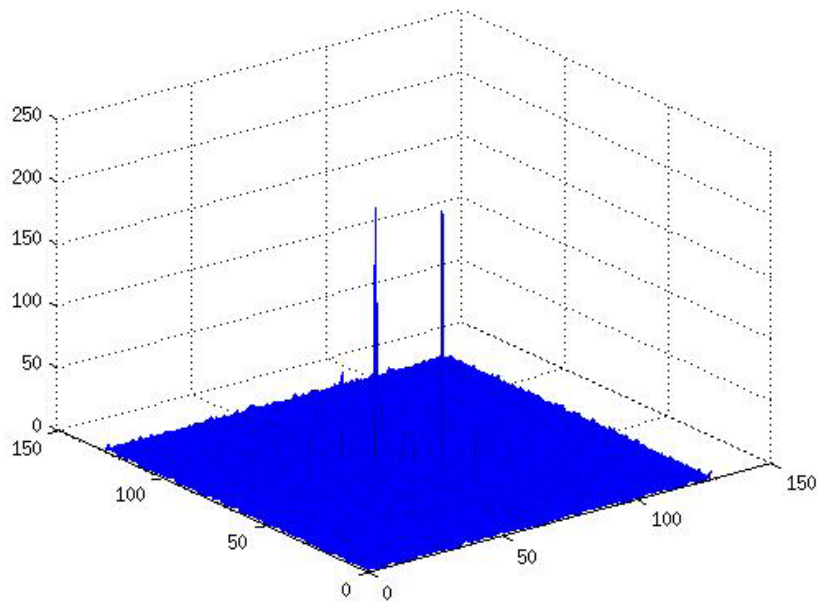
Blur Estimation

Levin et al.  
Yitzhaky et al.

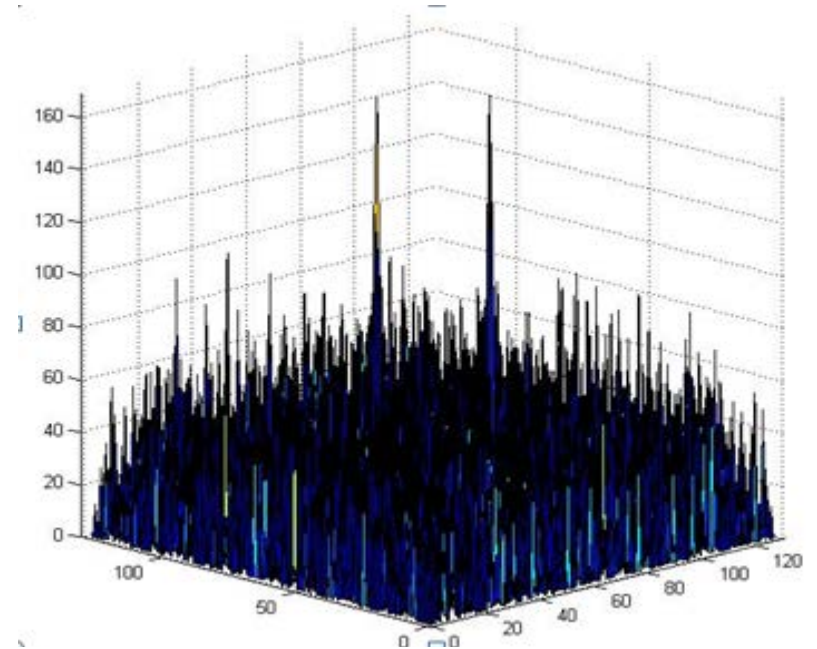


# Hardware/ Software Comparison

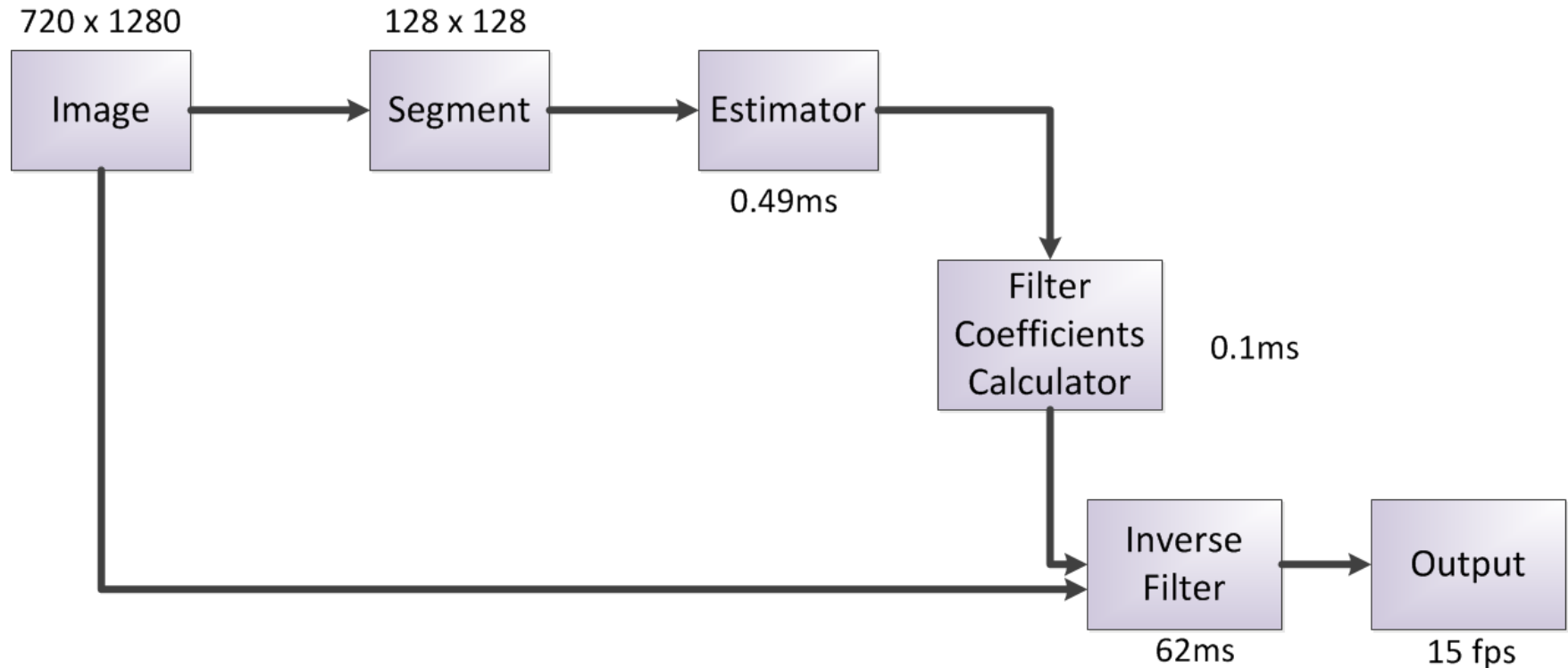
Software Implementation



Hardware Implementation



# Timing Summary



**Mean Absolute Error (MAE) compared to the Software based approach: 7.9**

**Time requirement for processing a 1280x720 frame: 62ms**

**Achievable frame rate: 15fps for 1280x720 ( HD resolution)**

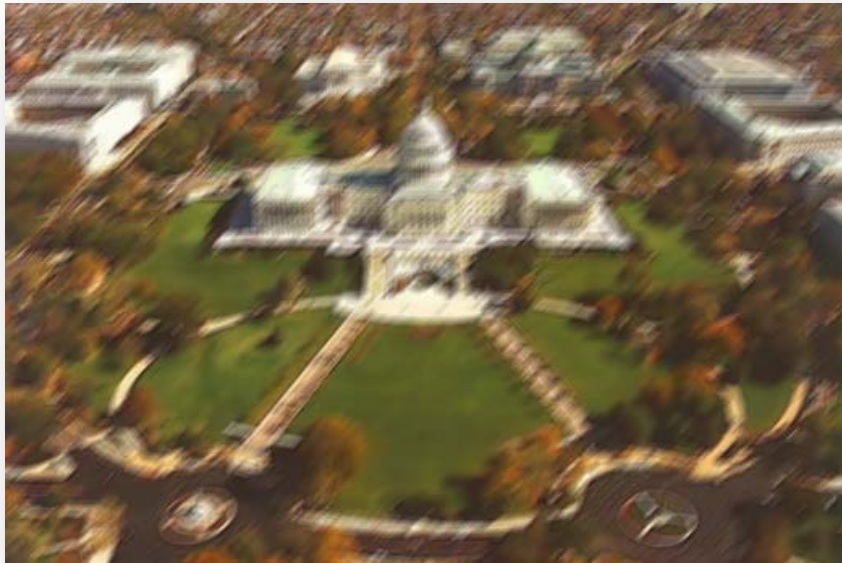
# Resource Utilization Summary

Module	DSP Slices	Slice Registers	LUTs
Estimation Module	108	16215	15923
Filter parameter calculation	61	16854	15258
Inverse Filtering	132	21795	26065
System implementation	10	6178	7793
<b>Total</b>	<b>311</b>	<b>61042</b>	<b>65039</b>

- *DSP - DSP48A1 slices contains an 18 x 18 multiplier, an adder, and an accumulator*
- *LUT- contains 6-input LUT*









# Applications

- Recovering Blurred images from security cameras
- Low altitude aerial photography
- Other scientific applications





# Conclusion and future work

- The system presented above is suitable for an ASIC implementation to be integrated to a hand held camera.
- Extend the system for non-uniform blur



Questions ?

# Bibliography

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2. **C. T. Johnston, K. T. Gribbon, D. G. Bailey.** *Implementing Image Processing Algorithms on FPGAs.* 2010
3. **Downton, A. and Crookes, D.** *Parallel Architectures for Image Processing.* 1998.
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5. **Whyte, O. Sivic, J. Zisserman, A. Ponce, J. s.l.** *Non-uniform Deblurring for Shaken images.* : Computer Vision and Pattern Recognition (CVPR), 2010.
6. **Hui Ji, Chaoqiang Liu.** *Motion blur identification from image gradients.* 2008.
7. **Jõ o P. A. Oliveira, M´rio A. T. Figueiredo, and Jos´ M. Bioucas-Dias.** *Blind Estimation of Motion Blur Parameters For Image Deconvolution.* 2007.
8. **A. Levin, Y. Weiss, F. Durand, and W. T. Freeman,** “*Understanding and evaluating blind deconvolution algorithms,*” in CVPR, 2009.
9. **Y. Yitzhaky and N. S. Kopeika,** “*Identification of blur parameters from motion blurred images,*” Graphical Models of Image Processing, 1996

# Mean Absolute Error (MAE)

$$\text{MAE} = \frac{1}{n} \sum_{i=1}^n |f_i - y_i| = \frac{1}{n} \sum_{i=1}^n |e_i|.$$

$f_i$  is the prediction and  $y_i$  the true value.



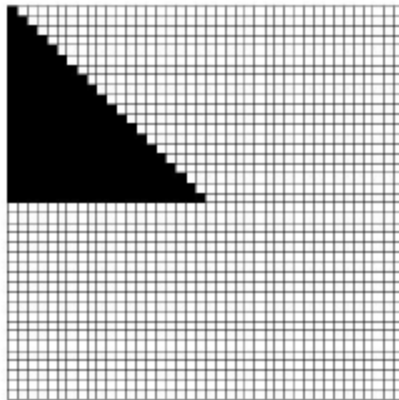
# Spartan-6 FPGA Feature Summary

Device	Logic Cells <sup>(1)</sup>	Configurable Logic Blocks (CLBs)			DSP48A1 Slices <sup>(3)</sup>	Block RAM Blocks		CMTs <sup>(5)</sup>	Memory Controller Blocks (Max) <sup>(6)</sup>	Endpoint Blocks for PCI Express	Maximum GTP Transceivers	Total I/O Banks	Max User I/O
		Slices <sup>(2)</sup>	Flip-Flops	Max Distributed RAM (Kb)		18 Kb <sup>(4)</sup>	Max (Kb)						
XC6SLX4	3,840	600	4,800	75	8	12	216	2	0	0	0	4	132
XC6SLX9	9,152	1,430	11,440	90	16	32	576	2	2	0	0	4	200
XC6SLX16	14,579	2,278	18,224	136	32	32	576	2	2	0	0	4	232
XC6SLX25	24,051	3,758	30,064	229	38	52	936	2	2	0	0	4	266
<b>XC6SLX45</b>	<b>43,661</b>	<b>6,822</b>	<b>54,576</b>	<b>401</b>	<b>58</b>	<b>116</b>	<b>2,088</b>	<b>4</b>	<b>2</b>	<b>0</b>	<b>0</b>	<b>4</b>	<b>358</b>
XC6SLX75	74,637	11,662	93,296	692	132	172	3,096	6	4	0	0	6	408
XC6SLX100	101,261	15,822	126,576	976	180	268	4,824	6	4	0	0	6	480
XC6SLX150	147,443	23,038	184,304	1,355	180	268	4,824	6	4	0	0	6	576
XC6SLX25T	24,051	3,758	30,064	229	38	52	936	2	2	1	2	4	250
XC6SLX45T	43,661	6,822	54,576	401	58	116	2,088	4	2	1	4	4	296
XC6SLX75T	74,637	11,662	93,296	692	132	172	3,096	6	4	1	8	6	348
XC6SLX100T	101,261	15,822	126,576	976	180	268	4,824	6	4	1	8	6	498
<b>XC6SLX150T</b>	<b>147,443</b>	<b>23,038</b>	<b>184,304</b>	<b>1,355</b>	<b>180</b>	<b>268</b>	<b>4,824</b>	<b>6</b>	<b>4</b>	<b>1</b>	<b>8</b>	<b>6</b>	<b>540</b>

- 6295454 clock cycles, and with a 100MHz

$$z^{-1} = \frac{a}{\sqrt{a^2 + b^2}} - i \frac{b}{\sqrt{a^2 + b^2}};$$

- 16384 to 2080 data values



g. 4.16 Symmetry in Hanning window generation