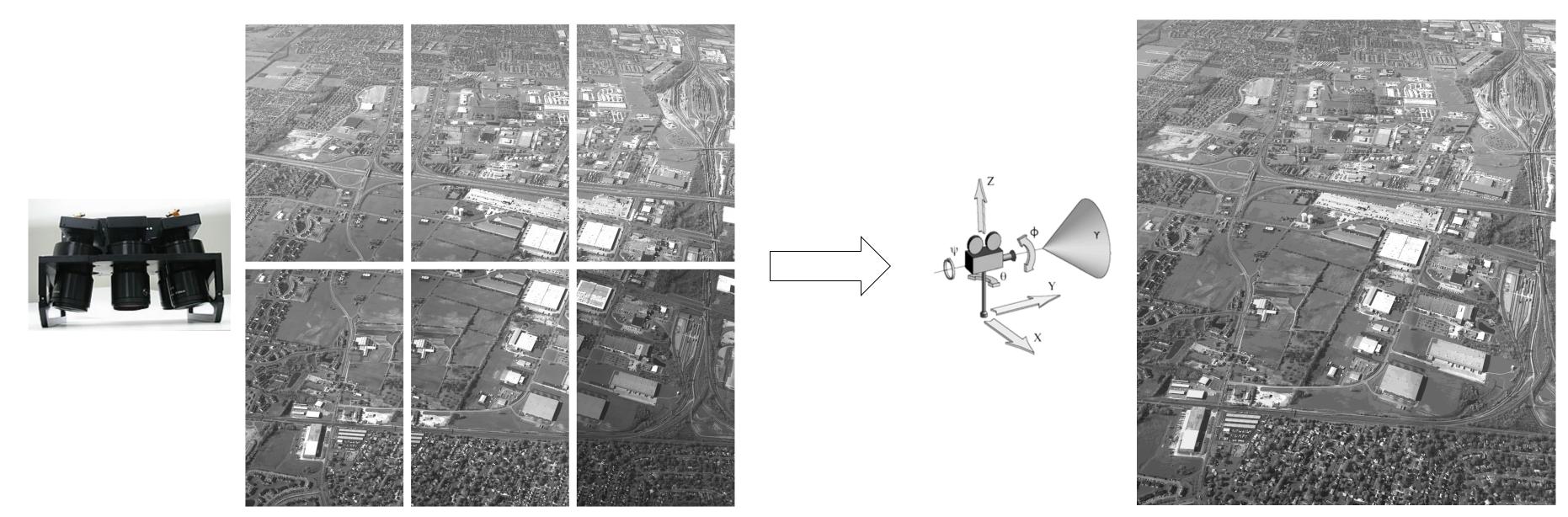


# Accurate Efficient Mosaicking for http://iris.usc.edu/people/prokaj/ {prokaj | medioni }@usc.edu Wide Area Aerial Surveillance

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#### Problem



- Wide Area Aerial Surveillance (WAAS) imagery is captured by an array of sensors sharing an optical center
- It is desirable to generate a single image (mosaic) from the array
- Classic image deformation models (lens distortion) do not produce a seamless mosaic

### Strategy

$$\mathbf{p'} = H \cdot L(\mathbf{p}; \theta)$$

- A homography model, H, registers two images captured by a rotating pinhole camera (p is a point in source image and p' is a point in destination image)
- Additional deformation, L, with parameters  $\theta$ , is needed to account for distortions occurring in practice (lens, little parallax, ...)

## Piecewise Affine Model (PAM)

$$L(q) = \sum_{k=1}^{K} \delta(m(q) - k) A_k q$$

- Tessellate the image into K triangular regions as shown above. Each region has an associated affine transformation,  $A_k$ .
- The model is parameterized by the coordinates of each grid point after the deformation.  $A_k$  is estimated from three point corre-

## **Estimating PAM**

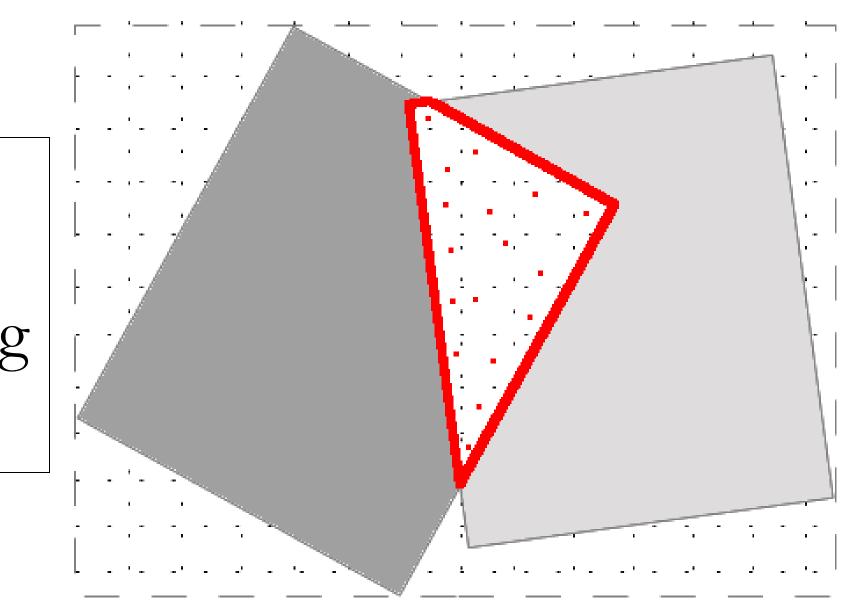
• Minimize the intensity variance of overlapping pixels

$$E(H_1, \dots, H_I, \theta_1 \dots, \theta_I) = \sum_{p} \frac{1}{O(p)} \sum_{o}^{O(p)} \left( I_o \left( L_o^{-1} \left( H_o^{-1} p \right) \right) - \mu(p) \right)^2$$

- Using all overlapping pixels in the optimization would be too slow
- Select spatially distributed pixels with high gradient

Very efficient, fast convergence

- Analytical Jacobian
- Only a fraction of overlapping pixels needed in the objective



## **Intensity Correction**

- Model the differences in intensity as differences in camera gain (scaling factor)
- Find pairwise gain corrections and use these as constraints in global optimization

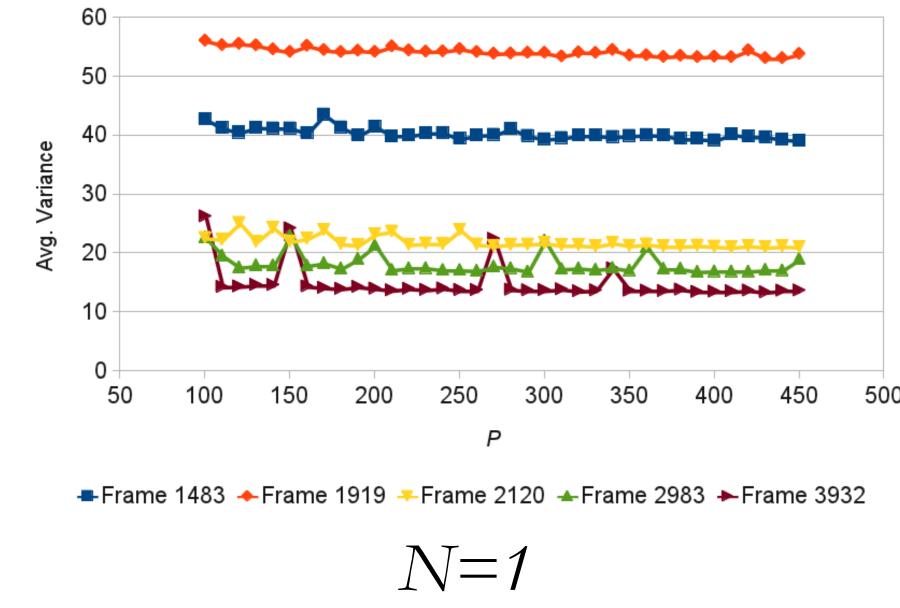
#### Example

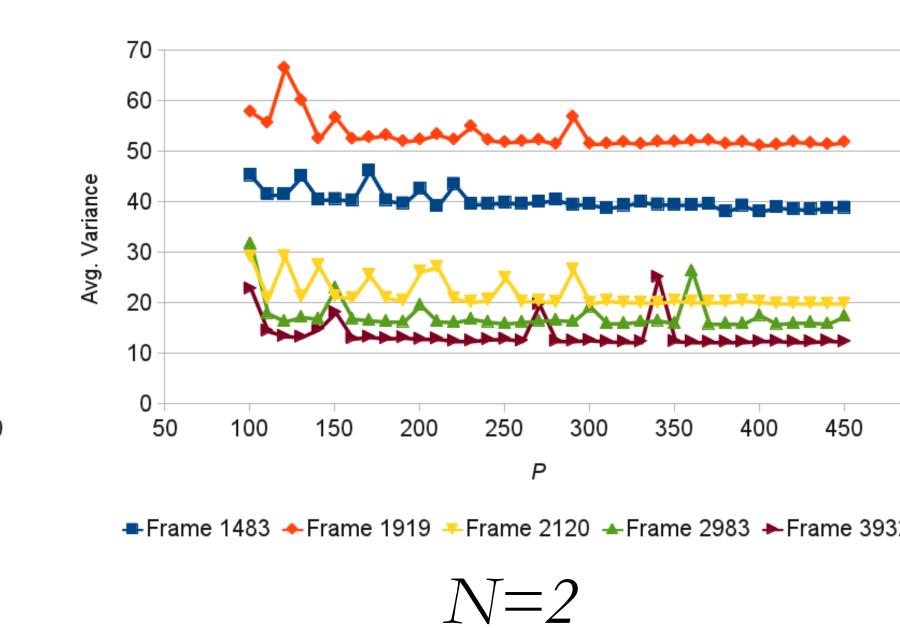
- Known corrections between images  $0 \rightarrow 1, 0 \rightarrow 2, 1 \rightarrow 3, \dots$
- Solve for unknown image corrections go, g1, g2, g3, g4, g5

1	$-g_{01}$	0	0	0	0	$ g_0 $		
1	0	$-g_{02}$	0	0	0	$g_1$		
0	1	0	$-g_{13}$	0	0	$g_2$	=0	
0	0	1	$-g_{23}$	0	0	$g_3$		
0	0	1	0	-g <sub>24</sub>	0	$g_4$		
•	•	•	•	•	•	$\lfloor g_5 \rfloor$		

### PAM Parameters

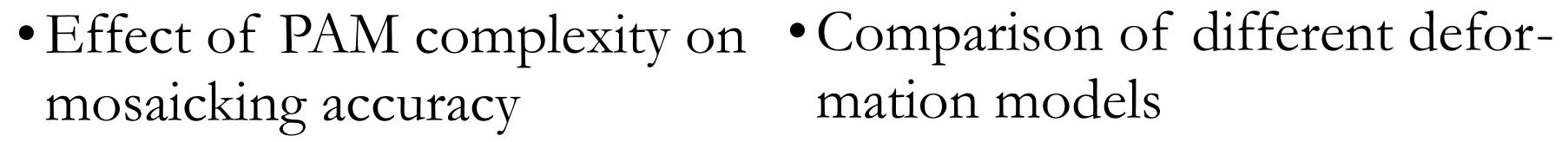
- Model complexity, N (number of triangles =  $2(2N)^2$ )
- Sampling grid size, P (number of pixels used in optimization  $< P^2$ )

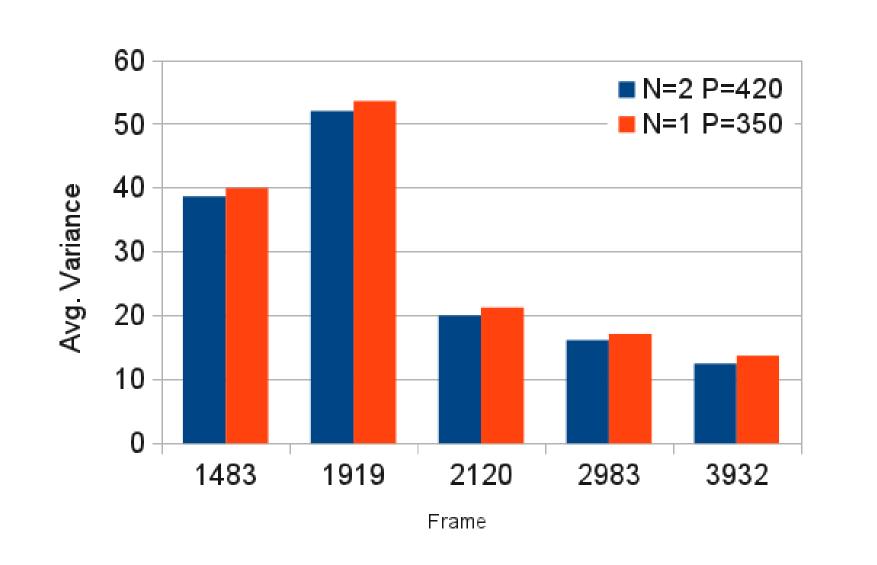


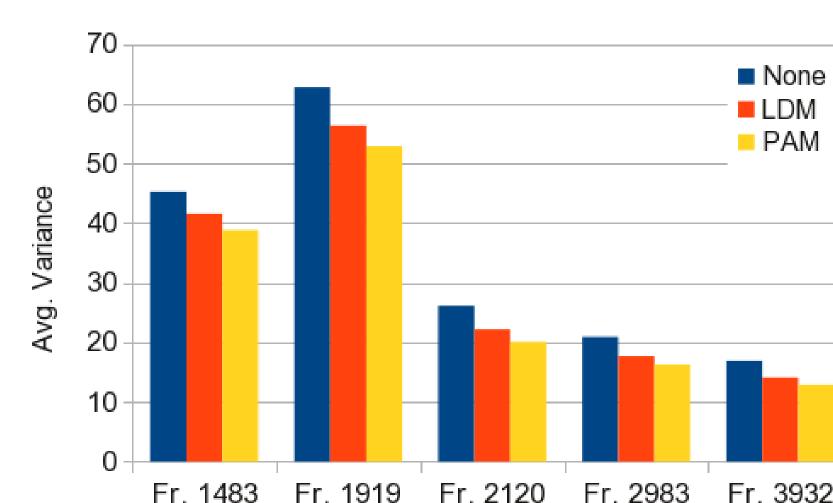


#### Results

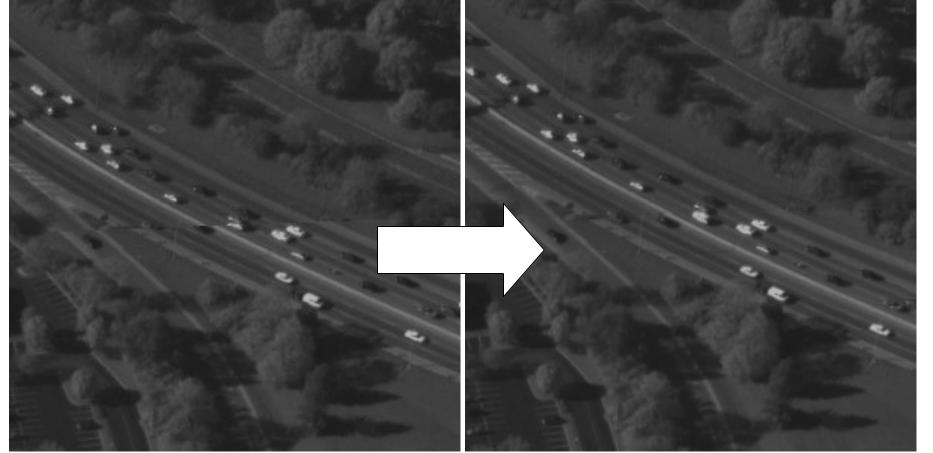
mosaicking accuracy





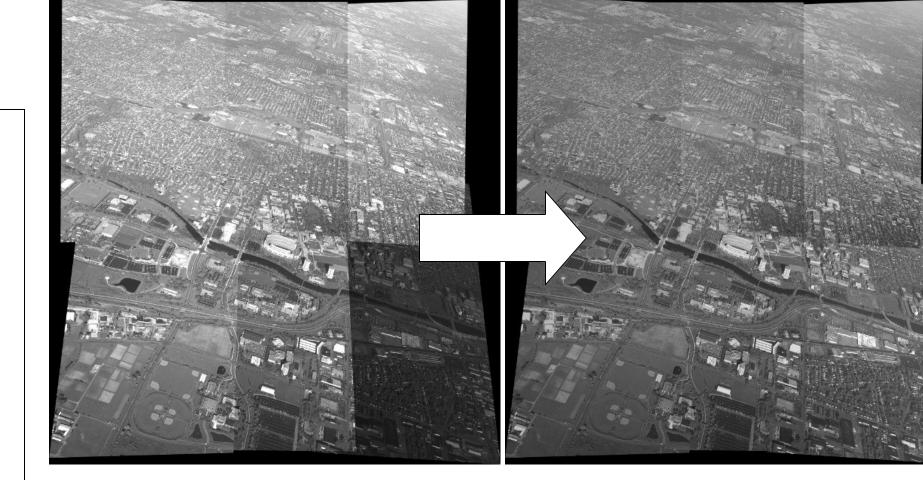


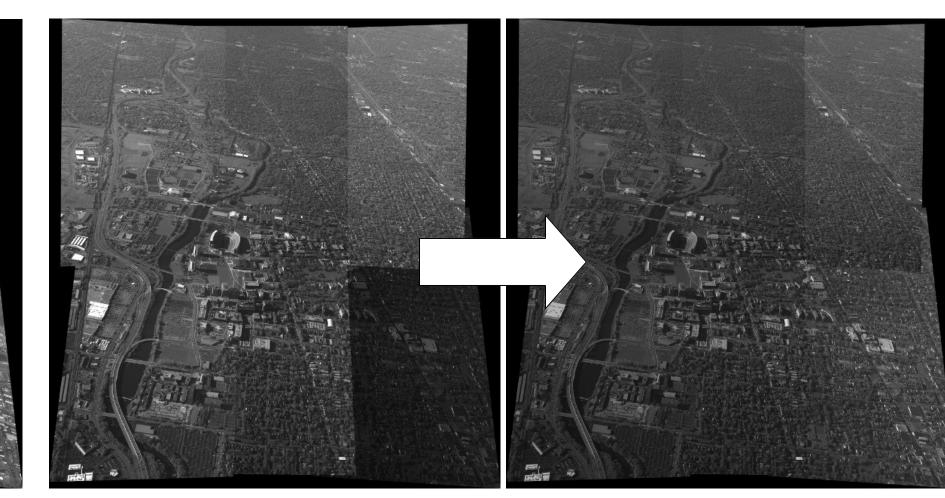
Examples of mosaicking results





• Examples of intensity correction results





## **Conclusions and Future Work**

- The proposed algorithm outperforms the standard lens distortion model while being very efficient (50 seconds to mosaic 6 WAAS images with N=2, P=420)
- Potential for real-time performance in the future with GPU implementation

## Acknowledgements

This work was supported in part by grant DE-FG52-08NA28775 from the U.S. Department of Energy and by funding from Lawrence Livermore National Lab.