

## Comparison of Cross Correlation and Optical Flow Methods for Processing Retroreflective and Natural Background BOS data

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# Introduction

- Motivation
- Processing methods
  - Normalized cross-correlation
  - Optical flow
- Data sets
  - <u>Wind tunnel data</u>: retroreflective BOS NASA plume/shock interaction
  - Flight data: natural background AirBOS T-38
- Schlieren image results
- Conclusions



## Motivation

• Cakebos/BOSCO early initial oflow?



- Displacement calculation between wind-on and reference
- Normalized cross-correlation
  - Well established technique in BOS, PIV
  - "Window matching" displacement
  - Subpixel localization via correlation peak finding
- Optical flow
  - Technique from computer vision community to detect motion, segmentation, and identification in video
  - Directly solve for the "brightness velocities"
- Registration, map to grayscale, and sequence averaging



## **Optical Flow I**

- Horn Schunck: global regularization method
  - Dense solution method
  - Intuitive formulation
- Brightness constancy:  $I_x u + I_y v = -I_t$ ,
- Smoothness constraint:

 $\|\nabla u\|^2 + \|\nabla v\|^2$ 

- Minimize the functional:

$$\int (I_x u + I_y v + I_t)^2 + \alpha^2 (\|\nabla u\|^2 + \|\nabla v\|^2) \, \mathrm{d}x \, \mathrm{d}y$$



## **Optical Flow II**

- Euler-Lagrange yields simple iterative method
  - Jacobi vs. Gauss-Seidel
  - Converge to 10E-6

$$u = \bar{u} - I_x \frac{I_x \bar{u} + I_y \bar{v} + I_t}{\alpha^2 + I_x^2 + I_y^2} \qquad \qquad v = \bar{v} - I_y \frac{I_x \bar{u} + I_y \bar{v} + I_t}{\alpha^2 + I_x^2 + I_y^2}$$

- Numerical considerations
  - $u, \overline{u}$  separated via 9-pt Laplacian stencil (window)
  - 8<sup>th</sup> order spatial derivatives
  - Image spatial derivatives from 2 frames



## NASA shock-plume interaction wind tunnel data



- Shock Interaction studies with nominal Mach 2 jet exit
  - Freestream Mach 1.6 and 2
  - Multiple shock generating geometries
- RBOS speckle pattern below pressure rail



## RBOS Raw data





#### AirBOS Flight Data





- Desert used as natural background speckle pattern
- Observer plane photographs target from above
- Pass 1 5000ft separation, Pass 2 2000ft separation



## Use of multiple reference images

- Multiple AirBOS reference images available
  - Reduce freestream noise, Moiré patterns
  - Potentially clarify additional structure
- Standard deviation of freestream ROI
  - Significant reduction after 5 images
  - Tradeoff between cost and noise
- Difficult to used in RBOS images
  - Backgrounds must be distinct
  - Out of plane model rotation





## Shock-plume interaction I: double-wedge airfoil





## Shock-plume interaction II: aft-swept deck





## AirBOS pass 1: single instance





## AirBOS pass 1: full sequence average





## AirBOS pass 2: single instance





## AirBOS pass 2: full sequence average





## Conclusions

- Optical Flow
  - Improved flow feature detail over cross-correlation, for both flight and wind tunnel data
  - Regularization method appears robust to data sets
  - Easily parallelized
- Use of multiple reference images
  - Decrease solution noise
  - Significant improvement with five distinct reference images
- Provided most detailed AirBOS schlieren images to date
- First use of optical flow for production test at NASA Ames Research Center
- Caveats
  - More sensitive to hard shadows than cross-correlation
  - Additional lighting considerations for wind tunnel applications
  - "Brightness constancy" violations: no solution in shadowed region



## Questions?

