Experimentalist View: Data Processing Methods and Lessons

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## **Research Background**



Fibre optic pressure and strain sensing in a transonic wind tunnel M0.82

Wind tunnel trials ARA Bedford September 2019







## **Research Background**

#### Fibre optic pressure and strain sensing on an aircraft wing in-flight

Collaboration between Cranfield and 11 European partners





AIM<sup>2</sup>

## **Research Background**

#### 30 years of laser flow measurement (PhD – PIV)

**AIRBUS** 





high lift wing flap nacelle vortex formation: Airbus ATI project

other laser projects



3D LDA underbody car diffuser studies (internal PhD)



PIV automotive wake studies

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# Experimental Challenge 1 – Data Noise Background



# Experimental Challenge 1 – Data Noise Background

- PIV data processing



# Experimental Challenge 1 – Data Noise Background

Signal peak height directly dependent on particle image pairs N<sub>n</sub>

- Spatial Correlation Noise peaks dependent on inter-particle correlations R\_ Noise floor average dependent on detector noise correlation R cross-correlation has lower noise autocorrelation cross-correlation and no ambiguity R<sub>D</sub> R<sub>n</sub>-R<sub>n</sub>+ R\_+R. R + R

# Experimental Challenge 1 – Data Noise Dilemmas

#### - Spatial Correlation Errors



- Correlation bias error depends on:
  - Particle image diameter
  - Sub-pixel peak fitting method (centroid or curve fit)
  - Velocity gradient

Larger particle image diameters improve bias error and peak fit accuracy

- Correlation random error depends on:
  - Particle image diameter
  - Correlation method (auto or cross)
  - Velocity gradients
  - Detector noise (CCD or CMOS)

Larger particle image diameters increase random error. Optimum ~2 pixels

# Experimental Challenge 1 – Data Noise Sensitivities



Figures from: Keane R. D., Adrian R. J., *Meas. Sci. Technol.* 1 p1202-1215 (1990), Keane R.D., Adrian R.J., *J. Appl. Sci. Res.* 49 p191-215 (1992)

## Experimental Challenge 1 – Data Noise Sensitivities



# Experimental Challenge 1 – Maximum Data Output

#### - Super-resolution PIV



super-resolution method eliminates velocity gradient effect, bias and random errors, however, remain

The University of Sydney

Vector maps from: Keane R. D., Adrian R. J., Zhang Y., Meas. Sci. Technol. 6 p754-768 (1995)

# Experimental Challenge 1 – Other PIV Methods

#### - Stereoscopic PIV



Stereoscopic PIV provides in-plane u-v-w components:

- Calibration errors (image alignment & dewarping)
- Random and bias errors similar to 2D PIV
- Imaging optics characteristic less critical

# Experimental Challenge 1 – Other PIV Methods

#### - Tomographic PIV



Tomographic PIV provides full volume u-v-w components:

> Calibration errors (multiple image alignment & cameras)

y [mm]

- Random and bias errors from 'voxel' location
- Ghost errors when N<sub>p</sub> too high

PC-tomographic reconstruction

# Experimental Challenge 2 – Data Processing

#### Data processing interface

- PIV set-up and data processing still requires judgement and experience:
  - Seeding density and laser settings ( $\Delta t$  and  $N_p$ )
  - Camera positioning and focussing
  - Data processing algorithm choice /settings
  - Post processing methods
- Interface between the user and the data is critical to make initial/final choices:
  - Calibration and selection of interrogation region size
  - Viewing correlation plane during processing
  - Post-processing: automated and manual methods

Commercial off-the-shelf systems, highly mature, but bespoke systems are still used and developed by research groups (DLR, TU Delft, Uni of Illinois).

## **Experimental Challenge 2 – Data Processing**



- Software 'xpiv' developed during post-doc 25 years ago in C-code
- Unix / Linux Interface through X-Windows due to processing speed requirement
- Still compatible from old Sun workstations to current Linux HPCs
- Requires Motif Windows Manager, MobaXterm or Xming / putty shell windows interface into HPC
- Full calibration / correlation processing / post-processing software suite

## Experimental Challenge 2 – Data Processing



- Viewing and interrogation window for set-up and vector inspection
- Live correlation window for correlation set-up
- Autocorrelation and several cross-correlation algorithms
- Includes correlation averaging for low seeding density
- Peak fitting choices
- Post-processing vector
  validation and smoothing
- Batch processing and data output for movies or other data formats
- In constant development Page 17

# Experimental Challenge 1 – Data Processing

- Use of bespoke software for challenging data format



'Classic' PIV images not possible with smoke which was the only effective seeding in large areas and which formed convecting large 'spatial patterns'

## Experimental Challenge 1 – Data Processing



COTS software typically stops at interrogation region size 128 x 128

Non-standard PIV data processing methods with large interrogation windows (512 x 512 pixels) and correlation averaging methods

## **In-Flight Data Example**

iPad ground speed

(1Hz)

#### Stall Buffet Modelling & Measurement of a Slingsby Aircraft



Method 2 - Pixhawk4 Inertial Unit



250Hz accel<sup>n</sup>s 250Hz pitch attitude 5Hz GPS grd speed 5Hz GPS altitude



Method 1 – iPad-Level-Altimeter



## In-Flight Data Example

# Flight test tailplane view during stall

front view: https://1drv.ms/v/s!AqvNv7Mai6Rqhat 1RHb-AeOriCqNhg?e=2Yj2Jr rear view: https://1drv.ms/v/s!AqvNv7Mai6Rqhat zgheKAiSgmdqvww?e=3ODRxW



rear view: progressive stall to heavy buffet and 'wing drop'

# **In-Flight Data Example**





- Viewing data in an unsteady format can be critical to correct interpretation of a complex **characteristic** - Multiple complex datasets - How do we teach machines to do this?

#### **Research Experience**



Cranfield University

Integration and interpretation of experimental and numerical data sources is critical to physical understanding. How will machines do this?

> https://1drv.ms/v/s!AqvNv7Mai6R ghat51vmhLbHs3FaA\_Q?e=vYEn8H



https://1drv.ms/v/s!AqvNv7Mai6R qhat4dkV0vTgOxsjrPA?e=duKh6a

#### **Questions?**