

# Combined EEG and Eye-tracking in Sports Skills Training and Performance Analysis

## An Archery Case Study

**Keith M Barfoot**

Alpha-Active Ltd, Honiton, UK

**Matthew Casey**

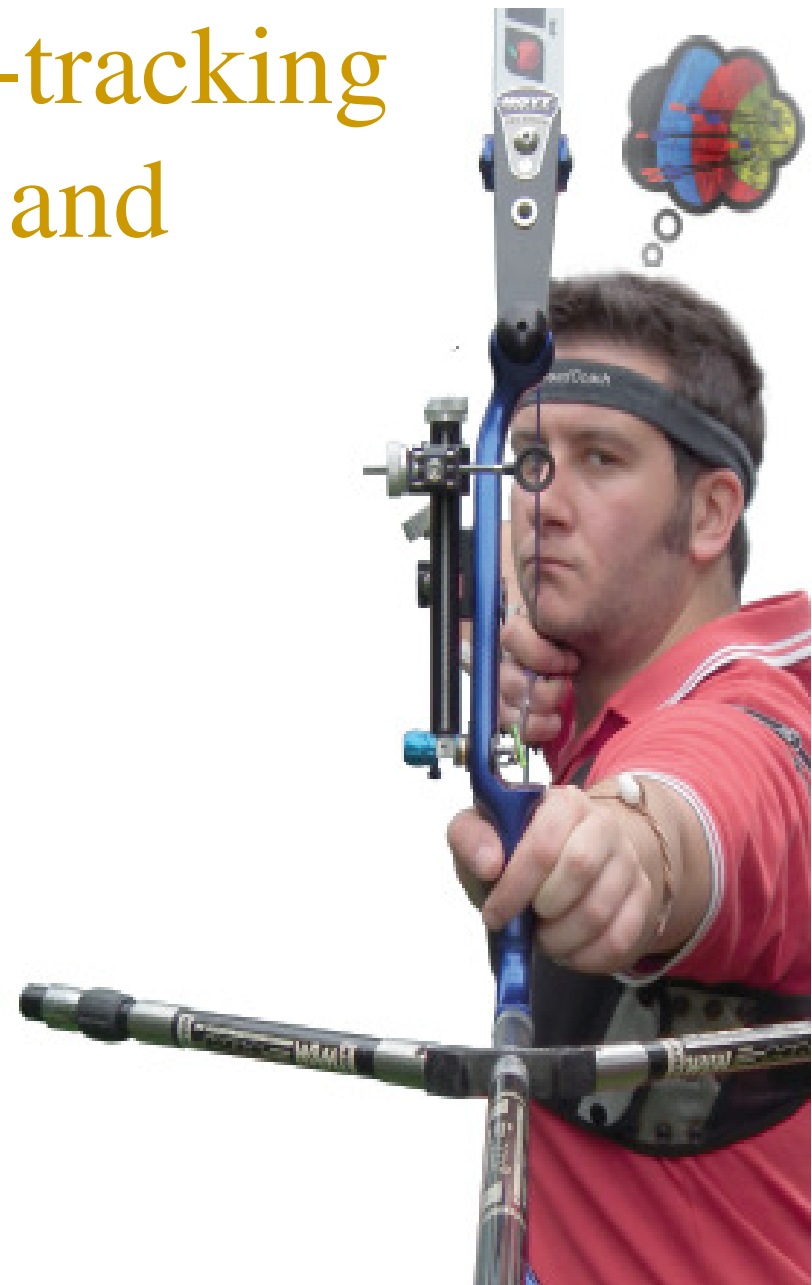
Department of Computing

University of Surrey, UK

**Andrew Callaway**

Centre for Event & Sport Research

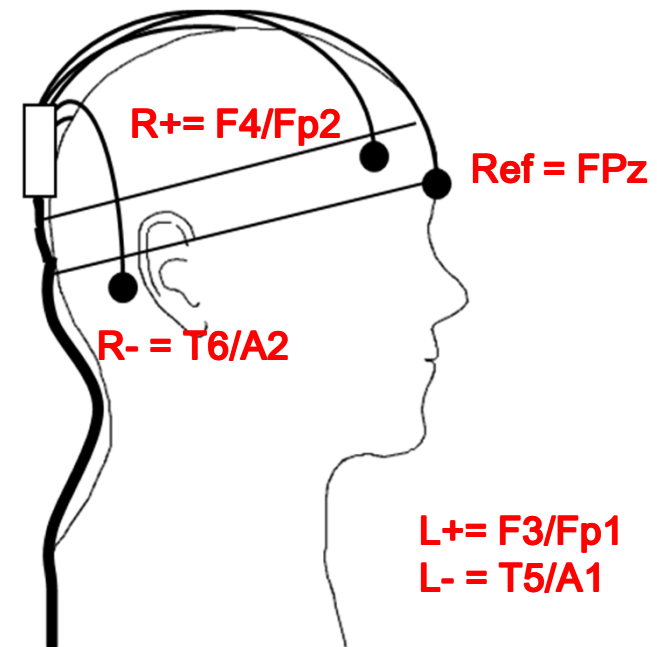
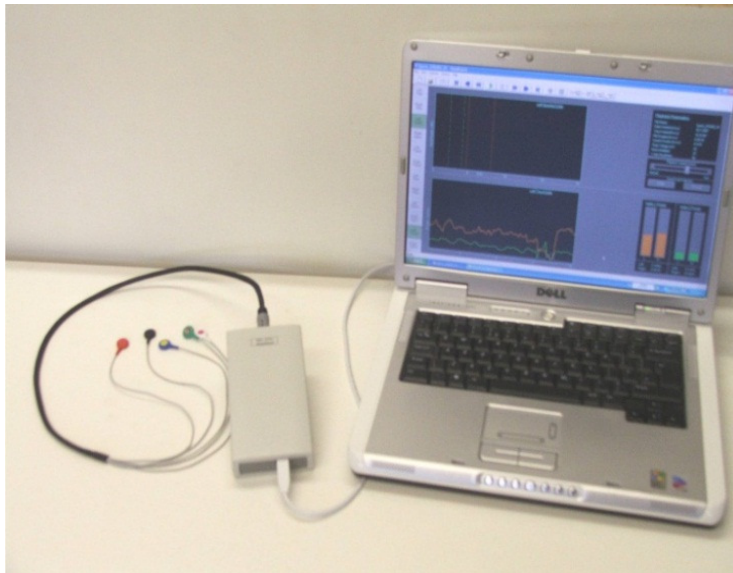
Bournemouth University, UK



## Aim: To enhance mental performance in sport

- Success in sport requires a winning mind-state and visual skill, as well as high level of talent, physical performance, tactics, etc.
- New mobile sensor devices are now available
  - Compact EEGs to measure neurocognitive activity <sup>[1]</sup>
  - Eye-tracking systems to measure visual focus
  - Recordings can be made during ‘real-world’ training to compare performance to mental and visual focus, different coaching interventions, etc.
  - Live feedback of data (e.g. sound) to athlete and/or coach
- We present an evaluation of an EEG study in archery
  - Measured and compared mental states versus scores & skill
  - Results vary as a function of level of athlete performance

## Compact EEG Set-up

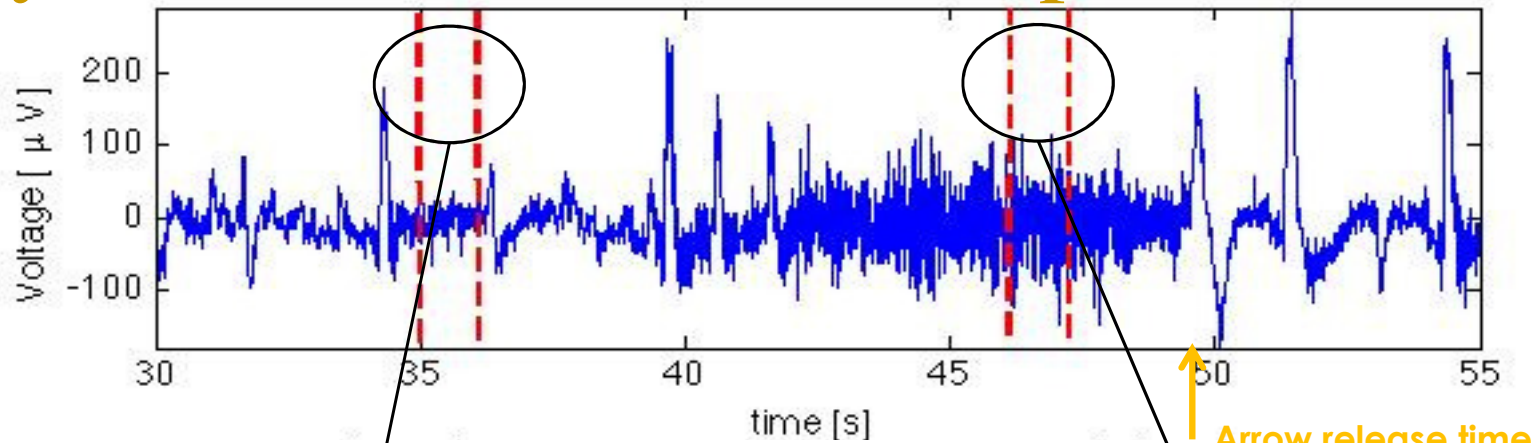


- 5 leads: 2 bipolar channels plus reference lead (active ground)
- 128Hz sampling rate, 24-bit ADC
- Standard passive ECG electrodes used (locations as above)
- Location of electrodes chosen for convenience (no hair) and
- To measure general frontal cortex neurocognitive activity from 4Hz to 45Hz (theta, alpha, and beta frequency bands)

## Study Protocol

- Experimental details :
  - 8 recurve archers in practice sessions
  - County level, near elite and elite archers
  - 3 separate sessions
  - 176 shots analysed and compared with scores
- EEG Spectral analyses were produced for each shot
  - To obtain frequency of brain activity at recording sites
  - Standard Fast Fourier Transform (FFT) and Alpha-Active proprietary<sup>[2]</sup> autocorrelation algorithms applied to the raw (time-domain) EEG
  - Frequencies are related to particular mental states
  - Progression of frequency vs time visualised with heat plots
  - Frequency data was split into three bands for study
  - Frequency correlation studies: shot to shot, archer to archer

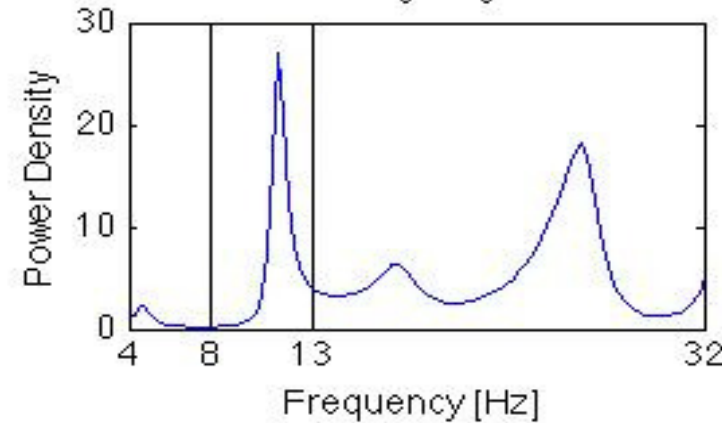
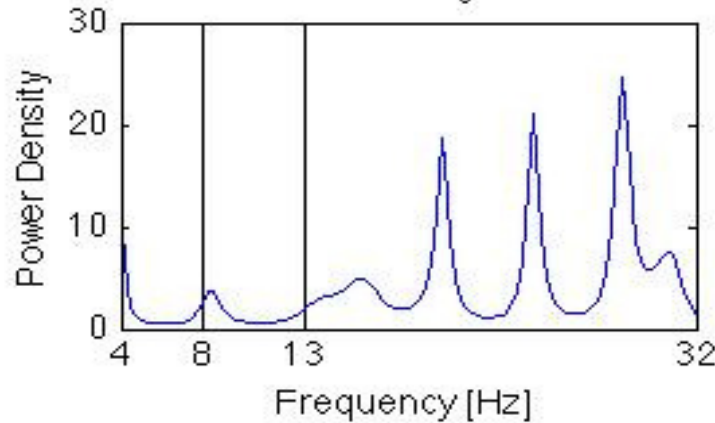
# Key characteristics of EEG spectrum



Raw (time domain) signal, left hemisphere

Draw stage

Aiming stage



Spectrum (frequency domain) signal, left hemisphere

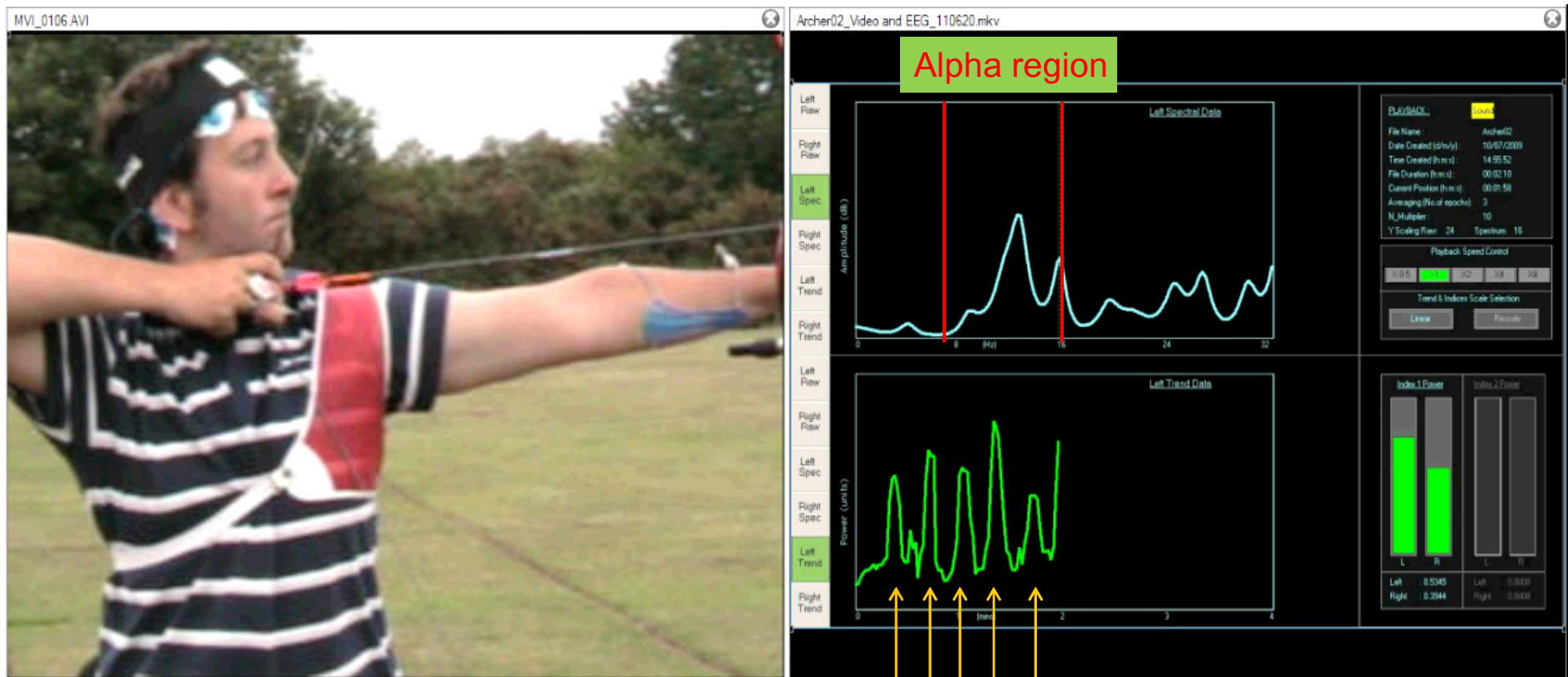
Key frequencies extracted in this study:

Theta, 4 to 8 Hz: often a transition state to alpha

Alpha, 8 to 13 Hz: internally focussed, relaxed, not thinking

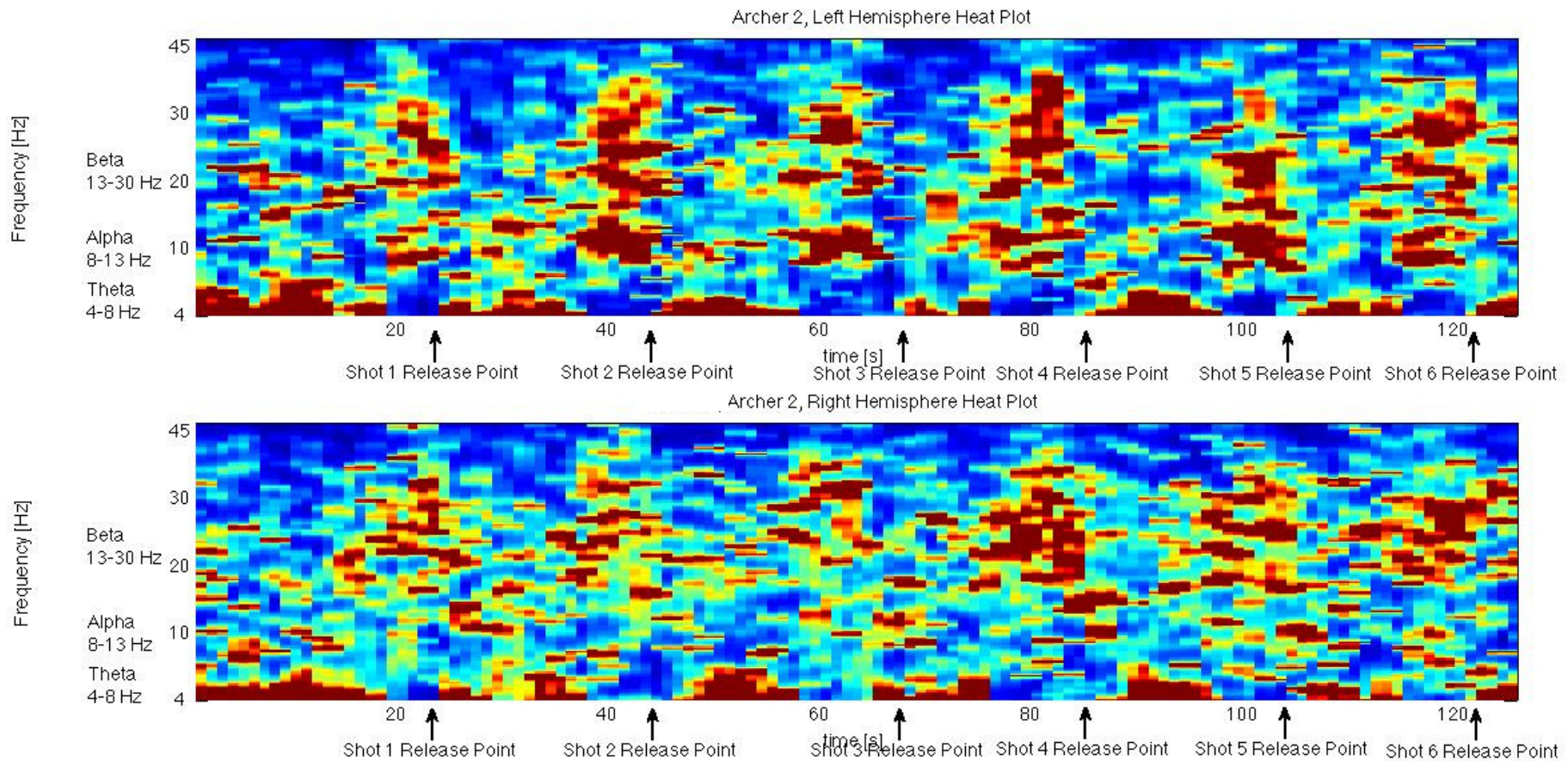
Beta, 13 to 30 Hz: externally focussed, alert, thinking

# Data Capture Protocol



- EEG with simultaneous sound recording for arrow release time (↑)
- Each arrow identified and location on target mapped (as well as score)
- Conventional video & sound recording
- Upper GUI shows left spectrum epoch at 6<sup>th</sup> arrow release and lower GUI shows alpha trend (alpha/whole spectrum) versus time, in minutes

# Results



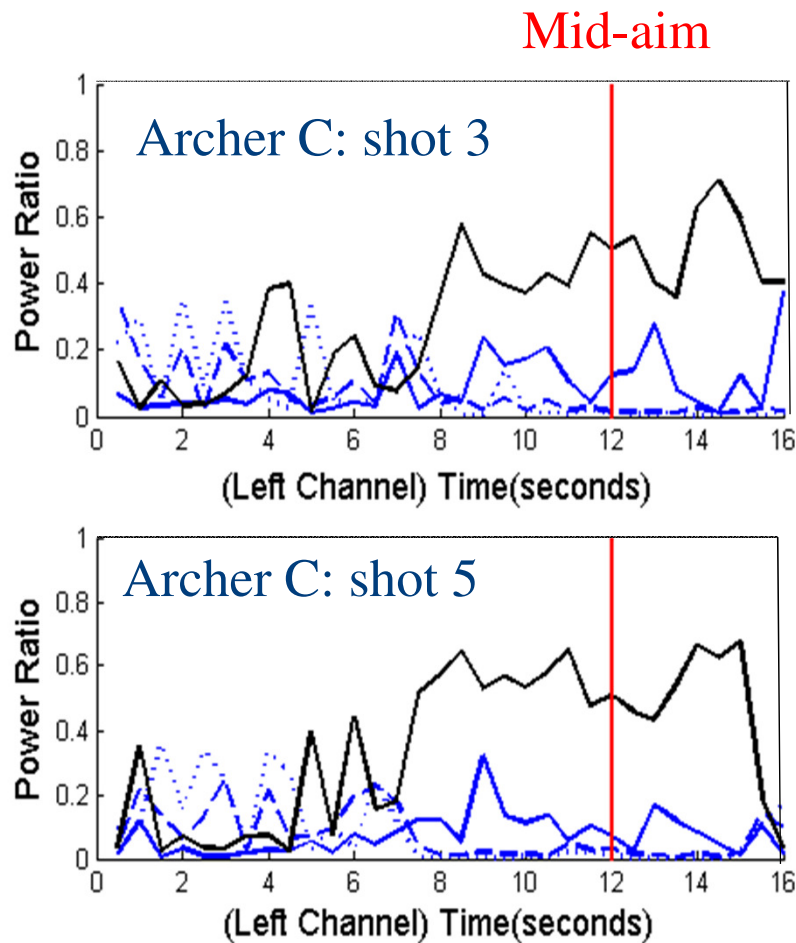
Scores                    9                    9                    9                    9                    8                    7

EEG heat plot results for left and right side of brain.

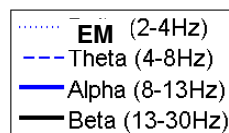
X scale is seconds, showing arrow release times, Y scale is frequency, colour scale is intensity of EEG spectrum, red is most intense, blue is least intense.

# Data Analysis

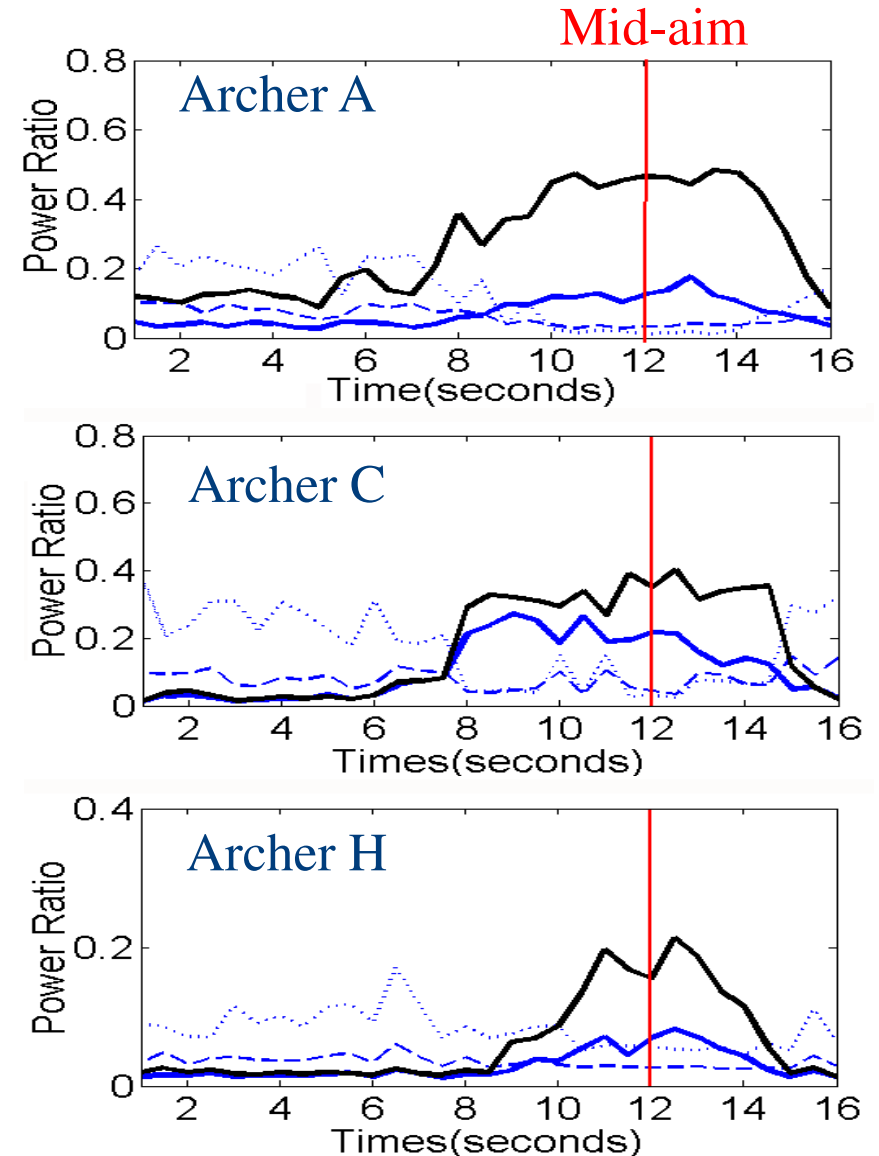
Results similar for same archer, different shots



Archer A = Near-elite, right handed, male  
 Archer C = Elite, left-handed, female  
 Archer H = Right-handed, male

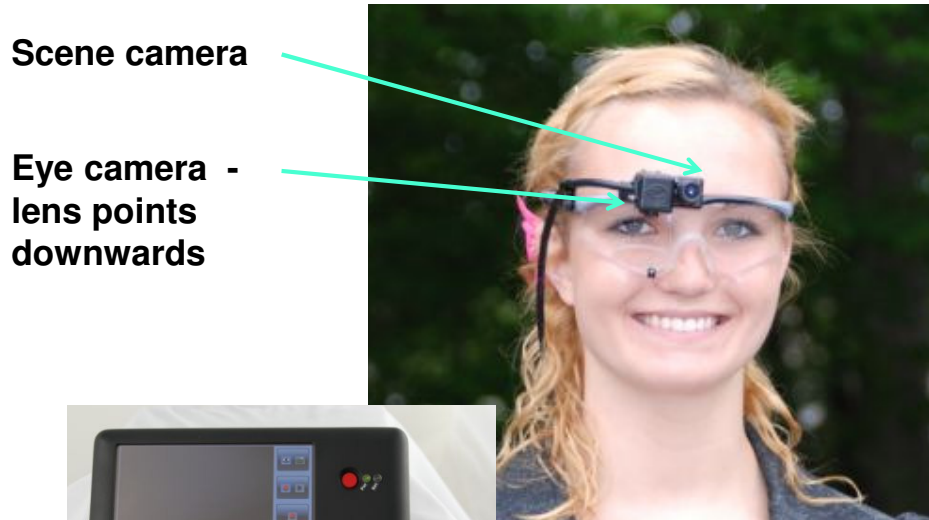


Results different between archers



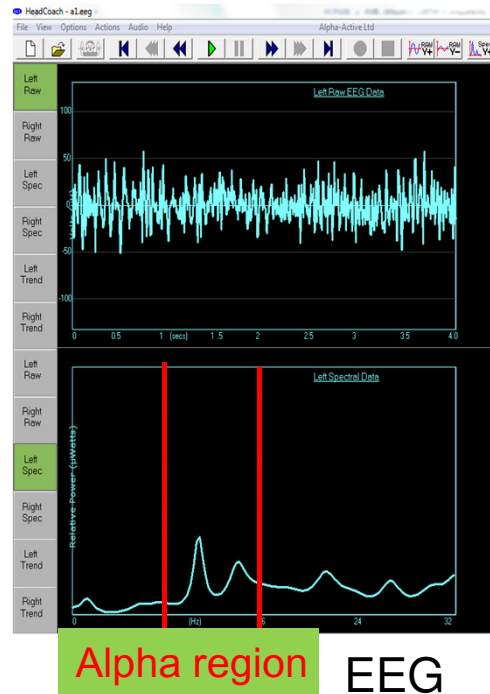


# Wireless Mobile Eye-Tracker



- Accuracy of better than +/- 0.5 degrees
- High Resolution 2 megapixel scene camera
- Wireless range of 80 meters
- Calibration through scene image, no IR markers necessary
- 60Hz eye camera

# Synchronous EEG and Eye-Tracker



Eye-tracker

- EEG and Eye-tracker output shown for the same time
- Archer is visually engaging with target ahead of taking aim
- EEG GUI shows a period of minimisation of eye movement and increased level of alpha waves

# Conclusions

- Compact EEG can be used in ‘real-world’ practical sports studies
- There are distinct measurable changes in EEG patterns during each archery shot
- Average EEG shot profile can be established for an individual archer
- EEG profile varies from one archer to another, even for those of similar ability, but better archers have more consistent profile from shot to shot
- Initial comparisons of EEG profiles prior to arrow release do not show direct correlation to archery score metrology
- Eye-tracking & EEG indicate a period of ‘quiet eye’ before arrow is released

## Further work

- Further evaluation needed to confirm and quantify conclusions
  - Across more sessions for a single archer
  - Across a wider range of experience
  - To explore individual shot performance more quantitatively by use of scatter diagrams <sup>[3]</sup>
  - To study in more detail the effects of eye & muscle movement on EEG spectrum
  - To explore further methods of data analysis
  - To determine if real-time feedback can be given and the best method for doing this (e.g. sound, physical stimulus, etc.)
- Work in progress in golf, motorsport, football, etc.
- Further comparison of EEG with simultaneous eye-tracking

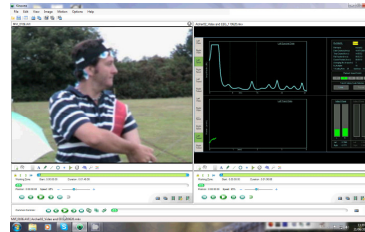
# Acknowledgements

- To Alan Yau for much of the data analysis carried out with the support of a KTA grant from the EPSRC at the University of Surrey.
- To all the archers who participated in the study including those at GNAS, Lilleshall
- The support of Sara Symington, Louise Jones, Oliver Logan, & Gary Carr at GNAS/Archery GB.
- The loan of an ASL MEXG wireless eye-tracker and associated technical support by S Oliver Associates.
- Project support by Mark Griffiths, Andrea Milton, Allistair Mashiter and Edwin Lizarazo (funded by an IOP Top 40 summer student bursary).

# References

- [1] Electroencephalographic Studies of Skilled Psychomotor Performance, *Bradley D. Hatfield, Amy J. Haufler, Tsung-Min Hung, and Thomas W. Spalding, Journal of Clinical Neurophysiology, Volume 21, Number 3, June 2004, 144-156.*
- [2] Recent Advances in EEG Monitoring For General Anaesthesia, Altered States of Consciousness and Sports Performance Science, *M. J. Griffiths, P. Grainger, M.V. Cox, and A.W. Preece, 3<sup>rd</sup> IEE International Seminar on Medical Applications of Signal Processing, 3-4 November 2005, ISBN 0-86341-570-9/9-78086341-415708*
- [3] Inter-Rater Reliability and Criterion Validity of Scatter Diagrams as an Input Method for Marksmanship Analysis: Computerised Notational Analysis for Archery, *Andrew J. Callaway and Shelley A. Broomfield, International Journal of Performance Analysis in Sport 2012, 12, 291-310.*

Thank you



**Keith M Barfoot** [eeg@alpha-active.com](mailto:eeg@alpha-active.com)

Alpha-Active Ltd, Honiton, UK

**Matthew Casey**

Department of Computing

University of Surrey, UK

**Andrew Callaway**

Centre for Event & Sport Research

Bournemouth University, UK

