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An Archaeofaunal Ageing Comparative Study into the Performance of Human Analysis Versus Hybrid Neural Network Analysis

1 Introduction

This paper briefly reports on the completion of the first phase of a project that began in 1991 to develop a prototype computer system that could perform archaeofaunal ageing from a set of sheep mandibles. The computer system uses artificial intelligence models known as neural networks to analyse images of mandibles to assess their degree of wear and relative age (Gibson 1992a, 1992b, 1993).

In order to assess the performance of the computer system in relation to its human counterpart a comparative study that involved the analysis of a sample set of sheep mandibles by archaeologists, non-archaeologists and the computer system was undertaken. A overview of the results is presented here.

2 Overview of the comparative study

Age at death data of common domestic ungulates can be used to formulate an interpretation of the economy and exploitation of the livestock on a site. A number of approaches to age estimation are based on the analysis of teeth attrition. The age of an animal can be estimated by grouping its teeth into a set of wear stages based on the amount of attrition. In general, older animals have a greater degree of wear.

There are two commonly used methods of age estimation using attrition, namely Payne (1973) and Grant (1982). Payne has studied the wear stages of Anatolian sheep and goats and as a result has devised a methodology for age estimation. A more widespread study, that includes the common ungulates of pig, sheep/goat and cattle, has been undertaken by Grant.

Both methodologies concentrate on the third premolar (m3 or dP4), the fourth premolar (P4) and the three permanent molars (M1, M2, and M3). An archaeological sample can be aged by comparing the wear pattern of each tooth with the wear stages, in the form of ideograms, outlined by either methodology. This analysis results in a *tooth wear stage value* for each tooth. These values are then used to produce a *mandible wear stage value* that represents the relative age of the sample. Statistical analysis is then carried out to group all mandibles on the site into relative age stages which can be interpreted by examining the kill-off patterns to suggest the method of animal husbandry (Payne 1973).

It is the above process of analysing the mandibles to determine age at death that has been implemented on a PC using both traditional artificial intelligence techniques and hybrid neural network models (see Gibson 1992a, 1992b, 1993). Neural networks are computing paradigms that attempt to model the cognitive phenomena of the human brain so that complex problems can be solved. In doing so, they exhibit a number of intuitive characteristics such as learning, generalisation and abstraction (see Wasserman 1989 for an explanation).

In order to establish the performance of the system a number of willing participants have been asked to attribute age to a set of mandibles using both Grant and Payne methodologies. These results have then been compared with each other and against the computer application. The aim has been to study how different the results are between each participant and between the computer system and the participants in order to determine the degree of subjectivity and accuracy. The analysis has been divided into two parts, namely

- Human *vs*. Human Comparison
  Establishes the inter-observer performance
- Human *vs*. Computer Comparison
  Establishes the computer's performance in relation to the humans' performance

Measuring the performance of humans provides a guide to establishing the reliability of the computer system. In the course of identifying the performance of human analysis a number of interesting points have been highlighted regarding the methodologies involved and the human's use of the methodologies.

The participants were a cross section of people with varying degrees of archaeological experience. The set of people also had a spread of experience in terms of the two archaeofaunal ageing methodologies. A number of the group are acknowledged experts in the use of the archaeofaunal techniques under study. In contrast, a number of the group had never before used these techniques to age animal remains. In all eleven participants undertook the study.

The sheep mandibles used for the comparative study were taken from two sources. The first set was supplied by the Environmental Archaeology Unit (EAU) at the University of York with the assistance of Dr Keith Dobney. The second set was kindly lent by Prof. Don Brothwell from his own collection.

The aim of the selection of mandibles was to provide as wide a range of wear stages, and teeth morphologies as possible without overburdening the participants. Consequently, a sample set of 22 mandibles was selected that had a combination of missing teeth, unerupted teeth, teeth in early stages of wear and teeth in moderate stages of wear. A group of mandibles was selected that appeared to be in the same state of wear. Finally, some teeth had been subject to disease.

3 The human *vs.* human comparison

In order to carry out the comparative study a questionnaire was designed to record the results of the participants' analysis and to determine facts about the participant that would be useful in the analysis, such as archaeological experience, number of years using each methodology and the preferred method. The participants were asked to age each mandible in any order using both methodologies and record the results on the questionnaire sheet. For teeth that the participant could not record they were asked to use a **?** for unsure wear stages, **X** for present but unrecordable and a - for missing teeth.

A computer database system using DATAEASE was devised to record the results of the analysis. The source of the data entered into the database was used to produce a data file that could be analysed by another computer program, written in QBASIC, that presented the results in a manner that helped to answer the underlying objectives of the study.

4 Devising a method for analysing the results

Before analysing the data the main objectives of the analysis had to be made clear. To determine the performance of the human participants a number of questions needed to be addressed as part of the analysis, for example,

- Are some mandibles easier than others to age?
- Which are the most difficult mandibles and why?
- Which is the most difficult tooth in the set and in general and why?
- Which is the wear stage that causes the most disagreement and why?
- Are the experienced participants of the methodology more consistent in their interpretation than those with less experience?
- What are the factors that determine ease of observation?

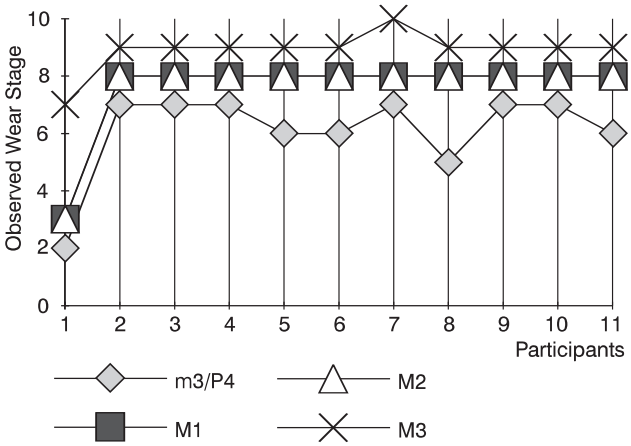

Figure 1. The Participant's Observed Wear Stage Values for Sample 2, where true wear stage values for m3 is 7, M1 is 8, M2 is 8 and M3 is 9.

- Is there any relationship between the analysis of left and right mandibles to ease of observation and general agreement?
- Which of the methodologies provides the most consistent results and why?

To answer the above questions it was necessary to establish a means of objectively analysing all the results from the participants. Keeping the objective of inter-observer comparison in mind, it was obvious that a true wear stage value for each measurement had to be used as a basis for comparison. In other words, for each of the results recorded there must be a real value by which to compare the actual observed wear stages. This *'true' wear stage value* can be calculated using the mode of the participants results where *'true'* effectively means 'expected in this study'. By taking the absolute value of the difference between the true wear stage and the observed wear stage it was possible to determine the amount of discrepancies between observers. Figure 1 shows a subset of the actual results using the Payne methodology illustrating discrepancies between observers.

Using the calculated discrepancy it was possible to determine the percentage agreement of tooth wear stages and mandible wear stages across participants. In addition, it was possible to rank the performance of the participants. This formed the basis for determining the reliability of the methodologies.

5 Analysing the data

At first glance the ranked results would appear to indicate a range of difficulties in the analysis of teeth and mandibles. On the whole both methodologies seem to

perform quite well in some areas and badly in others. It is hard to objectively state what causes such difficulties. Are they related to structure, colour, orientation of the mandible; degree of experience of the participant, speed of recording, lighting in the room at the time of analysis or to the sequence in which the mandible was examined? These questions may demand exact answers but only speculative reasons can be given through examination of the teeth and mandibles.

Firstly, there seems to be no real problem in identifying the teeth types since there were no values in the teeth columns that were invalid. Also, there is no evidence to suggest a correlation between the percentage agreement and a left or right mandible. In addition, the teeth that resulted in the most agreement were those that were missing or unerupted. All these facts suggest that the human is good at recognising simple shapes and manipulating them in order to achieve the requirements of the analysis. This may seem an obvious statement to make but such tasks are very complicated to implement using a computer. Therefore, a machine must match this performance if it is to be of any practical use.

The presence of calculus on the tooth does not appear to affect observations provided it does not obscure any important tooth structures that would differentiate wear stages. Humans have the ability to ignore such 'noise' in the analysis of surface patterns and structures, something that a computer finds more of a problem. The only time that it may affect results is when the calculus appears at a transition point from one wear stage to another.

A general observation for the overall percentage agreement graphs is that there is less accuracy in the earlier wear stages. Perhaps this is because

1. there are more features to match,
2. less distinction between wear stages since there are more wear stages in the early years, or
3. the enamel/dentine distinction is often harder to determine.

In contrast, there appears to be more accuracy in the later wear stages. Well-worn stages seem to be easier to identify perhaps because the features on the surface of the tooth are simple. The smaller distinctions between wear stages are more difficult to pick up. When the break is only partially worn a discrepancy can occur. It appears that both methodologies suffer from this problem.

In general when the tooth does not fit a single wear stage then the percentage agreement drops. The smaller the transition between wear stages, the greater the disagreement. Therefore, visual clues based on distinct structures that are evident in the ideograms are an important element in identifying wear stages. The clarity of the enamel/dentine border is also important in the identification of wear stages.

It appears that any disfigurement of the occlusal surface of the tooth caused by a disease may affect the estimation of a wear stage depending on the degree of deformation. For example, one of the sample's M3 teeth was slightly deformed and the structure of the cusps was not as represented in the ideograms. This made establishing a wear stage rather difficult and was reflected in the percentage agreement for both methods.

To establish the overall estimate of the agreement for mandibles the average of agreements for the teeth of each mandible was considered for both methodologies. On the whole both the Payne and Grant faired similarly, with Grant gaining better agreement than Payne on some occasions and vice versa. However, the overall average agreement for Payne was 70.4% and for Grant 69.1%. Figure 2 shows a comparison of percentage agreement between Payne and Grant approaches.

To determine whether experience had any bearing on the analysis the participants were ranked for the results of mandibles, and each tooth. Again, it can be stated that experience has no real influence on the establishment of age. This conclusion is gained by examining the experience of individuals and noting where they rank in the group for each tooth. The top five were not always the most experienced.

Although this study has aimed to cover all aspects that may lead to misinterpretation of results it obviously has not been able to address all of them. There has been no consideration to the sequence in which mandibles were analysed to see if this had any influence on the results. The influence of broken and partial teeth has not been fully addressed, although they were considered in part. A larger group of participants would perhaps provide a more general and global view. Also, the effects of speed were not analysed.

This study has shown that there is not always 100% agreement in the results of observers. In addition, it has suggested why there may be discrepancies in the data. However, the main purpose of the study has been to provide a set of data that can be compared to the computer system to measure its performance.

6 The human *vs.* computer comparison

The key to the success of a neural network based system is the reliability of the data that is presented to it during the training stage of the system's development. The testing of the system is an integral part of its development and requires data that contains representative examples of all general cases that the neural network would be expected to cope with during its active operational running. Therefore, the system was trained using a series of images of

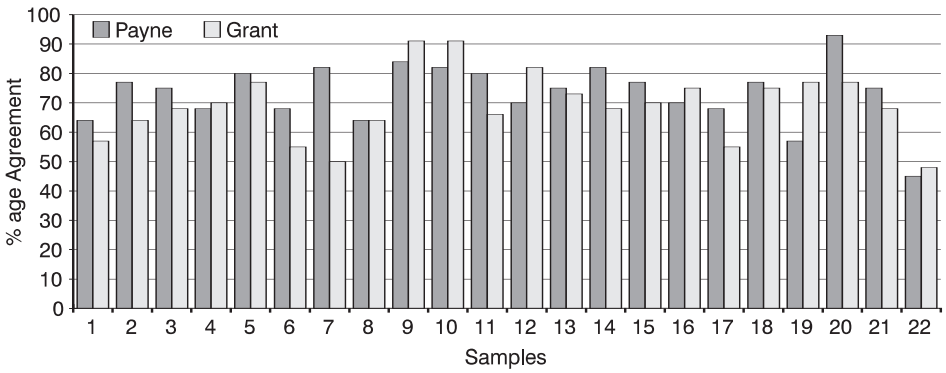

Figure 2. Comparison of percentage agreement of Payne and Grant.

mandibles with various degrees of wear. Once the system had been trained the mandibles given to the participants were presented to the computer and the results compared.

The system was measured against the participants and found to have an overall performance of 65.2% agreement. Of those results that did not match the system was only one or two wear stages out from the participants agreement. Like the human participants the system appeared to have difficulty in assessing early wear stages whilst having greater success with later stages. Again, this could be linked to the smaller transitions in some of the early wear stages. The performance of the system when faced with disfigurement of the occlusal surface was equal to that of the participants. It appeared to produce acceptable answers on the basis of what it saw and what it had learnt.

By comparing the system's performance to the overall percentage agreement of the Payne and Grant methods the result above is encouraging. However, we must be cautious not to overestimate the success of the system. It is important to note that in preparing the images for analysis, effort was made to ensure that the mandibles were presented in such a way that the system would not get confused. The success of the system relies heavily on the quality of the image. Giving the system images that had mandibles in a bad orientation or obscured by calculus deposits deteriorated the acceptability of the results. The human overcomes this problem by moving the mandible into the best position for analysis; something which is difficult to implement using a computer.

It has been seen that the system does not perform well when it is trained using a small number of examples, typically ten. By increasing the number of training examples the system shows greater tolerance to situations that it has not seen before. In one session the system was approaching a rate of 70% success in comparison to the results expected with a training data set consisting of 50 images. However, too many training examples saturate the system and its performance drops. Therefore, it is questionable whether the system will perform much better than currently measured without restructuring its basic architecture.

7 Conclusion and future

The human *vs.* human comparative study has illustrated that there is a degree of subjectivity in the analysis of age estimation using both methodologies. It has identified some areas where the subjectivity originates. Furthermore, it has shown that although the comparative study was carried out rigorously there are areas that the study has not been able to address. Although, the study has taken a *small* number of participants it has still been useful as a means of comparing the computer system.

The human *vs.* computer comparative study shows that given the correct conditions the system can perform acceptably in relation to the human participant. However, the human participants are still better adapted to undertaking this type of subjective analysis.

The next stage of the project is well on the way to implementing a system capable of interpreting kill-off patterns of sheep in order to ascertain their exploitation. Again, it will be necessary to undertake a comparative study to determine the performance of the computer system in terms of its human counterpart.

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references

Gibson, P.M. 1992a The potentials of hybrid neural network models for archaeofaunal ageing and interpretation. In: J. Andresen/T. Madsen/I. Scollar (eds), *Computing the Past; Computer applications and quantitative methods in archaeology CAA92*, 263-271, Aarhus: Aarhus University Press.

1992b An application using hybrid neural network models to perform archaeofaunal ageing, *Archaeological Computing Newsletter* 32, 1-6.

1993 The application of hybrid neural network models to estimate age of domestic ungulates, *International Journal of Osteoarchaeology* 3, 45-48.

Grant, A. 1982 The use of tooth wear as a guide to the age of domestic ungulates. In: B. Wilson/C. Grigson/S. Payne (eds), *Ageing and Sexing Animal Bones from Archaeological Sites*, 91-108, BAR British Series 109, Oxford: British Archaeological Reports.

Payne, S. 1973 Kill-off patterns in sheep and goats: the mandibles from Asvan Kale, *Anatolian Studies* 23, 281-303.

Wasserman, P.D. 1989 *Neural computing, theory and practice*. New York: Van Nostrand Reinhold.

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