Abstract: Fluctuating asymmetry (FA), in contrast with other asymmetries, is the bilateral asymmetry that represents small, random developmental differences between right and left sides. After nearly a century of using traditional morphometrics in the estimation of FA, geometric morphometrics (GM) now provides new insights into the use of FA as a tool, especially for assessing environmental and developmental stress. Thus, it will be possible to assess adaptation to various environmental stressors as particular triggers for unavoidable selection pressures. In this review, we describe measures of FA that use geometric morphometrics, and we include a flow chart of the methodology. We also describe how this combination (GM + FA) has been tested in several agroecosystems. Nutritional stress, temperature, chemical pollution, and population density are known stressors experienced by populations in agroecosystems.

Keywords: fluctuating asymmetry; environmental stress; geometric morphometrics; developmental instability

1. Introduction

Phenotypic responses are the result of the interaction between genome and environment, acting in a noisy developmental system. Consequently, because all tissues and cells of an individual share the same genome, we can assume that environment and developmental noise determine the morphological variability among different parts of an individual [1]. Most organisms have a body plan that involves the repetition of structures in different positions or orientations [2,3]. These repetitive structures are often symmetrical [4]. In nature, we can find various symmetries, where radial symmetry (such as in some flowers, cnidaria, and echinoderms) and bilateral symmetry (in animals) are the most common in nature. In addition, there are spherical symmetries, such as those of some (microalgae and protists (e.g., Foraminifera) [2,5] (Figure 1). Animals with radial symmetry do not have a right or left side. Rather they have an upper or lower side. Such species are usually marine organisms, such as jellyfish
and corals. Moreover, it is common for species to have juvenile forms with symmetry different from that of their adult form; for example, larval starfish are bilaterally symmetrical, whereas the adults are radially symmetrical.

Mathematically, an object is symmetric when its shape remains unchanged after some mathematical transformation, such as reflection (bilateral symmetry) or rotation (radial symmetry). For example, reflection on the sagittal plane leaves symmetrically bilateral structures unaltered. Similarly, rotating a radially symmetric object around its axis shall leave the object’s shape or structure unchanged [5]. Bilateral symmetry is characterized by the ability to distinguish a right side and a left side of a body plan, so that they are mirror images of one another (Figure 2).

Since both sides (right and left) are configured by the same genes, we can expect that, under suitable developmental conditions, both sides will develop as mirror images of one another [4,6–8]. Conversely,
if asymmetry is detected in the shape of structures or organisms, then we are observing some factor or condition that causes alterations in development stability [9]. Asymmetry patterns are the observable expression of biological processes, but they are not biological processes in and of themselves [10]. In other words, asymmetry is the consequence of a biological process. However, inferring biological processes from asymmetry patterns is complex, and generally, additional evidence is required (e.g., wing development [11,12], mouse mandible [12]).

Traditionally, three types of asymmetry can be distinguished in a population according to the probability distribution of the differences between right and left sides: fluctuating asymmetry, directional asymmetry, and antisymmetry (Figure 3A). These asymmetries differ in their mathematical and statistical properties, as well as their origin and biological implications [2,13,14].

Fluctuating asymmetry (FA), unlike other asymmetries, denotes small differences between right and left sides due to random developmental processes [15]. According to Graham et al. [13], all life forms are more or less symmetrical; hence one can demonstrate fluctuating asymmetry in all living organisms, as well as extinct ones [13,16,17]. FA is the principal asymmetry of most organisms. It is not functionally harmful, and it is statistically distributed about a mean of zero (Figure 3A). The origins of FA have been debated for decades, and whether its origins are related (or unrelated) with other fitness components such as reproduction, survivorship, behavior, and physiology still remains unclear [13,14].

Figure 3. Different types of asymmetry (A), namely fluctuating asymmetry, directional asymmetry, and antisymmetry, and their translation into a geometric morphometric paradigm (by Neubauer et al. [18]) represented by a principal component analysis (B).

The expected expression of real traits (morphological change to either the right or the left side of the body) is thought to deviate to a particular degree because of genomic constraints, environmental constraints, or both together [19]. These deviations occur because the developmental processes are not completely deterministic, since they have an inherent random component [4]. This random, or residual, component is expressed as FA. The phenotype of the focal species is usually unknown, though it can be estimated (averaged) by examining each symmetrical component of the individual. FA can be calculated for conspecifics that have experienced the same genetic and environmental conditions. In simple terms, FA is the difference between individual asymmetry (left/right differences) and average directional asymmetry [9]. There has been speculation as to whether the distribution of FA is normal
and whether tests of kurtosis can be used to understand the biological processes that might influence it or antisymmetry. It is thought that a kind of biological translation of the central limit theorem occurs when the normal distribution of symmetrical differences results from the accumulation of multiple small independent random effects [19]. However, this is unlikely because many developmental processes are nonlinear, multiplicative, and aggregative [8,20].

Adaptation of organisms to a particular environment is often influenced by environmental stress [21–27]. In addition, unfavorable temperatures, chemicals, population densities, and many other factors may increase fluctuating asymmetries [28,29]. By studying the relationship between morphology and environmental conditions, one can test hypotheses about the influence of agricultural production on organismal form. It has long been known that different environmental conditions are associated with different levels of stress, which can affect an individual’s ability to overcome this pressure and spread their alleles across a landscape. Environmental conditions related to agricultural production, such as nutritional stress, extreme temperatures, chemical pollution, and conditions of dense population, cause stress during development which can lead to increased FA in organisms [25,30–33]. Nevertheless, it should be clear that the combination of GM and FA opens a new world of analytical tools to investigate the pattern of development and has led researchers to ask new questions about the use of fluctuating asymmetry [4]. The aim of this article is to provide an overview of the use of fluctuating asymmetry (FA), specifically using geometric morphometrics in an environmental context. We highlight how advanced morphometric methods provide the accuracy needed to use FA as a biological indicator of environmental stress.

2. Traditional Morphometrics and Fluctuating Asymmetry

Historically, a series of indices have been suggested to estimate and characterize the numeric value of FA at the individual and population levels [2,3,34]. Only a few of these indices, however, are fundamental and in widespread use. According to Palmer [3], the asymmetry of a given trait in an individual is measured as the absolute difference between the right and left sides (|Ri − Li|), as the assigned difference (Lj − Rj), or as the proportion between the measurements of the sides (log(Ri/Li)). These indices have been used as the base to analyze differences among the asymmetries of specimens; the main difference is the presence or absence, or the way the variation in the size of a trait has been handled. Another index that estimates multiple characters is defined as 1 − r, where r is the correlation between the left and right sides. Windig and Nylin [35] argued that the index 1 − r is useful to compare characters because (a) it is scale independent, (b) it can correct measurement errors, and (c) it includes a normalized index for the variance of the character. Nevertheless, these approaches were criticized [2,36,37] because correlations are influenced by the range of values. Palmer and Strobeck [2] argue that the correlation of R and L acts differently from other indices and never achieves their statistical power [37].

The index used most frequently in the literature is FA1 (mean of absolute deviation |R − L|) being an alternative to var (R − L) but less influenced by outliers [3]. Correspondingly, there is a modification of those indices for positive size scaling. It involves dividing |R| or (R − L) by the size (R + L) of the principal character at the individual level (FA2, FA6, FA8) or at the sample level (FA3, FA7) [3]. Its important to notice that [log R − log L] accomplishes the same thing as |R − L|/(R + L) if R and L are lognormally distributed. Moreover, there is an index that comes from the output of ANOVA which simultaneously tests for measurement errors and size differences among individuals (FA10). More information about these indices can be found in the work of Palmer [3].

3. Fluctuating Asymmetry Using Geometric Morphometrics

Over the last 30 years, geometric morphometrics has been added as a tool in the search for more precise methods for quantifying fluctuating asymmetry, in particular the asymmetry of shape. This has resulted in the reduction of errors that often occur in measurements with traditional morphometrics and has allowed the estimation of more subtle and accurate variations for asymmetry calculation [18,38–43].
Procrustes analysis is undertaken to deduce shape data from raw paired data (landmark x, y coordinates); this results in the removal of superfluous data on size, position, and orientation of the starting material that have been landmarked [38,44]. In addition, studies of left–right asymmetry remove reflection by transforming all configurations from one side of the body into their mirror images (to adjust symmetry [38]) or by including both the original and mirror images of all configurations in the analysis, e.g., object symmetry [4]. It is important that GM not be considered a replacement for traditional morphometrics; rather, it should be considered as an option when studying the effect of biotic and abiotic stress upon organismal shape and form.

Figure 3B shows the kinds of asymmetry and their representation in a geometric morphometrics setting involving principal components analysis (PCA). Neubauer et al. [39] explained how to interpret the adjusted PCA to investigate multivariate shape asymmetry. Each vector (arrow in the PCA plot) represents an individual and their deviation from perfect symmetry. The direction of the vector(s) represents the spatial pattern of the symmetry. If individuals vary in asymmetry, but with no directionality (first PCA-panel to the right), the vectors point equally in all directions. In contrast, the second PCA-panel shows a directionality of the asymmetry in which 80% of the samples (individuals) share the same direction along the PC1 (directional asymmetry). The other 20% of individuals have lower magnitude and the reversed pattern. The third PCA-panel shows a bimodal distribution where 80% of individuals share a similar asymmetry pattern captured by PC1, while 20% show the reversed pattern with a comparable magnitude.

Beasley et al. [45], after a meta-analysis, predicted that geometric morphometric approaches to FA of shape and size would be more sensitive to environmental changes than traditional morphometric approaches. These authors suggested that an environmental stress is best shown using the combined biomarker of FA and GM. Nevertheless, they did not show examples of this combination in their article.

On the other hand, geometric morphometrics could have some disadvantages; Ekrami et al. [46] removed the effect of directional asymmetry in a multivariate context. The conventional method of DA correction does not compensate for the effects of DA in other dimensions of asymmetry. They introduced a new measure of asymmetry called fluctuating directional asymmetry (F-DA). Subtracting population-level DA from all individual asymmetry values can only provide unbiased FA measures (possibly reflecting developmental instability) if the underlying DA is the same (both in magnitude and direction) for all individuals (for more details see Ekrami et al. [46]). Nevertheless, these approaches are not new; they were studied in detail at least 20 years ago by Graham et al. [47] and Van Dongen et al. [48].

Shape asymmetry has been used as a measure of developmental instability [22,23,26,49–53] and to examine relationships between stress or other adverse conditions, inbreeding or hybridization, or fitness [10]. The literature on this topic assumes that if the right and left sides of an organism share the same genome and, generally, the same environment, it can be expected that the organs on the left side and those on the right side will share the same target phenotype (assuming that there is no directional asymmetry). Therefore, any differences will be attributable to developmental instability [4]. Nevertheless, generalizing this assumption can be problematic. Klingenberg [4] indicates that for many organisms, FA occurs because of small random variations in developmental processes; FA can be used to quantify developmental instability. More recently, studies have started to combine the use of shape asymmetry, particularly using GM approaches. So, what is intended to be evaluated with GM is the effect of development on the shape of an individual, where the variations are a response from the organism to developmental instability. A different type of application of FA, also with a major use of GM, is to infer the origin of morphological structures [10,38,41,49,54–56].

The use of geometric morphometrics in FA studies has provided a method to analyze matters that had been already addressed in FA studies with traditional morphometrics, using linear measures as length measurements (Figure 3). This has opened original research paths that address questions related with topics such as morphological integration [4,10,57].
4. FA + GM, Step-by-Step Flow Chart

FA can be analyzed using geometric morphometrics in MorphoJ [58] as follows (outlined in Figure 4):

(a) Two sets of independent images of the individuals are taken and landmarks are digitized, preferably not on the same day, to account for measurement error.

(b) After digitizing the images, both independent datasets are combined in one single dataset. It is important to know that FA measurements of left and right sides are taken for each individual separately; therefore, classifiers of Individuals and Side (for matching asymmetry) need to be incorporated.

(c) A Procrustes fit step is compulsory for all geometric morphometrics data. In this example, there are two matching symmetric wings; thus, the symmetries of paired structures are presented as separate, mirror-image copies, and the software automatically generates a reflection of each original landmark configuration to produce a reflected copy.

(d) The shape asymmetry is calculated for individuals as the deviation from the original landmark configuration of the symmetric consensus. In this step, a Procrustes ANOVA is performed on the combined dataset, using the following classifiers: Individuals (in the Individual section) Side (in the Side section) and From Dataset (in the Error 1 section). It is important to note that the classifier “From Dataset” is the result of the combination of two repeated measurements, and it is compulsory for every fluctuating asymmetry analysis to calculate the measurement error as well.

(e) When there is FA, the interaction of Individual × Side is significant in the Procrustes ANOVA; when there is directional asymmetry (DA), the classifier side is also significant. After this, there are two options to calculate the intensity of FA: one is extracting the MS values from the interaction of Individual × Side Procrustes ANOVA and comparing them between groups; the other is extracting the values of Mahalanobis or Procrustes FA scores from the dataset generated by the Procrustes ANOVA and comparing them between groups.

An example of an article using the flow chart, but using vertebrates, is the one provided by Maestri et al. [49], where the authors analyze the suitability of species for certain habitats, for conservation purposes, to predict the survival of a species in the long term. The authors analyzed FA as a measure of developmental stress, which is used as an indirect indicator of an individual’s performance in different regions.

To measure the variability of habitat suitability, the average FA and morphological variance (within the same population) were correlated with the values of habitat suitability generated by modeling. In addition, spatial autocorrelation tests were conducted to determine if the shape variables were correlated in space, since this may have generated bias in the analysis as it breaks the principles of independence between samples.

Maestri et al. [49] found a negative relationship between suitability and FA. In the less suitable areas, individuals experience a number of disturbances during the ontogenetic development of the cranium. Moreover, they found no association between the morphological variance and the habitat suitability. These results confirm the prediction that developmental stress is greater in less suitable environments. This work paves the way for similar studies. At this time, there are no such studies in any agroecosystem. Future work should explore the methods used by Maestri et al. [49] and apply them to agroecosystems; these highly disturbed environments are likely to exert significant and measurable phenotypic changes on organisms in agroecosystems.
5. Fluctuating Asymmetry Using Geometric Morphometrics in Agroecosystems

Landscape structure and habitat fragmentation influence the ecological interactions and morphology of species [59]. Agricultural land forms a large part of the terrestrial landscape, so the effects of agricultural management on populations are numerous and worthy of investigation. Intensive use of agrochemicals, like pesticides and fertilizers, and disturbance after tillage affect biodiversity in intensively used agroecosystems [60] and natural landscapes [61,62]. Fluctuating asymmetry has been used as an indicator of such stress [2,62,63]. While there are many investigations of FA using traditional morphometrics, only a few studies deal with shape FA landmark-based geometric morphometrics. The number is even smaller if agricultural landscape is included in FA patterns.

In the last few decades, FA has been used to answer many questions related to agroecosystems, principally with the use of pesticides and the ensuing environmental stress. Most of these studies involved traditional approaches [64–70]. Møller et al. [71,72], for example, investigated FA in poultry, showing increasing levels of FA in response to various stressors, such as population density and lighting conditions. Moreover, high FA may be related with prenatal stressors [73,74]. If the mother is exposed to different stressors, it can affect the future offspring. By investigating the body properties of chickens,
Eeva et al. [75] and Satterlee et al. [76] confirmed that FA is observed in tarsus length and increases under environmental stress. Similar responses are seen with face length [76,77]. Eriksen et al. [78] concluded that FA in tarsus length and face length in chickens is a reliable indicator of developmental stress.

In a study of young livestock, Pares-Casanova [79] found that size variance was not reflected in the bone lengths: acropodial sizes were similar between the medial and lateral series. Nevertheless, shape asymmetry was indeed present. Another study showed that DA in Araucan horses was always higher than FA after the effect of size was eliminated. This was attributed to the effects of mechanical forces. The dominance of one side may determine differential mastication and bone remodeling, contributing to directional asymmetry [80].

An example of a study using FA of insects in various agricultural landscapes comes from the work of Benítez et al. These authors used FA as a bio-indicator of the development of shape stability of the carabid beetle *Pterostichus melas*, considering populations living among annual and perennial crops. To collect shape data, the researchers used 2D images of the ventral zone of the beetle body. For this purpose, sixteen landmarks were used, considering right and left sides, and the shape coordinates were derived through a Procrustes fit. To measure symmetry, the reflection was eliminated by including the mirror image and the original image of all the configurations analyzed and performing the superimposition of all of them simultaneously. Measurement error was addressed by digitizing each individual twice. The centroid size variance was used to detect potential size differences, whereas a Procrustes ANOVA was conducted to assess shape asymmetry differences.

These analyses were performed by sex to investigate the effects of sexual dimorphism on shape asymmetry. Shape variation was visualized using a PCA of the population average of the symmetric component of shape. The relationship between shape and FA was examined by a multivariate regression. The relationship between climate data and shape was determined using a partial least squares analysis (PLS). Results indicated that carabids inhabiting the perennial agroecosystem showed phenotypic adaptation to anthropogenic influences compared to carabids from annual agroecosystems where the environment was more unpredictable.

Other work on coleopteran species by Benítez et al. [6] investigated how wing shape and size differ in the endemic and extensive/invasive distribution areas of an invasive pest (*Diabrotica virgifera* LeConte). The morphological integration of *D. v. virgifera* was estimated using fourteen 2D “type 1 landmarks” defined by vein junctions or vein terminations on the hind wings. Analysis of asymmetry was performed as follows: (1) single-sided configurations were mirrored; (2) configurations were then simultaneously superimposed using Procrustes symmetric variation; and (3) asymmetry components were finally obtained from the mean values and contrasts to the original and reflected configurations [55]. Using standard statistical procedures [81], it was then shown that *D. v. virgifera* has a moderately integrated hind wing, and thus the symmetrical or asymmetrical variation patterns found had common variation and thus a common origin.

Nattero et al. [82] demonstrated temporal variations in FA wing size and shape of *Triatoma infestans* populations. By using Procrustes ANOVA, they showed wing FA for each ecotope, sex, and collection year. They concluded that wing FA can be used as a measure of developmental instability. Nattero et al. [83] also noted that the history of insecticide spraying seems to be related to the FA patterns observed; for that reason, Nattero et al. [26] estimated FA under insecticide exposure and described FA for the first time as a marker of insecticide resistance. In their work, they used geometric morphometrics based on landmarks. To assess the wing size asymmetry, the authors estimated centroid size (CS) using orientation configurations of the left and right sides of each individual. Nattero et al. [26] presented the following results of their research: (i) the wing size FA was statistically significant in both females and males before and after spraying; (ii) females showed lower FA values before and after insecticide spraying than males; (iii) females showed higher FA values before spraying than after spraying. In this study, it was documented that wing size and wing shape FA consistently decreased in *T. infestans* shortly after spraying with pyrethroids. The main finding was that the effects of insecticide
application on wing developmental instability are modified by the body size of the insects in the context of insecticide resistance.

It has been argued that FA cannot simply be applied as a general predictor of environmental or genetic stress unless evolutionary, ecological, and methodological assumptions are understood. De Coster et al. reported that FA is widely regarded as a proxy for environmental and genetic stress effects, although empirical associations between FA and stress are often weak or heterogeneous among traits. Some authors believe that only a small number of studies provide (indirect) evidence of a relationship between FA and stress (as reported for *Gasterosteus aculeatus* by Van Dongen et al., *Drosophila melanogaster* by Pelabon et al., and *D. bipectinate* by Polak and Taylor [83]).

The studies of Benitez et al. [6], Nattero et al. [82], and Nattero et al. [26], among other articles using GM exposed before by Klingenberg [4], give an insight into the possibility of using FA as a biomarker for detecting environmentally driven changes in the shape of the organism under different stressors.

6. Conclusions

FA can be used to measure phenotypic response to environmental stress. Many studies have confirmed the use of traditional morphometric FA as a biomarker for stress in agricultural production or for quantifying environmental stress. Geometric morphometric methods of quantifying shape variation have emerged as an alternative way to examine effects of stress on FA. Whether FA is indeed a good measure of development continues to be debated.

Therefore, it is very important to identify FA in an organism, because it does not always reflect perturbations an organism has experienced. Working hypotheses related to population stress and developmental instability should be carefully posed and tested to understand this biological phenomenon further.

The 21st century comes with a new era of integrated science, integrating the analysis of ecological evolutionary developmental biology (Eco-Evo-Devo) to gain a better understanding of the organism’s adaptation to stressors and in response to the need to understand how global environmental changes and management practices affect the adaptation response of a species [1].

FA as an index of environmental stress reveals that organisms are constantly exposed to a changing environment, whether through changes in diet, temperature, predators, competitors, or all these factors simultaneously. The integration with GM has allowed researchers to use it for inferring the developmental origins of integration within or between morphological structures.

Knowledge of the levels of FA in a given organism will reveal the rules underlying the interactions between environment, genes, and the development of an organism and thus aims to broaden our current view of how evolution works. With a better understanding of this, researchers will be able to better understand how certain organisms adapt to environmental stressors.


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