

Aggregation functions for decision making*

Jean-Luc Marichal

Mathematics Research Unit, University of Luxembourg

162A, avenue de la Faiëncerie, L-1511 Luxembourg

jean-luc.marichal[at]uni.lu

January 27, 2009

1 Introduction

Aggregation functions are generally defined and used to combine several numerical values into a single one, so that the final result of the aggregation takes into account all the individual values in a given manner. Such functions are widely used in many well-known disciplines such as statistics, economics, finance, and computer science. For general background, see Grabisch et al. [52].

For instance, suppose that several individuals form quantifiable judgements either about a measure of an object (weight, length, area, height, volume, importance or other attributes) or about a ratio of two such measures (how much heavier, longer, larger, taller, more important, preferable, more meritorious etc. one object is than another). In order to reach a consensus on these judgements, classical aggregation functions have been proposed: arithmetic mean, geometric mean, median and many others.

In multicriteria decision making, values to be aggregated are typically *preference* or *satisfaction* degrees. A preference degree reveals to what extent an alternative a is preferred to an alternative b , and thus is a relative appraisal. By contrast, a satisfaction degree expresses to what extent a given alternative is satisfactory with respect to a given criterion. It is an absolute appraisal.

We assume that the values to be aggregated belong to numerical scales, which can be of ordinal or cardinal type. On an ordinal scale, numbers have no meaning other than defining an order relation on the scale; distances or differences between values cannot be interpreted. On a cardinal scale, distances between values are not quite arbitrary. There are actually several kinds of cardinal scales. On an interval scale, where the position of the zero is a matter of convention, values are defined up to a positive linear transformation i.e. $\phi(x) = rx + s$, with $r > 0$ and $s \in \mathbb{R}$

*Chapter 17 of *Decision-making Process – Concepts and Methods* (ISTE/John Wiley, 2009).

(e.g. temperatures expressed on the Celsius scale). On a ratio scale, where a true zero exists, values are defined up to a similarity transformation i.e. $\phi(x) = rx$, with $r > 0$ (e.g. lengths expressed in inches). We will come back on these measurement aspects in Section 2.2.

Once values are defined we can aggregate them and obtain a new value. This can be done in many different ways according to what is expected from the aggregation function, the nature of the values to be aggregated, and which scale types have been used. Thus, for a given problem, any aggregation function should not be used. In other terms, the use of a given aggregation function should always be justified.

To help the practitioner choose an appropriate aggregation function in a given problem, it is useful and even convenient to adopt an axiomatic approach. Such an approach consists in classifying and choosing aggregation functions according to the properties they fulfill. Thus, a catalog of “desirable” properties is proposed and, whenever possible, a description of the family of aggregation functions satisfying a given set of properties is provided. This is the very principle of axiomatization.

Proposing an interesting axiomatic characterization of an aggregation function (or a family of aggregation functions) is not an easy task. Mostly, aggregation functions can be characterized by different sets of conditions. Nevertheless the various possible characterizations are not equally important. Some of them involve purely technical conditions with no clear interpretation and the result becomes useless. Others involve conditions that contain the result explicitly and the characterization becomes trivial. On the contrary, there are characterizations involving only natural conditions which are easily interpretable. In fact, this is the only case where the result should be seen as a significant contribution. It improves our understanding of the function considered and provides strong arguments to justify (or reject) its use in a given context.

The main aim of this chapter is to present, on an axiomatic basis, the most used families of aggregation functions in decision making. We shall confine ourselves to aggregation functions that assign a numerical value to every profile of n values, which represent objects or alternatives. We will not deal with utility functions which, in a more general way, make it possible to rank alternatives without assigning precise values to them. For instance, procedures such as ‘leximin’ or ‘discrimin’ are ranking procedures, rather than aggregation functions.

The organization of this chapter is as follows. In Section 2 we yield the list of the main properties that we shall use. This list is divided into three classes: (1) elementary properties (continuity, symmetry, etc.); (2) properties related to the scale types used to represent the data; and (3) certain algebraic properties such as associativity. In Section 3 we present the concept of mean and its various definitions. Perhaps the most common definition of means is that of quasi-arithmetic means with a very natural axiomatization due to Kolmogoroff and Nagumo. In Section 4 we present associative functions, which are at the root of the theory of semi-groups. These functions permitted to develop the concept of fuzzy connectives such as t-norms, t-conorms, and uninorms. In Section 5 we present an important branch of the aggregation function theory, namely Choquet and Sugeno non-additive integrals. These integrals enable us to generalize the classical aggregation modes, such as the

weighted arithmetic mean and the median, to functions that take into account the possible interactions among the considered attributes. Finally, in Sections 6 and 7 we present particular functions designed for aggregating interval scales, ratio scales, and ordinal scales.

We close this introduction by setting the notation that we will use in this chapter.

In a general manner, we shall denote an aggregation function with n variables by $A : E^n \rightarrow \mathbb{R}$ where E is a real interval, bounded or not. E° will denote the interior of E . We shall sometimes consider sequences of functions $(A^{(n)} : E^n \rightarrow \mathbb{R})_{n \geq 1}$, the superscript $^{(n)}$ being used only to specify the number of arguments of the function $A^{(n)}$.

We shall use N to denote the index set $\{1, \dots, n\}$ and 2^N to denote the set of its subsets. Π_N will be used to denote the set of permutations on N . Finally, for any $S \subseteq N$, the characteristic vector of S in $\{0, 1\}^n$ will be denoted $\mathbf{1}_S$.

There is also a rather standard notation for certain aggregation functions. Here are the most common ones:

- The *arithmetic mean* is defined as

$$\text{AM}(x) = \frac{1}{n} \sum_{i=1}^n x_i.$$

- For any weight vector $\omega = (\omega_1, \dots, \omega_n) \in [0, 1]^n$ such that $\sum_i \omega_i = 1$, the *weighted arithmetic mean* and the *ordered weighted averaging function* are defined as

$$\begin{aligned} \text{WAM}_\omega(x) &= \sum_{i=1}^n \omega_i x_i, \\ \text{OWA}_\omega(x) &= \sum_{i=1}^n \omega_i x_{(i)}, \end{aligned}$$

respectively, where (\cdot) represents a permutation on N such that $x_{(1)} \leq \dots \leq x_{(n)}$.

- For any $k \in N$, the *projection* and the *order statistic* associated with the k th argument are defined as

$$\begin{aligned} \text{P}_k(x) &= x_k, \\ \text{OS}_k(x) &= x_{(k)}, \end{aligned}$$

respectively.

- For any $S \subseteq N$, $S \neq \emptyset$, the *partial minimum* and *partial maximum* functions associated with S are defined as

$$\begin{aligned} \min_S(x) &= \min_{i \in S} x_i, \\ \max_S(x) &= \max_{i \in S} x_i, \end{aligned}$$

respectively.

In this chapter the min and max operations will often be denoted \wedge and \vee , respectively.

2 Aggregation properties

As mentioned in the introduction, in order to choose a reasonable or satisfactory aggregation mode, it is useful to adopt an axiomatic approach and impose that the aggregation functions fulfill some selected properties. Such properties can be dictated by the nature of the values to be aggregated. For example, in some multicriteria evaluation methods, the aim is to assess a global absolute score to an alternative given a set of partial scores with respect to different criteria. Clearly, it would be unnatural to give as a global score a value which is lower than the lowest partial score, or greater than the highest score, so that only internal aggregation functions (means) are allowed. Another example concerns the aggregation of opinions in voting procedures. If, as usual, the voters are anonymous, the aggregation function must be symmetric.

In this section we present some properties that could be desirable or not depending upon the considered problem. Of course, all these properties are not required with the same strength, and do not pertain to the same purpose. Some of them are imperative conditions whose violation leads to obviously counterintuitive aggregation modes. Others are technical conditions that simply facilitate the representation or the calculation of the aggregation function. There are also facultative conditions that naturally apply in special circumstances but are not to be universally accepted.

2.1 Elementary mathematical properties

Definition 2.1 $A : E^n \rightarrow \mathbb{R}$ is symmetric if, for any $\pi \in \Pi_N$, we have

$$A(x_1, \dots, x_n) = A(x_{\pi(1)}, \dots, x_{\pi(n)}) \quad (x \in E^n).$$

The symmetry property essentially implies that the indexing (ordering) of the arguments does not matter. This is required when combining criteria of equal importance or the opinions of anonymous experts.

Definition 2.2 $A : E^n \rightarrow \mathbb{R}$ is continuous if it is continuous in the usual sense.

One of the advantages of a continuous aggregation function is that it does not present any chaotic reaction to a small change of the arguments.

Definition 2.3 $A : E^n \rightarrow \mathbb{R}$ is

- nondecreasing if, for any $x, x' \in E^n$, we have

$$x \leq x' \quad \Rightarrow \quad A(x) \leq A(x'),$$

- *strictly increasing if it is nondecreasing and if, for any $x, x' \in E^n$, we have*

$$x \leq x' \text{ et } x \neq x' \Rightarrow A(x) < A(x'),$$

- *unanimously increasing if it is nondecreasing and if, for any $x, x' \in E^n$, we have*

$$x < x' \Rightarrow A(x) < A(x').$$

An increasing aggregation function presents a non-negative response to any increase of the arguments. In other terms, increasing a partial value cannot decrease the result. This function is strictly increasing if, moreover, it presents a positive reaction to any increase of at least one argument. Finally, a unanimously increasing function is increasing and presents a positive response whenever all the arguments strictly increase. For instance we observe that on $[0, 1]^n$, the maximum function $A(x) = \max x_i$ is unanimously increasing whereas the bounded sum $A(x) = \min(\sum_{i=1}^n x_i, 1)$ is not.

Definition 2.4 $A : E^n \rightarrow \mathbb{R}$ is idempotent if $A(x, \dots, x) = x$ for all $x \in E$.

Definition 2.5 $A : [a, b]^n \rightarrow \mathbb{R}$ is weakly idempotent if $A(a, \dots, a) = a$ and $A(b, \dots, b) = b$.

In a variety of applications, it is desirable that the aggregation functions satisfy the idempotency property, i.e. if all x_i are identical, $A(x_1, \dots, x_n)$ restitutes the common value.

Definition 2.6 $A : E^n \rightarrow \mathbb{R}$ is

- *conjunctive if $A(x) \leq \min x_i$ for all $x \in E^n$,*
- *disjunctive if $\max x_i \leq A(x)$ for all $x \in E^n$,*
- *internal if $\min x_i \leq A(x) \leq \max x_i$ for all $x \in E^n$.*

Conjunctive functions combine values as if they were related by a logical **AND** operator. That is, the result of aggregation can be high only if all the values are high. t-norms are suitable functions for doing conjunctive aggregation (see Section 4.5). At the opposite, disjunctive functions combine values as an **OR** operator, so that the result of aggregation is high if at least one value is high. The best known disjunctive functions are t-conorms.

Between these two extreme situations are the internal functions, located between the minimum and the maximum of the arguments. In this kind of functions, a bad (resp. good) score on one criterion can be compensated by a good (resp. bad) one on another criterion, so that the result of aggregation will be medium. By definition, means are internal functions (see Section 3).

2.2 Stability properties related to scale types

Depending on the kind of scale which is used, allowed operations on values are restricted. For example, aggregation on ordinal scales should be limited to operations involving comparisons only, such as medians and order statistics.

A *scale of measurement* is a mapping which assigns real numbers to objects being measured. The *type* of a scale, as defined by Stevens [101, 102], is defined by a class of *admissible transformations*, transformations that lead from one acceptable scale to another. For instance, we call a scale a *ratio scale* if the class of admissible transformations consists of the similarities $\phi(x) = rx$, with $r > 0$. In this case, the scale value is determined up to choice of a unit. Mass is an example of a ratio scale. The transformation from kilograms into pounds, for example, involves the admissible transformation $\phi(x) = 2.2x$. Length (inches, centimeters) and time intervals (years, seconds) are two other examples of ratio scales. We call a scale an *interval scale* if the class of admissible transformations consists of the positive linear transformations $\phi(x) = rx + s$, with $r > 0$ and $s \in \mathbb{R}$. The scale value is then determined up to choices of unit and zero point. Temperature (except where there is an absolute zero) defines an interval scale. Thus, transformation from Centigrade into Fahrenheit involves the admissible transformation $\phi(x) = 9x/5 + 32$. We call a scale an *ordinal scale* if the class of admissible transformations consists of the strictly increasing bijections $\phi(x)$. Here the scale value is determined only up to order. For example, the scale of air quality being used in a number of cities is an ordinal scale. It assigns a number 1 to unhealthy air, 2 to unsatisfactory air, 3 to acceptable air, 4 to good air, and 5 to excellent air. We could just as well use the numbers 1, 7, 8, 15, 23, or the numbers 1.2, 6.5, 8.7, 205.6, 750, or any numbers that preserve the order. Definitions of other scale types can be found in the book by Roberts [92] on measurement theory, see also Roberts [93, 94]. The reader will find further details on measurement in Chapter 18 of the present volume.

A statement using scales of measurement is said to be *meaningful* if the truth or falsity of the statement is invariant when every scale is replaced by another acceptable version of it [92, p. 59]. For example, a ranking method is meaningful if the ranking of alternatives induced by the aggregation does not depend on scale transformation.

In 1959, Luce [62] observed that the general form of a functional relationship between variables is greatly restricted if we know the scale type of the variables. These restrictions are discovered by formulating a functional equation from knowledge of the admissible transformations. Luce's method is based on the principle of theory construction, which states that an admissible transformation of the independent variables may lead to an admissible transformation of the dependent variable. For example, suppose that $f(a) = A(f_1(a), \dots, f_n(a))$, where f and f_1, \dots, f_n are all ratio scales, with the units chosen independently. Then, by the principle of theory construction, we obtain the functional equation

$$\begin{aligned} A(r_1x_1, \dots, r_nx_n) &= R(r_1, \dots, r_n)A(x_1, \dots, x_n), \\ r_i &> 0, \quad R(r_1, \dots, r_n) > 0. \end{aligned}$$

Aczél et al. [9] showed that the solutions of this equation are given by

$$A(x) = a \prod_{i=1}^n g_i(x_i), \quad \text{with } a > 0, g_i > 0,$$

and

$$g_i(x_i y_i) = g_i(x_i) g_i(y_i).$$

In this section we present some functional equations related to certain scale types. The interested reader can find more details in Aczél et al. [8, 9] and a good survey in Roberts [94].

Definition 2.7 $A : \mathbb{R}^n \rightarrow \mathbb{R}$ is

- *meaningful for the same input-output ratio scales if, for any $r > 0$, we have*

$$A(rx_1, \dots, rx_n) = rA(x_1, \dots, x_n) \quad (x \in \mathbb{R}^n),$$

- *meaningful for the same input ratio scales if, for any $r > 0$, there exists $R_r > 0$ such that*

$$A(rx_1, \dots, rx_n) = R_r A(x_1, \dots, x_n) \quad (x \in \mathbb{R}^n),$$

- *meaningful for the same input-output interval scales if, for any $r > 0$ and $s \in \mathbb{R}$, we have*

$$A(rx_1 + s, \dots, rx_n + s) = rA(x_1, \dots, x_n) + s \quad (x \in \mathbb{R}^n),$$

- *meaningful for the same input interval scales if, for any $r > 0$ and $s \in \mathbb{R}$, there exist $R_{r,s} > 0$ and $S_{r,s} \in \mathbb{R}$ such that*

$$A(rx_1 + s, \dots, rx_n + s) = R_{r,s} A(x_1, \dots, x_n) + S_{r,s} \quad (x \in \mathbb{R}^n),$$

- *meaningful for the same input-output ordinal scales if, for any strictly increasing bijection $\phi : \mathbb{R} \rightarrow \mathbb{R}$, we have*

$$A(\phi(x_1), \dots, \phi(x_n)) = \phi(A(x_1, \dots, x_n)) \quad (x \in \mathbb{R}^n),$$

- *meaningful for the same input ordinal scales if, for any strictly increasing bijection $\phi : \mathbb{R} \rightarrow \mathbb{R}$, there exists a strictly increasing function $\psi_\phi : \mathbb{R} \rightarrow \mathbb{R}$ such that*

$$A(\phi(x_1), \dots, \phi(x_n)) = \psi_\phi(A(x_1, \dots, x_n)) \quad (x \in \mathbb{R}^n).$$

2.3 Algebraic properties

The following properties concern the aggregation procedures that can be decomposed into partial aggregations, that is, procedures for which it is possible to partition the set of attributes into disjoint subgroups, build the partial aggregation for each subgroup, and then combine these partial results to get the global value. This condition may take several forms. Maybe one of the strongest is associativity. Other weaker formulations will also be presented: decomposability and bisymmetry.

We first present associativity for two variable functions.

Definition 2.8 *$A : E^2 \rightarrow E$ is associative if, for any $x \in E^3$, we have*

$$A(A(x_1, x_2), x_3) = A(x_1, A(x_2, x_3)).$$

A large number of papers deal with the associativity functional equation. For a list of references see Aczél [4, §6.2].

This property can be extended to sequences of functions as follows.

Definition 2.9 *The sequence $(A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is associative if $A^{(1)}(x) = x$ for all $x \in E$ and*

$$A^{(n)}(x_1, \dots, x_k, x_{k+1}, \dots, x_n) = A^{(n)}(A^{(k)}(x_1, \dots, x_k), A^{(n-k)}(x_{k+1}, \dots, x_n))$$

for all $x \in E^n$ and all $k, n \in \mathbb{N}$ such that $1 \leq k \leq n$.

Implicit in the assumption of associativity is a consistent way of going unambiguously from the aggregation of n elements to $n + 1$ elements, i.e., if M is associative

$$A^{(n+1)}(x_1, \dots, x_{n+1}) = A^{(2)}(A^{(n)}(x_1, \dots, x_n), x_{n+1}),$$

for all $n \in \mathbb{N} \setminus \{0\}$.

Let us turn to the decomposability property. For this purpose, we introduce the following notation: For any $k \in \mathbb{N} \setminus \{0\}$ and any $x \in \mathbb{R}$, we set $k \cdot x = x, \dots, x$ (k times). For example,

$$A(3 \cdot x, 2 \cdot y) = A(x, x, x, y, y).$$

Definition 2.10 *The sequence $(A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is decomposable if $A^{(1)}(x) = x$ for all $x \in E$ and*

$$A^{(n)}(x_1, \dots, x_k, x_{k+1}, \dots, x_n) = A^{(n)}(k \cdot A^{(k)}(x_1, \dots, x_k), (n-k) \cdot A^{(n-k)}(x_{k+1}, \dots, x_n))$$

for all $x \in E^n$ and all $k, n \in \mathbb{N}$ such that $1 \leq k \leq n$.

Here the definition is the same as for associativity, except that the partial aggregations are duplicated by the number of aggregated values.

Introduced first in Bemporad [14, p. 87] in a characterization of the arithmetic mean, decomposability has been used by Kolmogoroff [60] and Nagumo [84] to characterize the quasi-arithmetic means. More recently, Marichal et Roubens [72] proposed calling this property “decomposability” in order to avoid confusion with classical associativity.

The *bisymmetry* property, which extends associativity and symmetry simultaneously, is defined for n -variables functions as follows.

Definition 2.11 $A : E^n \rightarrow E$ is bisymmetric if

$$\begin{aligned} & A(A(x_{11}, \dots, x_{1n}), \dots, A(x_{n1}, \dots, x_{nn})) \\ &= A(A(x_{11}, \dots, x_{n1}), \dots, A(x_{1n}, \dots, x_{nn})) \end{aligned}$$

for all square matrix $(x_{ij}) \in E^{n \times n}$.

For 2-variable functions, this property has been investigated from the algebraic point of view by using it mostly in structures without the property of associativity; see Aczél [4, §6.4] and Aczél and Dhombres [6, Chapter 17].

For a sequence of functions, this property becomes as described in the following definition.

Definition 2.12 The sequence $(A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is bisymmetric if $A^{(1)}(x) = x$ for all $x \in E$ and

$$\begin{aligned} & A^{(p)}(A^{(n)}(x_{11}, \dots, x_{1n}), \dots, A^{(n)}(x_{n1}, \dots, x_{pn})) \\ &= A^{(n)}(A^{(p)}(x_{11}, \dots, x_{p1}), \dots, A^{(p)}(x_{1n}, \dots, x_{pn})) \end{aligned}$$

for all $n, p \in \mathbb{N} \setminus \{0\}$ and all matrix $(x_{ij}) \in E^{p \times n}$.

3 Means

It would be very unnatural to propose a chapter on aggregation functions without dealing somehow with *means*. Already discovered and studied by the ancient Greeks (see for instance Antoine [12, Chapter 3]) the concept of mean has given rise today to a very wide field of investigation with a huge variety of applications. Actually, a tremendous amount of literature on the properties of several means (such as the arithmetic mean, the geometric mean, etc.) has already been produced, especially since the 19th century, and is still developing today. For a good overview, see the expository paper by Frosini [44] and the remarkable monograph by Bullen et al. [18].

The first modern definition of mean was probably due to Cauchy [19] who considered in 1821 a mean as an internal (Definition 2.6) function.

The concept of mean as a *numerical equalizer* is usually ascribed to Chisini [20, p. 108], who provided the following definition:

Let $y = g(x_1, \dots, x_n)$ be a function of n independent variables x_1, \dots, x_n representing homogeneous quantities. A mean of x_1, \dots, x_n with respect to the function g is a number M such that, if each of x_1, \dots, x_n is replaced with M , the function value is unchanged, that is,

$$g(M, \dots, M) = g(x_1, \dots, x_n).$$

When g is considered as the sum, the product, the sum of squares, the sum of inverses, or the sum of exponentials, the solution of Chisini's equation corresponds to the arithmetic mean, the geometric mean, the quadratic mean, the harmonic mean, and the exponential mean, respectively.

Unfortunately, as noted by de Finetti [26, p. 378] in 1931, Chisini's definition is so general that it does not even imply that the "mean" (provided there exists a real and unique solution to Chisini's equation) fulfills Cauchy's internality property.

The following quote from Ricci [91, p. 39] could be considered as another possible criticism to Chisini's view.

... when all values become equal, the mean equals any of them too. The inverse proposition is not true. If a function of several variables takes their common value when all variables coincide, this is not sufficient evidence for calling it a mean. For example, the function

$$g(x_1, x_2, \dots, x_n) = x_n + (x_n - x_1) + (x_n - x_2) + \dots + (x_n - x_{n-1})$$

equals x_n when $x_1 = \dots = x_n$, but it is even greater than x_n as long as x_n is greater than every other variable.

In 1930, Kolmogoroff [60] and Nagumo [84] considered that the mean should be more than just a Cauchy mean or a numerical equalizer. They defined a *mean value* to be a decomposable sequence of continuous, symmetric, strictly increasing (in each variable), and idempotent real functions

$$M^{(1)}(x_1) = x_1, M^{(2)}(x_1, x_2), \dots, M^{(n)}(x_1, \dots, x_n), \dots$$

They proved, independently of each other, that these conditions are necessary and sufficient for the quasi-arithmeticity of the mean, that is, for the existence of a continuous strictly monotonic function f such that $M^{(n)}$ may be written in the form

$$M^{(n)}(x_1, \dots, x_n) = f^{-1} \left[\frac{1}{n} \sum_{i=1}^n f(x_i) \right] \quad (1)$$

for all $n \in \mathbb{N} \setminus \{0\}$.

The *quasi-arithmetic means* (1) comprise most of the algebraic means of common use; see Table 1. However, some means, such as the median, do not belong to this family.

The above properties defining a mean value seem to be natural enough. For instance, one can readily see that, for increasing means, the idempotency property is equivalent to Cauchy's internality, and both are accepted by all statisticians as requisites for means.

The decomposability property of means is rather natural. Under idempotency, this condition becomes equivalent to

$$\begin{aligned} M^{(k)}(x_1, \dots, x_k) &= M^{(k)}(x'_1, \dots, x'_k) \\ \Downarrow \\ M^{(n)}(x_1, \dots, x_k, x_{k+1}, \dots, x_n) &= M^{(n)}(x'_1, \dots, x'_k, x_{k+1}, \dots, x_n) \end{aligned}$$

which states that the mean does not change when altering some values without modifying their partial mean.

$f(x)$	$M^{(n)}(x_1, \dots, x_n)$	name
x	$\frac{1}{n} \sum_{i=1}^n x_i$	arithmetic
x^2	$\left(\frac{1}{n} \sum_{i=1}^n x_i^2\right)^{1/2}$	quadratic
$\log x$	$\left(\prod_{i=1}^n x_i\right)^{1/n}$	geometric
x^{-1}	$\frac{1}{\frac{1}{n} \sum_{i=1}^n \frac{1}{x_i}}$	harmonic
$x^\alpha \ (\alpha \in \mathbb{R} \setminus \{0\})$	$\left(\frac{1}{n} \sum_{i=1}^n x_i^\alpha\right)^{1/\alpha}$	root-mean-power
$e^{\alpha x} \ (\alpha \in \mathbb{R} \setminus \{0\})$	$\frac{1}{\alpha} \ln \left(\frac{1}{n} \sum_{i=1}^n e^{\alpha x_i}\right)$	exponential

Table 1: Examples of quasi-arithmetic means

The purpose of this section is not to present a state of the art of all the known results in this vast realm of means. Instead, we just skim the surface of the subject by pointing out characterization results for the most-often used and best-known families of means.

The medians and, more generally, the order statistics (which are particular means designed to aggregate ordinal values) will be briefly presented in Section 7.

3.1 Quasi-arithmetic means

As we just mentioned, quasi-arithmetic means were introduced from a very natural axiomatization. In this section, we investigate those means both as n -variable functions and as sequences of functions. Results on this class of means can also be found in Bullen et al. [18, Chapitre 4].

It was proved by Aczél [2] (see also [4, §6.4] and [6, Chapter 17]) that the quasi-arithmetic means are the only symmetric, continuous, strictly increasing, idempotent, real functions $M : E^n \rightarrow E$ which satisfy the bisymmetry condition. The statement of this result is formulated as follows.

Theorem 3.1 *$M : E^n \rightarrow E$ is a symmetric, continuous, strictly increasing, idempotent, and bisymmetric function if and only if there exists a continuous and strictly*

monotonic function $f : E \rightarrow \mathbb{R}$ such that

$$M(x) = f^{-1}\left[\frac{1}{n} \sum_{i=1}^n f(x_i)\right] \quad (x \in E^n). \quad (2)$$

The *quasi-arithmetic means* (2) are internal aggregation functions and cover a wide spectrum of means including arithmetic, quadratic, geometric, harmonic; see Table 1.

The function f occurring in equation (2) is called a *generator* of M . It was also proved that f is determined up to a linear transformation: With $f(x)$, every function

$$g(x) = rf(x) + s \quad (r, s \in \mathbb{R}, r \neq 0)$$

belongs to the same M , but no other function.

In addition to Aczél's result, we also recall Kolmogoroff-Nagumo's result.

Theorem 3.2 *The sequence $(M^{(n)} : E^n \rightarrow E)_{n \geq 1}$ is a decomposable sequence of symmetric, continuous, strictly increasing, and idempotent functions if and only if there is a continuous and strictly monotonic function $f : E \rightarrow \mathbb{R}$ such that*

$$M^{(n)}(x) = f^{-1}\left[\frac{1}{n} \sum_{i=1}^n f(x_i)\right] \quad (x \in E^n).$$

Nagumo [84] investigated some subfamilies of the class of quasi-arithmetic means. He proved the following result (see also [5, §4] and [6, Chapitre 15]).

Proposition 3.1 *Assume $E =]0, \infty[$ or a subinterval.*

(i) *$M : E^n \rightarrow E$ is a quasi-arithmetic mean that is meaningful for the same input-output ratio scales if and only if*

- *either M is the geometric mean:*

$$M(x) = \left(\prod_{i=1}^n x_i\right)^{\frac{1}{n}} \quad (x \in E^n),$$

- *or M is a root-mean-power: there exists $\alpha \in \mathbb{R} \setminus \{0\}$ such that*

$$M(x) = \left(\frac{1}{n} \sum_{i=1}^n x_i^\alpha\right)^{\frac{1}{\alpha}} \quad (x \in E^n). \quad (3)$$

(ii) *$M : E^n \rightarrow E$ is a quasi-arithmetic mean that is meaningful for the same input-output interval scales if and only if M is the arithmetic mean.*

Let us denote the root-mean-power (3) generated by $\alpha \in \mathbb{R} \setminus \{0\}$ by $M_{(\alpha)}$. It is well known [13, §16] that, if $\alpha_1 < \alpha_2$ then $M_{(\alpha_1)}(x) \leq M_{(\alpha_2)}(x)$ for all $x \in]0, +\infty[^n$ (equality if and only if all x_i are equal).

The family of root-mean-powers was studied by Dujmović [35, 36] and then by Dyckhoff et Pedrycz [37]. It encompasses most of traditionally known means: the

arithmetic mean $M_{(1)}$, the harmonic mean $M_{(-1)}$, the quadratic mean $M_{(2)}$, and three limiting cases: the geometric mean $M_{(0)}$, the minimum $M_{(-\infty)}$ and the maximum $M_{(+\infty)}$ (see, e.g., Abramowitz and Stegun [1]).

Let us return to Theorem 3.1. Note that Aczél [2] also investigated the case where symmetry and idempotency are dropped (see also [4, §6.4] and [6, Chapitre 17]). He obtained the following result.

Theorem 3.3 (i) $M : E^n \rightarrow E$ is a continuous, strictly increasing, idempotent, and bisymmetric function if and only if there exists a continuous and strictly monotonic function $f : E \rightarrow \mathbb{R}$ and real numbers $\omega_1, \dots, \omega_n > 0$ fulfilling $\sum_i \omega_i = 1$ such that

$$M(x) = f^{-1} \left[\sum_{i=1}^n \omega_i f(x_i) \right] \quad (x \in E^n). \quad (4)$$

(ii) $M : E^n \rightarrow E$ is a continuous, strictly increasing, and bisymmetric function if and only if there exists a continuous and strictly monotonic function $f : E \rightarrow \mathbb{R}$ and real numbers $p_1, \dots, p_n > 0$ and $q \in \mathbb{R}$ such that

$$M(x) = f^{-1} \left[\sum_{i=1}^n p_i f(x_i) + q \right] \quad (x \in E^n). \quad (5)$$

The quasi-linear means (4) and the quasi-linear functions (5) are weighted aggregation functions. The question of uniqueness with respect to f is dealt with in detail in Aczél [4, §6.4]. Table 2 provides some special cases of quasi-linear means.

$f(x)$	$M(x)$	name of weighted mean
x	$\sum_{i=1}^n \omega_i x_i$	arithmetic
x^2	$\left(\sum_{i=1}^n \omega_i x_i^2 \right)^{1/2}$	quadratic
$\log x$	$\prod_{i=1}^n x_i^{\omega_i}$	geometric
$x^\alpha \ (\alpha \in \mathbb{R} \setminus \{0\})$	$\left(\sum_{i=1}^n \omega_i x_i^\alpha \right)^{1/\alpha}$	root-mean-power

Table 2: Examples of quasi-linear means

3.2 Lagrangian and Cauchy means

Let us consider the intermediate point M in the classical mean value formula

$$F(y) - F(x) = F'(M)(y - x) \quad (x, y \in E), \quad (6)$$

as a function of the variables x, y , with the convention $M(x, x) = x$, where $F : E \rightarrow \mathbb{R}$ is a given continuously differentiable and strictly convex or strictly concave function. Reformulating this definition in terms of integrals instead of derivatives, we can rewrite (6) as

$$M(x, y) = \begin{cases} f^{-1} \left(\frac{1}{y - x} \int_x^y f(\xi) d\xi \right), & \text{if } x \neq y, \\ x, & \text{if } x = y, \end{cases} \quad (7)$$

for $x, y \in I$, where $f : E \rightarrow \mathbb{R}$ is a continuous strictly monotonic function. This function $M(x, y)$ is called the *Lagrangian mean* associated with f . See for example Berrone and Moro [15] and Bullen et al. [18, p. 343]. The uniqueness of the generator is the same as for quasi-arithmetic means, that is, defined up to a linear transformation; see Berrone and Moro [15, Corollary 7] and Matkowski [76, Theorem 1].

Many classical means are Lagrangian. The arithmetic mean and the geometric means correspond to taking $f(x) = x$ and $f(x) = 1/x^2$, respectively, in (7). The harmonic mean, however, is not Lagrangian.

In general, some of the most common means are both quasi-arithmetic and Lagrangian. However, there are quasi-arithmetic means, such as the harmonic one, which are not Lagrangian. Conversely, the logarithmic mean

$$M(x, y) = \begin{cases} \frac{x - y}{\log x - \log y}, & \text{for } x, y > 0, x \neq y, \\ x, & \text{for } x = y > 0, \end{cases}$$

is an example of a Lagrangian mean ($f(x) = 1/x$) that is not quasi-arithmetic.

Let us now consider the Cauchy mean value theorem, which asserts that, for any functions F and g , continuous on an interval $[x, y]$ and differentiable on $]x, y[$, there exists $M \in]a, b[$ such that

$$\frac{F(y) - F(x)}{g(y) - g(x)} = \frac{F'(M)}{g'(M)}$$

If the functions g and $f := F'/g'$ are strictly monotonic on $]x, y[$, the mean value $M(x, y)$ is unique and can be written as

$$M(x, y) = \begin{cases} f^{-1} \left(\frac{1}{g(y) - g(x)} \int_x^y f(\xi) dg(\xi) \right), & \text{if } x \neq y, \\ x, & \text{if } x = y, \end{cases}$$

for $x, y \in E$. It is then said to be the *Cauchy mean associated with the pair (f, g)* ; see Berrone and Moro [16]. Such a mean is continuous, idempotent, symmetric, and strictly increasing.

When $g = f$ (resp. g is the identity function), we retrieve the quasi-arithmetic (resp. the Lagrangian) mean generated by f . The *anti-Lagrangian mean* [16] is obtained when f is the identity function. For example, the harmonic mean is an anti-Lagrangian mean generated by the function $g = 1/x^2$. The generators of the same anti-Lagrangian mean are defined up to the same non-zero affine transformation.

4 Associative aggregation functions

Before dealing with associative functions and their axiomatizations, we will need to introduce some useful concepts. A *semigroup* (E, A) is a set E with an associative operation $A : E^2 \rightarrow E$ defined on it. As usual, we assume that E is a real interval, bounded or not.

An element $e \in E$ is

- a) an *identity* for A if $A(e, x) = A(x, e) = x$ for all $x \in E$,
- b) a *zero* (or *annihilator*) for A if $A(e, x) = A(x, e) = e$ for all $x \in E$,
- c) an *idempotent* for A if $A(e, e) = e$.

For any semigroup (E, A) , it is clear that there is at most one identity and at most one zero for A in E , and both are idempotents.

We also need to introduce the concept of *ordinal sum*, well known in the theory of semigroups (see, e.g., Climescu [22] and Ling [61]).

Definition 4.1 *Let K be a totally ordered set and $\{(E_k, A_k) \mid k \in K\}$ be a collection of disjoint semigroups indexed by K . Then the ordinal sum of $\{(E_k, A_k) \mid k \in K\}$ is the set-theoretic union $\cup_{k \in K} E_k$ under the following binary operation:*

$$A(x, y) = \begin{cases} A_k(x, y), & \text{si } \exists k \in K \text{ such that } x, y \in E_k \\ \min(x, y), & \text{si } \exists k_1, k_2 \in K, k_1 \neq k_2 \text{ such that } x \in E_{k_1} \text{ and } y \in E_{k_2}. \end{cases}$$

The ordinal sum is a semigroup under the above defined operation.

4.1 Strictly increasing functions

Aczél [3] investigated the general continuous, strictly increasing, real solutions on E^2 of the associativity functional equation (2.8). He proved the following result (see also [4, §6.2]).

Theorem 4.1 *Let E be a real interval, bounded or not, which is open on one side. $A : E^2 \rightarrow E$ is continuous, strictly increasing, and associative if and only if there exists a continuous and strictly monotonic function $f : E \rightarrow \mathbb{R}$ such that*

$$A(x, y) = f^{-1}[f(x) + f(y)] \quad ((x, y) \in E^2). \quad (8)$$

It was also proved that the function f occurring in (8) is determined up to a multiplicative constant, that is, with $f(x)$ all functions $g(x) = r f(x)$ ($r \in \mathbb{R} \setminus \{0\}$) belongs to the same A , and only these.

Moreover, the function f is such that, if $e \in E$ then

$$A(e, e) = e \Leftrightarrow f(e) = 0. \quad (9)$$

By (9) and because of strict monotonicity of f , there is at most one idempotent for A (which is, actually, the identity) and hence A cannot be idempotent. Therefore, there is no continuous, strictly increasing, idempotent, and associative function. However, we can notice that every continuous, strictly increasing, and associative function is necessarily symmetric. The sum ($f(x) = x$) and the product ($f(x) = \log x$) are well-known examples of continuous, strictly increasing, and associative functions.

According to Ling [61], any semigroup (E, M) satisfying the hypotheses of Theorem 4.1 is called *Aczélian*.

Recall that each associative sequence $(A^{(n)} : E^n \rightarrow E)_{n \geq 1}$ of functions is uniquely determined by its 2-variable function. We therefore have the following result.

Corollary 4.1 *Let E be a real interval, bounded or not, which is open on one side. $(A^{(n)} : E^n \rightarrow E)_{n \geq 1}$ is an associative sequence of continuous and strictly increasing functions if and only if there exists a continuous and strictly monotonic function $f : E \rightarrow \mathbb{R}$ such that, for all $n \in \mathbb{N} \setminus \{0\}$,*

$$A^{(n)}(x) = f^{-1} \left[\sum_{i=1}^n f(x_i) \right] \quad (x \in E^n).$$

4.2 Archimedean semigroups

Some authors attempted to generalize Theorem 4.1 by relaxing the strict increasing monotonicity into nondecreasing monotonicity. However it seems that the class of continuous, nondecreasing, and associative functions has not yet been described. However, under some additional conditions, results have been obtained.

First, we state a representation theorem attributed very often to Ling [61]. In fact, her main theorem can be deduced from previously known results on topological semigroups, see Faucett [38] and Mostert and Shields [80]. Nevertheless, the advantage of Ling's approach is twofold: it treats two different cases in a unified manner and establishes elementary proofs.

Theorem 4.2 *Let $E = [a, b]$. $A : E^2 \rightarrow E$ is continuous, nondecreasing, associative, and*

$$A(b, x) = x \quad (x \in E) \quad (10)$$

$$A(x, x) < x \quad (x \in E^\circ) \quad (11)$$

if and only if there exists a continuous strictly decreasing function $f : E \rightarrow [0, +\infty]$, with $f(b) = 0$, such that

$$A(x, y) = f^{-1}[\min(f(x) + f(y), f(a))] \quad (x, y \in E). \quad (12)$$

The requirement that E be closed is not really a restriction. If E is any real interval, finite or infinite with right endpoint b (b can be $+\infty$), then we can replace condition (10) with

$$\lim_{t \rightarrow b^-} A(t, t) = b, \quad \lim_{t \rightarrow b^-} A(t, x) = x \quad (x \in E).$$

Any function f solving equation (12) is called an *additive generator* (or simply *generator*) of A . Moreover, we can easily see that any function A of the form (12) is symmetric and conjunctive.

Condition (10) expresses that b is a *left identity* for A . It turns out, from (12), that b acts as an identity and a as a zero. Condition (11) simply expresses that there are no idempotents for A in $]a, b[$. Indeed, by nondecreasing monotonicity and (10), we always have $A(x, x) \leq A(b, x) = x$ for all $x \in [a, b]$.

Depending on whether $f(a)$ is finite or infinite (recall that $f(a) \in [0, +\infty]$), A takes a well-defined form (see Fodor and Roubens [43, §1.3] and Schweizer and Sklar [100]):

- $f(a) < +\infty$ if and only if A has *zero divisors* (i.e. $\exists x, y \in]a, b[$ such that $A(x, y) = a$). In this case, there exists a continuous strictly increasing function $g : [a, b] \rightarrow [0, 1]$, with $g(a) = 0$ and $g(b) = 1$, such that

$$A(x, y) = g^{-1}[\max(g(x) + g(y) - 1, 0)] \quad (x, y \in [a, b]). \quad (13)$$

To see this, it suffices to set $g(x) := 1 - f(x)/f(a)$.

For associative sequences $(A^{(n)} : [a, b]^n \rightarrow [a, b])_{n \geq 1}$, (13) becomes

$$A^{(n)}(x) = g^{-1}\left[\max\left(\sum_{i=1}^n g(x_i) - n + 1, 0\right)\right] \quad (x \in [a, b]^n, n \in \mathbb{N} \setminus \{0\}).$$

- $\lim_{t \rightarrow a^+} f(t) = +\infty$ if and only if A is strictly increasing on $]a, b[$. In this case, there exists a continuous strictly increasing function $g : [a, b] \rightarrow [0, 1]$, with $g(a) = 0$ and $g(b) = 1$, such that

$$A(x, y) = g^{-1}[g(x)g(y)] \quad (x, y \in [a, b]). \quad (14)$$

To see this, it suffices to set $g(x) := \exp(-f(x))$.

For associative sequences $(A^{(n)} : [a, b]^n \rightarrow [a, b])_{n \geq 1}$, (14) becomes

$$A^{(n)}(x) = g^{-1}\left[\prod_{i=1}^n g(x_i)\right] \quad (x \in [a, b]^n, n \in \mathbb{N} \setminus \{0\}).$$

Of course, Theorem 4.2 can also be written in a dual form as follows.

Theorem 4.3 *Let $E = [a, b]$. $A : E^2 \rightarrow E$ is continuous, nondecreasing, associative, and*

$$\begin{aligned} A(a, x) &= x & (x \in E) \\ A(x, x) &> x & (x \in E^\circ) \end{aligned}$$

if and only if there exists a continuous strictly increasing function $f : E \rightarrow [0, +\infty]$, with $f(a) = 0$, such that

$$A(x, y) = f^{-1}[\min(f(x) + f(y), f(b))] \quad (x, y \in E). \quad (15)$$

Again, E can be any real interval, even infinite. Functions A of the form (15) are symmetric and disjunctive. There are no interior idempotents. The left endpoint a acts as an identity and the right endpoint b acts as a zero.

Once more, two mutually exclusive cases can be examined:

- $f(b) < +\infty$ if and only if A has zero divisors (i.e. $\exists x, y \in]a, b[$ such that $A(x, y) = b$). In this case, there exists a continuous strictly increasing function $g : [a, b] \rightarrow [0, 1]$, with $g(a) = 0$ and $g(b) = 1$, such that

$$A(x, y) = g^{-1}[\min(g(x) + g(y), 1)] \quad (x, y \in [a, b]). \quad (16)$$

To see this, it suffices to set $g(x) := f(x)/f(b)$.

For associative sequences $(A^{(n)} : [a, b]^n \rightarrow [a, b])_{n \geq 1}$, (16) becomes

$$A^{(n)}(x) = g^{-1}\left[\min\left(\sum_{i=1}^n g(x_i), 1\right)\right] \quad (x \in [a, b]^n, n \in \mathbb{N} \setminus \{0\}).$$

- $\lim_{t \rightarrow b^-} f(x) = +\infty$ if and only if A is strictly increasing on $]a, b[$. In this case, there exists a continuous strictly increasing function $g : [a, b] \rightarrow [0, 1]$, with $g(a) = 0$ and $g(b) = 1$, such that

$$A(x, y) = g^{-1}[1 - (1 - g(x))(1 - g(y))] \quad (x, y \in [a, b]), \quad (17)$$

To see this, it suffices to set $g(x) := 1 - \exp(-f(x))$.

For associative sequences $(A^{(n)} : [a, b]^n \rightarrow [a, b])_{n \geq 1}$, (17) becomes

$$A^{(n)}(x) = g^{-1}\left[1 - \prod_{i=1}^n (1 - g(x_i))\right] \quad (x \in [a, b]^n, n \in \mathbb{N} \setminus \{0\}).$$

Any semigroup fulfilling the assumptions of Theorem 4.2 or 4.3 is called *Archimedean*; see Ling [61]. In other words, any semigroup (E, A) is said to be *Archimedean* if A is continuous, nondecreasing, associative, one endpoint of E is an identity for A , and there are no idempotents for A in E° . We can make a distinction between conjunctive and disjunctive Archimedean semigroups depending on whether the identity is the right or left endpoint of E , respectively. An Archimedean semigroup is called *properly Archimedean* or *Aczélian* if every additive generator f is unbounded; otherwise it is *improperly Archimedean*.

Ling [61, §6] proved that every Archimedean semigroup is obtainable as a limit of Aczélian semigroups.

4.3 A class of nondecreasing and associative functions

We now give a description of the class of functions $A : [a, b]^2 \rightarrow [0, 1]$ that are continuous, nondecreasing, weakly idempotent, and associative. For all $\theta \in [a, b]$, we define $\mathcal{A}_{a,b,\theta}$ as the set of continuous, nondecreasing, weakly idempotent, and associative functions $A : [a, b]^2 \rightarrow [0, 1]$ such that $A(a, b) = A(b, a) = \theta$. The extreme cases $\mathcal{A}_{a,b,a}$ and $\mathcal{A}_{a,b,b}$ will play an important role in the sequel. The results proved by the author can be found in [66].

Theorem 4.4 *$A : [a, b]^2 \rightarrow [0, 1]$ is continuous, nondecreasing, weakly idempotent, and associative if and only if there exist $\alpha, \beta \in [a, b]$ and two functions $A_{a,\alpha\wedge\beta,\alpha\wedge\beta} \in \mathcal{A}_{a,\alpha\wedge\beta,\alpha\wedge\beta}$ and $A_{\alpha\vee\beta,b,\alpha\vee\beta} \in \mathcal{A}_{\alpha\vee\beta,b,\alpha\vee\beta}$ such that, for all $x, y \in [a, b]$,*

$$A(x, y) = \begin{cases} A_{a,\alpha\wedge\beta,\alpha\wedge\beta}(x, y), & \text{if } x, y \in [a, \alpha \wedge \beta] \\ A_{\alpha\vee\beta,b,\alpha\vee\beta}(x, y), & \text{if } x, y \in [\alpha \vee \beta, b] \\ (\alpha \wedge x) \vee (\beta \wedge y) \vee (x \wedge y), & \text{otherwise.} \end{cases}$$

Now, let us turn to the description of $\mathcal{A}_{a,b,a}$. Mostert and Shields [80, p. 130, Theorem B] proved the following

Theorem 4.5 *$A : [a, b]^2 \rightarrow [a, b]$ is continuous, associative, and is such that a acts as a zero and b as an identity if and only if*

- *either*

$$A(x, y) = \min(x, y) \quad (x, y \in [a, b]),$$

- *or there exists a continuous strictly decreasing function $f : [a, b] \rightarrow [0, +\infty]$, with $f(b) = 0$, such that*

$$A(x, y) = f^{-1}[\min(f(x) + f(y), f(a))] \quad (x, y \in [a, b]).$$

(conjunctive Archimedean semigroup)

- *or there exist a countable index set $K \subseteq \mathbb{N}$, a family of disjoint open subintervals $\{[a_k, b_k] \mid k \in K\}$ of $[a, b]$ and a family $\{f_k \mid k \in K\}$ of continuous strictly decreasing function $f_k : [a_k, b_k] \rightarrow [0, +\infty]$, with $f_k(b_k) = 0$, such that, for all $x, y \in [a, b]$,*

$$A(x, y) = \begin{cases} f_k^{-1}[\min(f_k(x) + f_k(y), f_k(a_k))], & \text{if } \exists k \in K \text{ such that } x, y \in [a_k, b_k] \\ \min(x, y), & \text{otherwise.} \end{cases}$$

(ordinal sum of conjunctive Archimedean semigroups and one-point semigroups).

One can show that $\mathcal{A}_{a,b,a}$ is the family of continuous, nondecreasing, and associative functions $A : [a, b]^2 \rightarrow [a, b]$ such that a acts as a zero and b as an identity. Consequently, the description of the family $\mathcal{A}_{a,b,a}$ is also given by Theorem 4.5. Moreover, it turns out that all functions fulfilling the assumptions of this result are symmetric, nondecreasing, and conjunctive.

Theorem 4.5 can also be written in a dual form as follows:

Theorem 4.6 $A : [a, b]^2 \rightarrow [a, b]$ is continuous, associative, and is such that a acts as an identity and b as a zero if and only if

- either

$$A(x, y) = \max(x, y) \quad (x, y \in [a, b]),$$

- or there exists a continuous strictly increasing function $f : [a, b] \rightarrow [0, +\infty]$, with $f(a) = 0$, such that

$$A(x, y) = f^{-1}[\min(f(x) + f(y), f(b))] \quad (x, y \in [a, b]).$$

(disjunctive Archimedean semigroup)

- or there exist a countable index set $K \subseteq \mathbb{N}$, a family of disjoint open subintervals $\{]a_k, b_k[\mid k \in K\}$ of $[a, b]$ and a family $\{f_k \mid k \in K\}$ of continuous strictly increasing function $f_k : [a_k, b_k] \rightarrow [0, +\infty]$, with $f_k(a_k) = 0$, such that, for all $x, y \in [a, b]$,

$$A(x, y) = \begin{cases} f_k^{-1}[\min(f_k(x) + f_k(y), f_k(b_k))], & \text{if } \exists k \in K \text{ such that } x, y \in [a_k, b_k] \\ \max(x, y), & \text{otherwise.} \end{cases}$$

(ordinal sum of disjunctive Archimedean semigroups and one-point semigroups).

As above, we can see that $\mathcal{A}_{a,b}$ is the family of continuous, nondecreasing, and associative functions $A : [a, b]^2 \rightarrow [a, b]$ such that a acts as an identity and b as a zero. The description of the family $\mathcal{A}_{a,b}$ is thus given by Theorem 4.6. Moreover, all functions fulfilling the assumptions of this result are symmetric, nondecreasing, and disjunctive.

Theorems 4.4, 4.5, and 4.6, taken together, give a complete description of the family of continuous, nondecreasing, weakly idempotent, and associative functions $A : [a, b]^2 \rightarrow [a, b]$. Imposing some additional conditions leads to the following immediate corollaries:

Corollary 4.2 $A : [a, b]^2 \rightarrow [a, b]$ is continuous, strictly increasing, weakly idempotent, and associative if and only if there exists a continuous strictly increasing function $g : [a, b] \rightarrow [0, 1]$, with $g(a) = 0$ and $g(b) = 1$, such that

- either

$$A(x, y) = g^{-1}[g(x)g(y)] \quad (x, y \in [a, b]),$$

- or

$$A(x, y) = g^{-1}[g(x) + g(y) - g(x)g(y)] \quad (x, y \in [a, b]).$$

Corollary 4.3 $A : [a, b]^2 \rightarrow [a, b]$ is symmetric, continuous, nondecreasing, weakly idempotent, and associative if and only if there exist $\alpha \in [a, b]$ and two functions $A_{a,\alpha,\alpha} \in \mathcal{A}_{a,\alpha,\alpha}$ and $A_{\alpha,b,\alpha} \in \mathcal{A}_{\alpha,b,\alpha}$ such that, for all $x, y \in [a, b]$,

$$A(x, y) = \begin{cases} A_{a,\alpha,\alpha}(x, y), & \text{if } x, y \in [a, \alpha] \\ A_{\alpha,b,\alpha}(x, y), & \text{if } x, y \in [\alpha, b] \\ \alpha, & \text{otherwise.} \end{cases}$$

Corollary 4.4 $A : [a, b]^2 \rightarrow [a, b]$ is continuous, nondecreasing, weakly idempotent, associative, and has exactly one identity element in $[a, b]$ if and only if $A \in \mathcal{A}_{a,b,a} \cup \mathcal{A}_{a,b,b}$.

4.4 Internal associative functions

We now investigate the case of internal associative functions, that is, associative means. As these functions are idempotent, we actually investigate idempotent and associative functions. Although we have already observed that there are no continuous, strictly increasing, idempotent, and associative functions, the class of continuous, nondecreasing, idempotent, and associative functions is nonempty and its description can be deduced from Theorem 4.4. However, Fodor [42] had already obtained this description in a more general framework, as follows.

Theorem 4.7 Let E be a real interval, finite or infinite. $A : E^2 \rightarrow E$ is continuous, nondecreasing, idempotent, and associative if and only if there exist $\alpha, \beta \in E$ such that

$$A(x, y) = (\alpha \wedge x) \vee (\beta \wedge y) \vee (x \wedge y) \quad ((x, y) \in E^2).$$

Notice that, by distributivity of \wedge and \vee , A can be written also in the equivalent form:

$$A(x, y) = (\beta \vee x) \wedge (\alpha \vee y) \wedge (x \vee y) \quad ((x, y) \in E^2).$$

For sequences of associative functions, the statement can be formulated as follows.

Theorem 4.8 Let E be a real interval, finite or infinite. $(A^{(n)} : E^n \rightarrow E)_{n \geq 1}$ is an associative sequence of continuous, nondecreasing, and idempotent functions if and only if there exist $\alpha, \beta \in E$ such that

$$A^{(n)}(x) = (\alpha \wedge x_1) \vee \left(\bigvee_{i=2}^{n-1} (\alpha \wedge \beta \wedge x_i) \right) \vee (\beta \wedge x_n) \vee \left(\bigwedge_{i=1}^n x_i \right) \quad (x \in E^n, n \in \mathbb{N} \setminus \{0\}).$$

Before Fodor [42], the description of symmetric functions was obtained by Fung and Fu [45] and in a revisited way by Dubois and Prade [31]. Now, the result can be formulated as follows.

Theorem 4.9 Let E be a real interval, finite or infinite.

i) $A : E^2 \rightarrow E$ is symmetric, continuous, nondecreasing, idempotent, and associative if and only if there exists $\alpha \in E$ such that

$$A(x, y) = \text{median}(x, y, \alpha) \quad (x, y \in E).$$

ii) $(A^{(n)} : E^n \rightarrow E)_{n \geq 1}$ is an associative sequence of symmetric, continuous, nondecreasing, and associative functions if and only if there exists $\alpha \in E$ such that

$$A^{(n)}(x) = \text{median}\left(\bigwedge_{i=1}^n x_i, \bigvee_{i=1}^n x_i, \alpha\right) \quad (x \in E^n, n \in \mathbb{N} \setminus \{0\}). \quad (18)$$

The previous three theorems show that the idempotency property is seldom consistent with associativity. For instance, the associative mean (18) is not very decisive since it leads to the predefined value α as soon as there exist $x_i \leq \alpha$ and $x_j \geq \alpha$.

Czogala and Drewniak [23] have examined the case when A has an identity element $e \in E$, as follows.

Theorem 4.10 *Let E be a real interval, finite or infinite.*

i) *If $A : E^2 \rightarrow E$ is nondecreasing, idempotent, associative, and has an identity element $e \in E$, then there exists a decreasing function $g : E \rightarrow E$, with $g(e) = e$, such that, for all $x, y \in E$,*

$$A(x, y) = \begin{cases} x \wedge y, & \text{if } y < g(x), \\ x \vee y, & \text{if } y > g(x), \\ x \wedge y \text{ or } x \vee y, & \text{if } y = g(x). \end{cases}$$

ii) *If $A : E^2 \rightarrow E$ is continuous, nondecreasing, idempotent, associative, and has an identity element $e \in E$, then $A = \min$ or \max .*

4.5 t-norms, t-conorms, and uninorms

In fuzzy set theory, one of the main topics consists in defining fuzzy logical connectives which are appropriate extensions of logical connectives **AND**, **OR**, and **NOT** in the case when the valuation set is the unit interval $[0, 1]$ rather than $\{0, 1\}$.

Fuzzy connectives modelling **AND** and **OR** are called *triangular norms* (t-norms for short) and *triangular conorms* (t-conorms) respectively; see Alsina et al. [11] and Schweizer and Sklar [100].

Definition 4.2 i) *A t-norm is a symmetric, nondecreasing, and associative function $T : [0, 1]^2 \rightarrow [0, 1]$ having 1 as identity.*

ii) *A t-conorm is a symmetric, nondecreasing, and associative function $S : [0, 1]^2 \rightarrow [0, 1]$ having 0 as identity.*

The investigation of these functions has been made by Schweizer and Sklar [98, 99] and Ling [61]. There is now an abundant literature on this topic; see the book by Klement et al. [59].

Of course, the family of continuous t-norms is nothing else than the class $\mathcal{A}_{0,1,0}$, and the family of continuous t-conorms is the class $\mathcal{A}_{0,1,1}$. Both families have been fully described in this section. Moreover, Corollary 4.4 gives a characterization of their union.

Corollary 4.5 *$A : [0, 1]^2 \rightarrow [0, 1]$ is continuous, nondecreasing, weakly idempotent, associative, and has exactly one identity in $[0, 1]$ if and only if A is a continuous t-norm or a continuous t-conorm.*

It is well known that t-norms and t-conorms are extensively used in fuzzy set theory, especially in modeling fuzzy connectives and implications (see Weber [106]). Applications to practical problems require the use of, in a sense, the most appropriate t-norms or t-conorms. On this issue, Fodor [40] presented a method to construct new t-norms from t-norms.

It is worth noting that some properties of t-norms, such as associativity, do not play any essential role in preference modeling and choice theory. Recently, some authors [10, 37, 111] have investigated non-associative binary operation on $[0, 1]$ in different contexts. These operators can be viewed as a generalization of t-norms and t-conorms in the sense that both are contained in this kind of operations. Moreover, Fodor [41] defined and investigated the concept of weak t-norms. His results were usefully applied to the framework of fuzzy strict preference relations.

Further associative functions were recently introduced, namely *t-operators* [73] and *uninorms* [109] (see also [74, 75]), which proved to be useful in expert systems, neural networks, and fuzzy quantifiers theory.

Definition 4.3 *i) A t-operator is a symmetric, nondecreasing, associative function $F : [0, 1]^2 \rightarrow [0, 1]$, with 0 and 1 as idempotent elements, and such that the sections $x \mapsto F(x, 0)$ and $x \mapsto F(x, 1)$ are continuous on $[0, 1]$.*

ii) A uninorm is a symmetric, nondecreasing, and associative function $U : [0, 1]^2 \rightarrow [0, 1]$ having an identity.

It is clear that a uninorm becomes a t-norm (resp. a t-conorm) when the identity is 1 (resp. 0).

We will not linger on this topic of t-norms, t-conorms, and uninorms. The interested reader can consult the book by Klement et al. [59]. For more recent results, we also recommend an article on associative functions by Sander [95].

5 Nonadditive integrals

Many aggregation functions can be seen as nonadditive discrete integrals with respect to nonadditive measures. In this section we introduce Choquet and Sugeno integrals. The reader can find more details on this topic in Chapter 18 of this volume.

5.1 Motivations

A significant aspect of aggregation in multicriteria decision making is the difference in the importance of criteria or attributes, usually modeled by using different weights. Since these weights must be taken into account during the aggregation phase, it is necessary to use weighted functions, therefore giving up the symmetry property. Until recently, the most often used weighted aggregation functions were averaging functions, such as the quasi-linear means (4).

However, the weighted arithmetic means and, more generally, the quasi-linear means present some drawbacks. None of these functions are able to model in an

understandable way an interaction among attributes. Indeed, it is well known in multiattribute utility theory (MAUT) that these functions lead to *mutual preferential independence* among the attributes (see for instance Fishburn and Wakker [39]), which expresses in some sense the independence of the attributes. Since these functions are not appropriate when interactive attributes are considered, people usually tend to construct independent attributes, or attributes that are supposed to be so, causing some bias effect in evaluation.

In order to have a flexible representation of complex interaction phenomena among attributes or criteria (e.g. positive or negative synergy among some criteria), it is useful to substitute the weight vector for a nonadditive set function allowing the definition of a weight not only on each criterion, but also on each subset of criteria.

For this purpose, the use of fuzzy measures have been proposed by Sugeno in 1974 [103] to generalize additive measures. It seems widely accepted that additivity is not suitable as a required property of set functions in many real situations, due to the lack of additivity in many facets of human reasoning. To be able to express human subjectivity, Sugeno proposed replacing the additivity property with a weaker one: monotonicity. These non-additive monotonic measures are referred to as fuzzy measures.

We consider a discrete set of n elements $N = \{1, \dots, n\}$. Depending on the application, these elements could be players of a cooperative game, criteria in a multicriteria decision problem, attributes, experts or voters in an opinion pooling problem, etc. To emphasize that N has n elements, we will often write N_n .

Definition 5.1 *A (discrete) fuzzy measure on N is a set function $\mu : 2^N \rightarrow [0, 1]$ that is monotonic, that is $\mu(S) \leq \mu(T)$ whenever $S \subseteq T$, and fulfills the boundary conditions $\mu(\emptyset) = 0$ and $\mu(N) = 1$.*

For any $S \subseteq N$, the coefficient $\mu(S)$ can be viewed as the weight, or importance, or strength of the combination S for the particular decision problem under consideration. Thus, in addition to the usual weights on criteria taken separately, weights on any combination of criteria are also defined. Monotonicity then means that adding a new element to a combination cannot decrease its importance. We denote the set of fuzzy measures on N as \mathcal{F}_N .

When a fuzzy measure is available on N , it is interesting to have tools capable of summarizing all the values of a function to a single point, in terms of the underlying fuzzy measure. These tools are the *fuzzy integrals*, a concept proposed by Sugeno [103, 104].

Fuzzy integrals are integrals of a real function with respect to a fuzzy measure, by analogy with Lebesgue integral which is defined with respect to an ordinary (i.e., additive) measure. As the integral of a function in a sense represents its average value, a fuzzy integral can be viewed as a particular case of averaging aggregation function.

Contrary to the weighted arithmetic means, fuzzy integrals are able to represent a certain kind of interaction among criteria, ranging from redundancy (negative interaction) to synergy (positive interaction). For this reason they have been thoroughly studied in the context of multicriteria decision problems [48, 50, 51, 53].

There are several classes of fuzzy integrals, among which the most representative are the Choquet and Sugeno integrals. In this section we discuss these two integrals as aggregation functions. In particular, we present axiomatic characterizations for these integrals. The main difference between them is that the former is suitable for the aggregation on interval scales, while the latter is designed for aggregating values on ordinal scales.

5.2 The Choquet integral

The concept of Choquet integral was proposed in capacity theory [21]. Since then, it was used in various contexts such as nonadditive utility theory [46, 96, 97, 105], theory of fuzzy measures and integrals [25, 57, 81, 82] (see also the excellent edited book [53]), but also finance [28] and game theory [29].

Since this integral is viewed here as an n -variable aggregation function, we will adopt a function-like notation instead of the usual integral form, and the integrand will be a set of n real values, denoted $x = (x_1, \dots, x_n) \in \mathbb{R}^n$.

Definition 5.2 *Let $\mu \in \mathcal{F}_N$. The (discrete) Choquet integral of $x \in \mathbb{R}^n$ with respect to μ is defined by*

$$\mathcal{C}_\mu(x) := \sum_{i=1}^n x_{(i)} [\mu(A_{(i)}) - \mu(A_{(i+1)})],$$

where (\cdot) is a permutation on N such that $x_{(1)} \leq \dots \leq x_{(n)}$. Also, $A_{(i)} = \{(i), \dots, (n)\}$, and $A_{(n+1)} = \emptyset$.

For instance, if $x_3 \leq x_1 \leq x_2$, we have

$$\mathcal{C}_\mu(x_1, x_2, x_3) = x_3 [\mu(\{3, 1, 2\}) - \mu(\{1, 2\})] + x_1 [\mu(\{1, 2\}) - \mu(\{2\})] + x_2 \mu(\{2\}).$$

Thus, the Choquet integral is a linear expression, up to a reordering of the arguments. It is closely related to the Lebesgue integral, since both coincide when the measure is additive:

$$\mathcal{C}_\mu(x) = \sum_{i=1}^n \mu(i) x_i \quad (x \in \mathbb{R}^n).$$

In this sense, the Choquet integral is a generalization of the Lebesgue integral.

Let us now turn to axiomatizations of the Choquet integral. First of all, as we can see, this aggregation function fulfills a number of natural properties. It is continuous, nondecreasing, unanimously increasing, idempotent, internal, and meaningful for the same input-output interval scales; see for instance Grabisch [50]. It also fulfills the *comonotonic additivity* property [27, 97], that is,

$$f(x_1 + x'_1, \dots, x_n + x'_n) = f(x_1, \dots, x_n) + f(x'_1, \dots, x'_n)$$

for all *comonotonic* vectors $x, x' \in \mathbb{R}^n$. Two vectors $x, x' \in \mathbb{R}^n$ are comonotonic if there exists a permutation σ on N so that

$$x_{\sigma(1)} \leq \dots \leq x_{\sigma(n)} \quad \text{and} \quad x'_{\sigma(1)} \leq \dots \leq x'_{\sigma(n)}.$$

An interpretation of this property in multicriteria decision making can be found in Modave et al. [78, 79].

The following result [70, Proposition 4.1] gives a characterization of the 2-variable Choquet integral in a very natural way.

Proposition 5.1 *$f : \mathbb{R}^2 \rightarrow \mathbb{R}$ is nondecreasing and meaningful for the same input-output interval scales if and only if there exists $\mu \in \mathcal{F}_2$ such that $f = \mathcal{C}_\mu$.*

The class of n -variable Choquet integrals has been first characterized by Schmeidler [97] by using monotonic additivity; see also [24], [25], [47], and [54, Theorem 8.6]. Note that this result was stated and proved in the continuous case (infinite) instead of the discrete case.

Theorem 5.1 *$f : \mathbb{R}^n \rightarrow \mathbb{R}$ is nondecreasing, comonotonic additive, and fulfills $f(\mathbf{1}_N) = 1$ if and only if there exists $\mu \in \mathcal{F}_N$ such that $f = \mathcal{C}_\mu$.*

Since the Choquet integral is defined from a fuzzy measure, it is sometimes useful to consider, for a given set N , the family of Choquet integrals on N as a set of functions

$$\{f_\mu : \mathbb{R}^n \rightarrow \mathbb{R} \mid \mu \in \mathcal{F}_N\}$$

or, equivalently, as a function $f : \mathbb{R}^n \times \mathcal{F}_N \rightarrow \mathbb{R}$.

Let us mention a first characterization of the family of Choquet integrals on N ; see Groes et al. [56]. For any $S \subseteq N$, $S \neq \emptyset$, denote by μ_S the fuzzy measure on N defined by $\mu_S(T) = 1$ if $T \supseteq S$ and 0 otherwise.

Theorem 5.2 *The class of functions $\{f_\mu : \mathbb{R}^n \rightarrow \mathbb{R} \mid \mu \in \mathcal{F}_N\}$ fulfills the following properties:*

- for any $\mu, \nu \in \mathcal{F}_N$ and any $\lambda \in \mathbb{R}$ such that $\lambda\mu + (1 - \lambda)\nu \in \mathcal{F}_N$, we have

$$f_{\lambda\mu + (1-\lambda)\nu} = \lambda f_\mu + (1 - \lambda)f_\nu,$$

- for any $S \subseteq N$, we have $f_{\mu_S} = \min_S$,

if and only if $f_\mu = \mathcal{C}_\mu$ for all $\mu \in \mathcal{F}_N$.

A second characterization obtained by the author [63, 64], can be stated as follows.

Theorem 5.3 *The class of functions $\{f_\mu : \mathbb{R}^n \rightarrow \mathbb{R} \mid \mu \in \mathcal{F}_N\}$ fulfills the following properties:*

- any function f_μ is a linear expression of μ , that is, there exist 2^n functions $g_T : \mathbb{R}^n \rightarrow \mathbb{R}$ ($T \subseteq N$) such that $f_\mu = \sum_{T \subseteq N} g_T \mu(T)$ for all $\mu \in \mathcal{F}_N$,
- for any $\mu \in \mathcal{F}_N$ and any $S \subseteq N$, we have $f_\mu(\mathbf{1}_S) = \mu(S)$,

- for any $\mu \in \mathcal{F}_N$, the function f_μ is nondecreasing and meaningful for the same input-output interval scales,

if and only if $f_\mu = \mathcal{C}_\mu$ for all $\mu \in \mathcal{F}_N$.

These two characterizations are natural and similar to each other. The linearity condition proposed in the second characterization is useful if we want to keep the aggregation model as simple as possible. Technically, this condition is equivalent to the superposition condition, that is,

$$f_{\lambda_1\mu + \lambda_2\nu} = \lambda_1 f_\mu + \lambda_2 f_\nu$$

for all $\mu, \nu \in \mathcal{F}_N$ and all $\lambda_1, \lambda_2 \in \mathbb{R}$ such that $\lambda_1\mu + \lambda_2\nu \in \mathcal{F}_N$. Of course, linearity implies the first condition of the first characterization. Moreover, under this linearity condition, the other conditions are equivalent. In fact, in the proof of the second characterization [63, 64], the author replaced the condition $f_{\mu_S} = \min_S$ with the three conditions: $f_\mu(\mathbf{1}_S) = \mu(S)$, nondecreasing monotonicity, and meaningfulness for the same input-output interval scales of f_μ .

We also have the following three results [63, §4.2.3]:

Proposition 5.2 *The Choquet integral $\mathcal{C}_\mu : \mathbb{R}^n \rightarrow \mathbb{R}$ is bisymmetric if and only if*

$$\mathcal{C}_\mu \in \{\min_S, \max_S \mid S \subseteq N\} \cup \{\text{WAM}_\omega \mid \omega \in [0, 1]^n\}.$$

Proposition 5.3 *The sequence of Choquet integrals $\mathcal{C} := (\mathcal{C}_{\mu^{(n)}}^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is bisymmetric if and only if*

- either, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $S \subseteq N_n$ such that $\mathcal{C}_{\mu^{(n)}}^{(n)} = \min_S$,
- or, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $S \subseteq N_n$ such that $\mathcal{C}_{\mu^{(n)}}^{(n)} = \max_S$,
- or, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $\omega \in [0, 1]^n$ such that $\mathcal{C}_{\mu^{(n)}}^{(n)} = \text{WAM}_\omega$.

Proposition 5.4 *The sequence of Choquet integrals $\mathcal{C} := (\mathcal{C}_{\mu^{(n)}}^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is decomposable if and only if*

- either $\mathcal{C} = (\min^{(n)})_{n \geq 1}$,
- or $\mathcal{C} = (\max^{(n)})_{n \geq 1}$,
- or there exists $\theta \in [0, 1]$ such that, for any $n \in \mathbb{N} \setminus \{0\}$, we have $\mathcal{C}_{\mu^{(n)}}^{(n)} = \text{WAM}_\omega$, with

$$\omega_i = \frac{(1 - \theta)^{n-i} \theta^{i-1}}{\sum_{j=1}^n (1 - \theta)^{n-j} \theta^{j-1}} \quad (i \in N_n).$$

Proposition 5.5 *The sequence of Choquet integrals $\mathcal{C} := (\mathcal{C}_{\mu^{(n)}}^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is associative if and only if*

$$\mathcal{C} = (\min^{(n)})_{n \geq 1} \text{ or } (\max^{(n)})_{n \geq 1} \text{ or } (P_1^{(n)})_{n \geq 1} \text{ or } (P_n^{(n)})_{n \geq 1}.$$

Let us now consider certain special cases of the Choquet integral, namely the weighted arithmetic means (WAM) and the ordered weighted averaging functions (OWA).

The *weighted arithmetic mean* WAM_ω is a Choquet integral defined from an additive measure. It fulfills the classical *additivity* property:

$$f(x_1 + x'_1, \dots, x_n + x'_n) = f(x_1, \dots, x_n) + f(x'_1, \dots, x'_n)$$

for all vectors $x, x' \in \mathbb{R}^n$. More exactly, we have the following results (see Marichal [63, §4.2.4] and Murofushi and Sugeno [83]).

Proposition 5.6 *The Choquet integral $\mathcal{C}_\mu : \mathbb{R}^n \rightarrow \mathbb{R}$ is additive if and only if there exists $\omega \in [0, 1]^n$ such that $\mathcal{C}_\mu = \text{WAM}_\omega$.*

Proposition 5.7 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is nondecreasing, meaningful for the same input-output interval scales, and additive if and only if there exists $\omega \in [0, 1]^n$ such that $A = \text{WAM}_\omega$.*

The *ordered weighted averaging functions* OWA_ω were proposed in 1988 by Yager [108]. Since their introduction, these aggregation functions have been applied to many fields as neural networks, data base systems, fuzzy logic controllers, and group decision making. An overview on these functions can be found in the book edited by Yager and Kacprzyk [107]; see also Grabisch et al. [53].

The following result, ascribed to Grabisch [49] (see [68] for a concise proof), shows that the OWA function is nothing other than a Choquet integral with respect to a *cardinality-based* fuzzy measure i.e. a fuzzy measure depending only on the cardinalities of the subsets.

Proposition 5.8 *Let $\mu \in \mathcal{F}_N$. The following assertions are equivalent:*

- i) *For any $S, S' \subseteq N$ such that $|S| = |S'|$, we have $\mu(S) = \mu(S')$.*
- ii) *There exists a weight vector ω such that $\mathcal{C}_\mu = \text{OWA}_\omega$.*
- iii) *\mathcal{C}_μ is a symmetric function.*

The fuzzy measure μ associated to an OWA_ω is given by

$$\mu(S) = \sum_{i=n-s+1}^n \omega_i \quad (S \subseteq N, S \neq \emptyset).$$

Conversely, the weights associated to OWA_ω are given by

$$\omega_{n-s} = \mu(S \cup i) - \mu(S) \quad (i \in N, S \subseteq N \setminus i).$$

The class of OWA functions includes an important subfamily, namely the order statistics

$$\text{OS}_k(x) = x_{(k)},$$

when $\omega_k = 1$ for some $k \in N$. In this case, we have, for any $S \subseteq N$,

$$\mu(S) = \begin{cases} 1, & \text{if } s \geq n - k + 1, \\ 0, & \text{otherwise.} \end{cases}$$

This subfamily itself contains the minimum, the maximum, and the median.

Axiomatizations of the class of OWA functions can be immediately derived from those of the Choquet integral and from Proposition 5.8.

5.3 The Sugeno integral

The Sugeno integral [103, 104] was introduced as a fuzzy integral, that is, an integral defined from a fuzzy measure. This integral has then been thoroughly investigated and used in many domains (an overview can be found in Dubois et al. [30] and the volume edited by Grabisch et al. [53]).

As for the Choquet integral, we give here the definition of the Sugeno integral in its discrete (finite) version, which is nothing other than an aggregation function from $[0, 1]^n$ into $[0, 1]$.

Definition 5.3 *Let $\mu \in \mathcal{F}_N$. The (discrete) Sugeno integral of $x \in [0, 1]^n$ with respect to μ is defined by*

$$\mathcal{S}_\mu(x) := \bigvee_{i=1}^n [x_{(i)} \wedge \mu(A_{(i)})],$$

where (\cdot) is a permutation on N such that $x_{(1)} \leq \dots \leq x_{(n)}$. Also, $A_{(i)} = \{(i), \dots, (n)\}$, and $A_{(n+1)} = \emptyset$.

Exactly as in the definition of the Choquet integral, the “coefficient” associated with each variable x_i is fixed uniquely by the permutation (\cdot) . For instance, if $x_3 \leq x_1 \leq x_2$, then we have

$$\mathcal{S}_\mu(x_1, x_2, x_3) = [x_3 \wedge \mu(\{3, 1, 2\})] \vee [x_1 \wedge \mu(\{1, 2\})] \vee [x_2 \wedge \mu(\{2\})].$$

From the definition, we can immediately deduce that

$$\mathcal{S}_\mu(x) \in \{x_1, \dots, x_n\} \cup \{\mu(S) \mid S \subseteq N\} \quad (x \in [0, 1]^n).$$

Moreover, similarly to the Choquet integral, we have

$$\mathcal{S}_\mu(\mathbf{1}_S) = \mu(S) \quad (S \subseteq N),$$

which shows that the Sugeno integral is completely determined par its values at the vertices of the hypercube $[0, 1]^n$.

It was proved [55, 65, 103] that the Sugeno integral can also be set in the following form, which does not require the reordering of the variables:

$$\mathcal{S}_\mu(x) = \bigvee_{T \subseteq N} \left[\mu(T) \wedge \left(\bigwedge_{i \in T} x_i \right) \right] \quad (x \in [0, 1]^n).$$

It was also proved [58] that the Sugeno integral is a kind of weighted median:

$$\mathcal{S}_\mu(x) = \text{median}[x_1, \dots, x_n, \mu(A_{(2)}), \mu(A_{(3)}), \dots, \mu(A_{(n)})] \quad (x \in [0, 1]^n).$$

For instance, if $x_3 \leq x_1 \leq x_2$, then

$$\mathcal{S}_\mu(x_1, x_2, x_3) = \text{median}[x_1, x_2, x_3, \mu(1, 2), \mu(2)].$$

The following result [67] shows that the Sugeno integral is a rather natural concept and, contrary to the Choquet integral, it is suitable for an aggregation in an ordinal context.

Proposition 5.9 *Any weakly idempotent function $A : [0, 1]^n \rightarrow [0, 1]$, whose (well-formed) expression is made up of variables x_1, \dots, x_n , constants $r_1, \dots, r_m \in [0, 1]$, lattice operations $\wedge = \min$ et $\vee = \max$, and parentheses is a Sugeno integral (and conversely).*

Let us now turn to axiomatizations of the Sugeno integral. We can easily see that the Sugeno integral is a continuous, nondecreasing, unanimously increasing, idempotent, and internal function. It also fulfills the *comonotonic minitivity* and *comonotonic maxitivity* properties [25], that is

$$\begin{aligned} f(x_1 \wedge x'_1, \dots, x_n \wedge x'_n) &= f(x_1, \dots, x_n) \wedge f(x'_1, \dots, x'_n) \\ f(x_1 \vee x'_1, \dots, x_n \vee x'_n) &= f(x_1, \dots, x_n) \vee f(x'_1, \dots, x'_n) \end{aligned}$$

for all comonotonic vectors $x, x' \in [0, 1]^n$. More specifically, it is *weakly minitive* and *weakly maxitive*, that is, it fulfills

$$\begin{aligned} f(x_1 \wedge r, \dots, x_n \wedge r) &= f(x_1, \dots, x_n) \wedge r \\ f(x_1 \vee r, \dots, x_n \vee r) &= f(x_1, \dots, x_n) \vee r \end{aligned}$$

for all vectors $x \in [0, 1]^n$ and all $r \in [0, 1]$. Even more specifically, by replacing x with the Boolean vector $\mathbf{1}_S$ in these two equations above, one see that it is also *non-compensative*, that is, it fulfills

$$f(r\mathbf{1}_S) \in \{f(\mathbf{1}_S), r\} \quad \text{and} \quad f(\mathbf{1}_S + r\mathbf{1}_{N \setminus S}) \in \{f(\mathbf{1}_S), r\}$$

for all $S \subseteq N$ and all $r \in [0, 1]$.

Comonotonic minitivity and maxitivity have been interpreted in the context of aggregation of fuzzy subsets by Ralescu and Ralescu [89]. Non-compensation has been interpreted in decision making under uncertainty in Dubois et al. [30].

The main axiomatizations of the Sugeno integral as an aggregation function are summarized in the following result; see Marichal [63, 65]:

Theorem 5.4 *Let $A : [0, 1]^n \rightarrow [0, 1]$. The following assertions are equivalent:*

- *A is nondecreasing, idempotent, and non-compensative,*
- *A is nondecreasing, weakly minitive and weakly maxitive,*
- *A is nondecreasing, idempotent, comonotonic minitive and maxitive,*
- *There exists $\mu \in \mathcal{F}_N$ such that $A = \mathcal{S}_\mu$.*

The 2-variable Sugeno integral can be characterized in a very natural way by means of the associativity property. Indeed, Theorem 4.7 can be rewritten as follows.

Proposition 5.10 *$A : [0, 1]^2 \rightarrow [0, 1]$ is continuous, nondecreasing, idempotent, and associative if and only if there exists $\mu \in \mathcal{F}_2$ such that $A = \mathcal{S}_\mu$.*

Considering associative or decomposable sequences, we have the following result; see Marichal [63, p. 113].

Proposition 5.11 *Let $A := (A^{(n)} : [0, 1]^n \rightarrow [0, 1])_{n \geq 1}$ be a sequence of functions. Then the following assertions are equivalent:*

- *A is an associative sequence of Sugeno integrals.*
- *A is a decomposable sequence of Sugeno integrals.*
- *A is an associative sequence of continuous, nondecreasing, and idempotent functions.*
- *There exist $\alpha, \beta \in [0, 1]$ such that*

$$A^{(n)}(x) = (\alpha \wedge x_1) \vee \left(\bigvee_{i=2}^{n-1} (\alpha \wedge \beta \wedge x_i) \right) \vee (\beta \wedge x_n) \vee \left(\bigwedge_{i=1}^n x_i \right) \quad (x \in [0, 1]^n, n \in \mathbb{N} \setminus \{0\}).$$

Just as the Choquet integral includes two main subclasses, namely the weighted arithmetic means and the ordered weighted averaging functions, the Sugeno integral includes the weighted minimum and maximum and the ordered weighted minimum and maximum. These functions have been introduced and investigated in Dubois and Prade [33] and Dubois et al. [34], respectively.

For any vector $\omega = (\omega_1, \dots, \omega_n) \in [0, 1]^n$ such that $\bigvee_{i=1}^n \omega_i = 1$, the *weighted maximum* associated with ω is defined by

$$\text{pmax}_{\omega}(x) = \bigvee_{i=1}^n (\omega_i \wedge x_i) \quad (x \in [0, 1]^n).$$

For any vector $\omega = (\omega_1, \dots, \omega_n) \in [0, 1]^n$ such that $\bigwedge_{i=1}^n \omega_i = 0$, the *weighted minimum* associated with ω is defined by

$$\text{pmin}_{\omega}(x) = \bigwedge_{i=1}^n (\omega_i \vee x_i) \quad (x \in [0, 1]^n).$$

The functions pmax_{ω} and pmin_{ω} can be characterized as follows; see [33, 63, 90]:

Proposition 5.12 *Let $\mu \in \mathcal{F}_N$. The following assertions are equivalent:*

- *μ is a possibility measure, that is such that*

$$\mu(S \cup T) = \mu(S) \vee \mu(T) \quad (S, T \subseteq N).$$

- *There exists $\omega \in [0, 1]^n$ such that $\mathcal{S}_{\mu} = \text{pmax}_{\omega}$.*
- *$\mathcal{S}_{\mu}(x_1 \vee x'_1, \dots, x_n \vee x'_n) = \mathcal{S}_{\mu}(x_1, \dots, x_n) \vee \mathcal{S}_{\mu}(x'_1, \dots, x'_n) \quad (x, x' \in [0, 1]^n).$*

Proposition 5.13 *Let $\mu \in \mathcal{F}_N$. The following assertions are equivalent:*

- μ is a necessity measure, that is such that

$$\mu(S \cap T) = \mu(S) \wedge \mu(T) \quad (S, T \subseteq N).$$

- There exists $\omega \in [0, 1]^n$ such that $\mathcal{S}_\mu = \text{pmin}_\omega$.
- $\mathcal{S}_\mu(x_1 \wedge x'_1, \dots, x_n \wedge x'_n) = \mathcal{S}_\mu(x_1, \dots, x_n) \wedge \mathcal{S}_\mu(x'_1, \dots, x'_n) \quad (x, x' \in [0, 1]^n).$

For any vector $\omega = (\omega_1, \dots, \omega_n) \in [0, 1]^n$ such that $\bigvee_{i=1}^n \omega_i = 1$, the *ordered weighted maximum* associated with ω is defined by

$$\text{opmax}_\omega(x) = \bigvee_{i=1}^n (\omega_i \wedge x_{(i)}) \quad (x \in [0, 1]^n).$$

For any vector $\omega = (\omega_1, \dots, \omega_n) \in [0, 1]^n$ such that $\bigwedge_{i=1}^n \omega_i = 0$, the *ordered weighted minimum* associated with ω is defined by

$$\text{opmin}_\omega(x) = \bigwedge_{i=1}^n (\omega_i \vee x_{(i)}) \quad (x \in [0, 1]^n).$$

Surprisingly enough, the class of ordered weighted minima coincides with that of ordered weighted maxima and identifies with the symmetric Sugeno integrals. The result can be stated as follows; see [49, 63].

Proposition 5.14 *Let $\mu \in \mathcal{F}_N$. The following assertions are equivalent:*

- μ depends only of the cardinalities of the subsets.
- There exists $\omega \in [0, 1]^n$ such that $\mathcal{S}_\mu = \text{opmax}_\omega$.
- There exists $\omega \in [0, 1]^n$ such that $\mathcal{S}_\mu = \text{opmin}_\omega$.
- \mathcal{S}_μ is a symmetric function.

Using the fact that the Sugeno integral is also a weighted median, we can write

$$\begin{aligned} \text{opmax}_\omega(x) &= \text{median}(x_1, \dots, x_n, \omega_2, \dots, \omega_n), \\ \text{opmin}_\omega(x) &= \text{median}(x_1, \dots, x_n, \omega_1, \dots, \omega_{n-1}). \end{aligned}$$

Another interesting subclass is that of lattice polynomials, which are nothing other than Sugeno integrals defined from fuzzy measures taking their values in $\{0, 1\}$. We will characterize these functions in the final section.

6 Aggregation on ratio and interval scales

In this section, we present the families of aggregation functions that are meaningful for ratio and interval scales (see Definition 2.7). First of all, we have the following two results concerning ratio scales; see [6, Chapter 20], [7, p. 439], and [9, case #2].

Theorem 6.1 $A :]0, \infty[^n \rightarrow]0, \infty[$ is meaningful for the same input-output ratio scales if and only if

$$A(x) = x_1 F\left(\frac{x_2}{x_1}, \dots, \frac{x_n}{x_1}\right) \quad (x \in]0, \infty[^n),$$

with $F :]0, \infty[^{n-1} \rightarrow]0, \infty[$ arbitrary ($F = \text{constant}$ if $n = 1$).

Theorem 6.2 $A :]0, \infty[^n \rightarrow]0, \infty[$ is meaningful for the same input ratio scales if and only if

$$A(x) = g(x_1) F\left(\frac{x_2}{x_1}, \dots, \frac{x_n}{x_1}\right) \quad (x \in]0, \infty[^n),$$

with $F :]0, \infty[^{n-1} \rightarrow]0, \infty[$ arbitrary ($F = \text{constant}$ if $n = 1$) and $g :]0, \infty[\rightarrow]0, \infty[$ such that $g(xy) = g(x)g(y)$ for all $x, y \in]0, \infty[$. $g(x) = x^c$ if A is continuous (c arbitrary).

We have the following results regarding interval scales; see [9, case #5] and [63, §3.4.1].

Theorem 6.3 $A : \mathbb{R}^n \rightarrow \mathbb{R}$ is meaningful for the same input-output interval scales if and only if

$$A(x) = \begin{cases} S(x) F\left(\frac{x_1 - \text{AM}(x)}{S(x)}, \dots, \frac{x_n - \text{AM}(x)}{S(x)}\right) + \text{AM}(x), & \text{if } S(x) \neq 0, \\ x_1, & \text{if } S(x) = 0, \end{cases}$$

where $S(x) = \sqrt{\sum_{i=1}^n (x_i - \text{AM}(x))^2}$ and $F : \mathbb{R}^n \rightarrow \mathbb{R}$ arbitrary ($A(x) = x$ if $n = 1$).

Theorem 6.4 $A : \mathbb{R}^n \rightarrow \mathbb{R}$ is meaningful for the same input interval scales if and only if

$$A(x) = \begin{cases} S(x) F\left(\frac{x_1 - \text{AM}(x)}{S(x)}, \dots, \frac{x_n - \text{AM}(x)}{S(x)}\right) + a \text{AM}(x) + b, & \text{if } S(x) \neq 0, \\ a x_1 + b, & \text{if } S(x) = 0, \end{cases}$$

or

$$A(x) = \begin{cases} g(S(x)) F\left(\frac{x_1 - \text{AM}(x)}{S(x)}, \dots, \frac{x_n - \text{AM}(x)}{S(x)}\right) + b, & \text{if } S(x) \neq 0, \\ b, & \text{if } S(x) = 0, \end{cases}$$

where $a, b \in \mathbb{R}$, $S(x) = \sqrt{\sum_{i=1}^n (x_i - \text{AM}(x))^2}$, $F : \mathbb{R}^n \rightarrow \mathbb{R}$ arbitrary ($A(x) = ax + b$ if $n = 1$), and $g : \mathbb{R} \rightarrow]0, \infty[$ such that $g(xy) = g(x)g(y)$ for all $x, y \in \mathbb{R}$.

The restriction of these families to nondecreasing functions and strictly increasing functions is discussed in Aczél et al. [7].

In the rest of this section, we present axiomatizations of some subfamilies of functions that are meaningful for the same input-output interval scales (these results are extracted from Marichal et al. [70]). For instance, we observed in Section 5.2 that the discrete Choquet integral fulfills this property. More generally, it is clear that any aggregation function obtained by composition of an arbitrary number of discrete Choquet integrals is again meaningful for the same input-output interval scales. These functions, called *composed Choquet integrals*, have been investigated for instance in Narukawa and Murofushi [85].

If we confine ourselves to bisymmetric functions, we have the following results.

Proposition 6.1 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is nondecreasing, meaningful for the same input-output interval scales, and bisymmetric if and only if*

$$A \in \{\min_S, \max_S \mid S \subseteq N\} \cup \{\text{WAM}_\omega \mid \omega \in [0, 1]^n\}.$$

Corollary 6.1 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is symmetric, nondecreasing, meaningful for the same input-output interval scales, and bisymmetric if and only if*

$$A \in \{\min, \max, \text{AM}\}.$$

Proposition 6.2 *$(A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is a bisymmetric sequence of nondecreasing and meaningful functions for the same input-output interval scales if and only if*

- *either, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $S \subseteq N_n$ such that $M^{(n)} = \min_S$,*
- *or, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $S \subseteq N_n$ such that $M^{(n)} = \max_S$,*
- *or, for any $n \in \mathbb{N} \setminus \{0\}$, there exists $\omega \in [0, 1]^n$ such that $M^{(n)} = \text{WAM}_\omega$.*

Corollary 6.2 *$A := (A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is a bisymmetric sequence of symmetric, nondecreasing, and meaningful functions for the same input-output interval scales if and only if*

$$A = (\min^{(n)})_{n \geq 1} \text{ or } (\max^{(n)})_{n \geq 1} \text{ or } (\text{AM}^{(n)})_{n \geq 1}.$$

Let us now consider the decomposable and associative sequences of aggregation functions. We have the following results.

Proposition 6.3 *$A := (A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is a decomposable sequence of nondecreasing and meaningful functions for the same input-output interval scales if and only if*

- *either $A = (\min^{(n)})_{n \geq 1}$,*
- *or $A = (\max^{(n)})_{n \geq 1}$,*

- or there exists $\theta \in [0, 1]$ such that, for any $n \in \mathbb{N} \setminus \{0\}$, we have $A^{(n)} = \text{WAM}_\omega$, with

$$\omega_i = \frac{(1 - \theta)^{n-i} \theta^{i-1}}{\sum_{j=1}^n (1 - \theta)^{n-j} \theta^{j-1}} \quad (i \in N_n).$$

Corollary 6.3 $A := (A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is a decomposable sequence of symmetric, nondecreasing, and meaningful functions for the same input-output interval scales if and only if

$$A = (\min^{(n)})_{n \geq 1} \text{ or } (\max^{(n)})_{n \geq 1} \text{ or } (\text{AM}^{(n)})_{n \geq 1}.$$

Proposition 6.4 $A := (A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is an associative sequence of nondecreasing and meaningful functions for the same input-output interval scales if and only if

$$A = (\min^{(n)})_{n \geq 1} \text{ or } (\max^{(n)})_{n \geq 1} \text{ or } (P_1^{(n)})_{n \geq 1} \text{ or } (P_n^{(n)})_{n \geq 1}.$$

Corollary 6.4 $A := (A^{(n)} : \mathbb{R}^n \rightarrow \mathbb{R})_{n \geq 1}$ is an associative sequence of symmetric, nondecreasing, and meaningful functions for the same input-output interval scales if and only if

$$A = (\min^{(n)})_{n \geq 1} \text{ or } (\max^{(n)})_{n \geq 1}.$$

7 Aggregation on ordinal scales

In this final section, we consider aggregation functions that are meaningful for the same input-output ordinal scales. Their description is not immediate and requires the concept of invariant sets. Denote the set of strictly increasing bijections of \mathbb{R} by Φ .

Definition 7.1 A nonempty subset $I \subseteq \mathbb{R}^n$ is said to be invariant if

$$x \in I \Rightarrow \phi(x) \in I \quad (\phi \in \Phi).$$

Such a set is said to be minimal if it does not contain any proper invariant subset.

The family \mathcal{I} of all invariant subsets of \mathbb{R}^n provides a partition of \mathbb{R}^n into equivalence classes, where $x, y \in \mathbb{R}^n$ are equivalent if there exists $\phi \in \Phi$ such that $y = \phi(x)$. In fact, one can show that any invariant subset is of the form

$$I = \{x \in \mathbb{R}^n \mid x_{\pi(1)} \triangleleft_1 \cdots \triangleleft_{n-1} x_{\pi(n)}\},$$

where $\pi \in \Pi_N$ and $\triangleleft_i \in \{<, \leq\}$ for $i = 1, \dots, n-1$.

The meaningful functions for the same input-output ordinal scales have been investigated by many authors [69, 72, 77, 88]. They can be described as follows [88].

Theorem 7.1 $A : \mathbb{R}^n \rightarrow \mathbb{R}$ is meaningful for the same input-output ordinal scales if and only if, for any $I \in \mathcal{I}$, there exists $i \in N$ such that $A|_I = P_i|_I$ is the i th projection.

The meaningful functions for the same input ordinal scales have also been widely studied [69, 71, 86, 87, 110]. They have been described as follows [71].

Theorem 7.2 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is meaningful for the same input ordinal scales if and only if, for any $I \in \mathcal{I}$, there exists $i_I \in N$ and a constant or strictly monotone function $g_I : P_{i_I}(I) \rightarrow \mathbb{R}$ such that*

$$A|_I = g_I \circ P_{i_I}|_I,$$

where, for any $I, J \in \mathcal{I}$, either $g_I = g_J$, or $\text{ran}(g_I) = \text{ran}(g_J)$ est un singleton, or $\text{ran}(g_I) < \text{ran}(g_J)$, or $\text{ran}(g_I) > \text{ran}(g_J)$.

We therefore see that the meaningful functions for the same input-output ordinal scales reduce to projections on each invariant subset. In addition, the meaningful functions for the same input ordinal scales reduce to constants or transformed projections on these invariant subsets.

The restriction of these functions to nondecreasing and/or continuous functions has also been studied. To describe these subfamilies, we need the concept of lattice polynomials.

Definition 7.2 *A lattice polynomial of n variables is a well-formed expression involving n variables x_1, \dots, x_n linked by the lattice operations $\wedge = \min$ and $\vee = \max$ in an arbitrary combination of parentheses.*

For instance, $L(x) = (x_1 \vee x_2) \wedge x_3$ is a 3-variable lattice polynomial.

One can show (see Birkhoff [17, Chapter 2, §5]) that any n -variable lattice polynomial can be written in disjunctive form as

$$L_\gamma(x) = \bigvee_{\substack{S \subseteq N \\ \gamma(S)=1}} \bigwedge_{i \in S} x_i \quad (x \in \mathbb{R}^n),$$

where $\gamma : 2^N \rightarrow \{0, 1\}$ is a binary fuzzy measure (i.e. with values in $\{0, 1\}$). We denote the family of these fuzzy measures on N by Γ_N .

It was also proved [67] that the class of lattice polynomials restricted to the domain $[0, 1]^n$ identifies with the intersection between the family of Choquet integrals on $[0, 1]^n$ and the family of Sugeno integrals.

Regarding nondecreasing functions, we have the following descriptions [69, 71].

Proposition 7.1 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is nondecreasing and meaningful for the same input-output ordinal scales if and only if there exists $\gamma \in \Gamma_N$ such that $A = L_\gamma$.*

Proposition 7.2 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is nondecreasing and meaningful for the same input ordinal scales if and only if there exists $\gamma \in \Gamma_N$ and a constant or strictly monotone function $g : \mathbb{R} \rightarrow \mathbb{R}$ such that $A = g \circ L_\gamma$.*

The functions in the above two theorems are continuous, up to discontinuities of function g .

Regarding continuous functions, we have the following results [69].

Corollary 7.1 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is continuous and meaningful for the same input-output ordinal scales if and only if there exists $\gamma \in \Gamma_N$ such that $A = L_\gamma$.*

Corollary 7.2 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is continuous and meaningful for the same input ordinal scales if and only if there exists $\gamma \in \Gamma_N$ and a constant or continuous and strictly monotone function $g : \mathbb{R} \rightarrow \mathbb{R}$ such that $A = g \circ L_\gamma$.*

Lattice polynomials are idempotent, but not necessarily symmetric. Actually, symmetric lattice polynomials are exactly the order statistics, which include the classical median. By adding symmetry and/or idempotency to the previous results, we obtain the following corollaries.

Corollary 7.3 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is symmetric, nondecreasing (or continuous), and meaningful for the same input-output ordinal scales if and only if there exists $k \in N$ such that $A = \text{OS}_k$.*

Corollary 7.4 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is idempotent, nondecreasing (or continuous), and meaningful for the same input ordinal scales if and only if there exists $\gamma \in \Gamma_N$ such that $A = L_\gamma$.*

Corollary 7.5 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is symmetric, nondecreasing, and meaningful for the same input ordinal scales if and only if there exist $k \in N$ and a constant or strictly increasing function $g : \mathbb{R} \rightarrow \mathbb{R}$ such that $A = g \circ \text{OS}_k$.*

Corollary 7.6 *$A : \mathbb{R}^n \rightarrow \mathbb{R}$ is symmetric, continuous, and meaningful for the same input ordinal scales if and only if there exists $k \in N$ and a constant or continuous and strictly monotonic function $g : \mathbb{R} \rightarrow \mathbb{R}$ such that $A = g \circ \text{OS}_k$.*

8 Conclusion

In this chapter we have discussed the most classical aggregation functions that are used in decision making. An appropriate classification of these functions into a catalog can be better done through an axiomatic approach, which consists in listing a series of reasonable properties and classifying or, better, characterizing the aggregation functions according to these properties.

With knowledge of the increasing need to define suitable aggregation functions fulfilling very precise conditions in various situations, it is not surprising that such a catalog of aggregation functions, which is already huge, is constantly growing and remains an important topic of research. We have only skimmed the surface of a still growing domain here.

References

- [1] M. Abramowitz and I. A. Stegun. *Handbook of mathematical functions with formulas, graphs, and mathematical tables*, volume 55 of *National Bureau of Standards Applied Mathematics Series*. For sale by the Superintendent of Documents, U.S. Government Printing Office, Washington, D.C., 1964.

- [2] J. Aczél. On mean values. *Bull. Amer. Math. Soc.*, 54:392–400, 1948.
- [3] J. Aczél. Sur les opérations définies pour nombres réels. *Bull. Soc. Math. France*, 76:59–64, 1948.
- [4] J. Aczél. *Lectures on functional equations and their applications*. Academic Press, New York, 1966.
- [5] J. Aczél and C. Alsina. Synthesizing judgements: a functional equations approach. *Math. Modelling*, 9(3-5):311–320, 1987. The analytic hierarchy process.
- [6] J. Aczél and J. Dhombres. *Functional equations in several variables*. Cambridge University Press, Cambridge, 1989. With applications to mathematics, information theory and to the natural and social sciences.
- [7] J. Aczél, D. Gronau, and J. Schwaiger. Increasing solutions of the homogeneity equation and of similar equations. *J. Math. Anal. Appl.*, 182(2):436–464, 1994.
- [8] J. Aczél and F. S. Roberts. On the possible merging functions. *Math. Social Sci.*, 17(3):205–243, 1989.
- [9] J. Aczél, F. S. Roberts, and Z. Rosenbaum. On scientific laws without dimensional constants. *J. Math. Anal. Appl.*, 119(1-2):389–416, 1986.
- [10] C. Alsina, G. Mayor, M. S. Tomás, and J. Torrens. A characterization of a class of aggregation functions. *Fuzzy Sets and Systems*, 53(1):33–38, 1993.
- [11] C. Alsina, E. Trillas, and L. Valverde. On some logical connectives for fuzzy sets theory. *J. Math. Anal. Appl.*, 93(1):15–26, 1983.
- [12] C. Antoine. *Les moyennes*, volume 3383 of *Que Sais-Je? [What Do I Know?]*. Presses Universitaires de France, Paris, 1998.
- [13] E. F. Beckenbach and R. Bellman. *Inequalities*. Second revised printing. Ergebnisse der Mathematik und ihrer Grenzgebiete. Neue Folge, Band 30. Springer-Verlag, New York, Inc., 1965.
- [14] G. Bemporad. Sul principio della media aritmetica. (Italian). *Atti Accad. Naz. Lincei*, 3(6):87–91, 1926.
- [15] L. R. Berrone and J. Moro. Lagrangian means. *Aequationes Math.*, 55(3):217–226, 1998.
- [16] L. R. Berrone and J. Moro. On means generated through the Cauchy mean value theorem. *Aequationes Math.*, 60(1-2):1–14, 2000.
- [17] G. Birkhoff. *Lattice theory*. Third edition. American Mathematical Society Colloquium Publications, Vol. XXV. American Mathematical Society, Providence, R.I., 1967.

- [18] P. S. Bullen, D. S. Mitrinović, and P. M. Vasić. *Means and their inequalities*, volume 31 of *Mathematics and its Applications (East European Series)*. D. Reidel Publishing Co., Dordrecht, 1988. Translated and revised from the Serbo-Croatian.
- [19] A. L. Cauchy. *Cours d'analyse de l'Ecole Royale Polytechnique, Vol. I. Analyse algébrique*. Debure, Paris, 1821.
- [20] O. Chisini. Sul concetto di media. (Italian). *Periodico di matematiche*, 9(4):106–116, 1929.
- [21] G. Choquet. Theory of capacities. *Ann. Inst. Fourier, Grenoble*, 5:131–295 (1955), 1953–1954.
- [22] A. C. Climescu. Sur l'équation fonctionnelle de l'associativité. *Bull. École Polytech. Jassy [Bul. Politehn. Gh. Asachi. Iași]*, 1:211–224, 1946.
- [23] E. Czogała and J. Drewniak. Associative monotonic operations in fuzzy set theory. *Fuzzy Sets and Systems*, 12(3):249–269, 1984.
- [24] L. M. de Campos and M. Jorge. Characterization and comparison of Sugeno and Choquet integrals. *Fuzzy Sets and Systems*, 52(1):61–67, 1992.
- [25] L. M. de Campos, M. T. Lamata, and S. Moral. A unified approach to define fuzzy integrals. *Fuzzy Sets and Systems*, 39(1):75–90, 1991.
- [26] B. de Finetti. Sul concetto di media. (Italian). *Giorn. Ist. Ital. Attuari*, 2(3):369–396, 1931.
- [27] C. Dellacherie. Quelques commentaires sur les prolongements de capacités. In *Séminaire de Probabilités, V (Univ. Strasbourg, année universitaire 1969-1970)*, pages 77–81. Lecture Notes in Math., Vol. 191. Springer, Berlin, 1971.
- [28] J. Dow and S. R. d. C. Werlang. Uncertainty aversion, risk aversion, and the optimal choice of portfolio. *Econometrica*, 60(1):197–204, 1992.
- [29] J. Dow and S. R. d. C. Werlang. Nash equilibrium under Knightian uncertainty: breaking down backward induction. *J. Econom. Theory*, 64(2):305–324, 1994.
- [30] D. Dubois, J. L. Marichal, H. Prade, M. Roubens, and R. Sabbadin. The use of the discrete Sugeno integral in decision-making: a survey. *Internat. J. Uncertain. Fuzziness Knowledge-Based Systems*, 9(5):539–561, 2001.
- [31] D. Dubois and H. Prade. Criteria aggregation and ranking of alternatives in the framework of fuzzy set theory. In *Fuzzy sets and decision analysis*, volume 20 of *Stud. Management Sci.*, pages 209–240. North-Holland, Amsterdam, 1984.
- [32] D. Dubois and H. Prade. A review of fuzzy set aggregation connectives. *Inform. Sci.*, 36(1-2):85–121, 1985.

- [33] D. Dubois and H. Prade. Weighted minimum and maximum operations in fuzzy set theory. *Inform. Sci.*, 39(2):205–210, 1986.
- [34] D. Dubois, H. Prade, and C. Testemale. Weighted fuzzy pattern matching. *Fuzzy Sets and Systems*, 28(3):313–331, 1988. Mathematical modelling.
- [35] J. J. Dujmović. Weighted conjunctive and disjunctive means and their application in system evaluation. *Univ. Beograd. Publ. Elektrotehn. Fak. Ser. Mat. Fiz.*, (461-497):147–158, 1974.
- [36] J. J. Dujmović. Extended continuous logic and the theory of complex criteria. *Univ. Beograd. Publ. Elektrotehn. Fak. Ser. Mat. Fiz.*, (498–541):197–216, 1975.
- [37] H. Dyckhoff and W. Pedrycz. Generalized means as model of compensative connectives. *Fuzzy Sets and Systems*, 14(2):143–154, 1984.
- [38] W. M. Faucett. Compact semigroups irreducibly connected between two idempotents. *Proc. Amer. Math. Soc.*, 6:741–747, 1955.
- [39] P. Fishburn and P. Wakker. The invention of the independence condition for preferences. *Management Sciences*, 41(7):1130–1144, 1995.
- [40] J. C. Fodor. A remark on constructing t -norms. *Fuzzy Sets and Systems*, 41(2):195–199, 1991.
- [41] J. C. Fodor. Strict preference relations based on weak t -norms. *Fuzzy Sets and Systems*, 43(3):327–336, 1991. Aggregation and best choices of imprecise opinions (Brussels, 1989).
- [42] J. C. Fodor. An extension of Fung-Fu’s theorem. *Internat. J. Uncertain. Fuzziness Knowledge-Based Systems*, 4(3):235–243, 1996.
- [43] J. C. Fodor and M. Roubens. *Fuzzy preference modelling and multicriteria decision support*. Kluwer, Dordrecht, 1994.
- [44] V. Frosini. Averages. In *Italian Contributions to the Methodology of Statistics*, pages 1–17. Cleup, Padova, 1987.
- [45] L. W. Fung and K. S. Fu. An axiomatic approach to rational decision making in a fuzzy environment. In *Fuzzy sets and their applications to cognitive and decision processes (Proc. U. S.-Japan Sem., Univ. Calif., Berkeley, Calif., 1974)*, pages 227–256. Academic Press, New York, 1975.
- [46] I. Gilboa. Expected utility with purely subjective nonadditive probabilities. *J. Math. Econom.*, 16(1):65–88, 1987.
- [47] M. Grabisch. On the use of fuzzy integral as a fuzzy connective. In *Proc. of the Second IEEE International Conference on Fuzzy Systems*, pages 213–218, San Francisco, 1993.

- [48] M. Grabisch. Fuzzy integral in multicriteria decision making. *Fuzzy Sets and Systems*, 69(3):279–298, 1995.
- [49] M. Grabisch. On equivalence classes of fuzzy connectives: the case of fuzzy integrals. *IEEE Trans. Fuzzy Syst.*, 3(1):96–109, 1995.
- [50] M. Grabisch. The application of fuzzy integrals in multicriteria decision making. *European J. Oper. Res.*, 89(3):445–456, 1996.
- [51] M. Grabisch. Fuzzy integral as a flexible and interpretable tool of aggregation. In *Aggregation and fusion of imperfect information*, volume 12 of *Stud. Fuzziness Soft Comput.*, pages 51–72. Physica, Heidelberg, 1998.
- [52] M. Grabisch, J.-L. Marichal, R. Mesiar, and E. Pap. *Aggregation functions*. Encyclopedia of Mathematics and its Applications. Cambridge University Press, Cambridge, UK, 2009.
- [53] M. Grabisch, T. Murofushi, and M. Sugeno, editors. *Fuzzy measures and integrals, Theory and applications*, volume 40 of *Studies in Fuzziness and Soft Computing*. Physica-Verlag, Heidelberg, 2000.
- [54] M. Grabisch, H. T. Nguyen, and E. A. Walker. *Fundamentals of uncertainty calculi with applications to fuzzy inference*, volume 30 of *Theory and Decision Library. Series B: Mathematical and Statistical Methods*. Kluwer Academic Publishers, Dordrecht, 1995.
- [55] G. H. Greco. On L -fuzzy integrals of measurable functions. *J. Math. Anal. Appl.*, 128(2):581–585, 1987.
- [56] E. Groes, J. Jacobsen, B. Sloth, and T. Tranæs. Axiomatic characterizations of the Choquet integral. *Econom. Theory*, 12(2):441–448, 1998.
- [57] U. Höhle. Integration with respect to fuzzy measures. In *Proc. IFAC Symposium on Theory and Applications of Digital Control*, pages 35–37, New Delhi, January 1982.
- [58] A. Kandel and W. J. Byatt. Fuzzy sets, fuzzy algebra, and fuzzy statistics. *Proc. IEEE*, 66(12):1619–1639, December 1978.
- [59] E. P. Klement, R. Mesiar, and E. Pap. *Triangular norms*, volume 8 of *Trends in Logic—Studia Logica Library*. Kluwer Academic Publishers, Dordrecht, 2000.
- [60] A. N. Kolmogoroff. Sur la notion de la moyenne. (French). *Atti Accad. Naz. Lincei*, 12(6):388–391, 1930.
- [61] C.-H. Ling. Representation of associative functions. *Publ. Math. Debrecen*, 12:189–212, 1965.
- [62] R. D. Luce. On the possible psychophysical laws. *Psych. Rev.*, 66:81–95, 1959.

- [63] J.-L. Marichal. *Aggregation operators for multicriteria decision aid*. PhD thesis, Institute of Mathematics, University of Liège, Liège, Belgium, December 1998.
- [64] J.-L. Marichal. An axiomatic approach of the discrete choquet integral as a tool to aggregate interacting criteria. *IEEE Trans. Fuzzy Syst.*, 8(6):800–807, 2000.
- [65] J.-L. Marichal. On Sugeno integral as an aggregation function. *Fuzzy Sets and Systems*, 114(3):347–365, 2000.
- [66] J.-L. Marichal. On the associativity functional equation. *Fuzzy Sets and Systems*, 114(3):381–389, 2000.
- [67] J.-L. Marichal. An axiomatic approach of the discrete sugeno integral as a tool to aggregate interacting criteria in a qualitative framework. *IEEE Trans. Fuzzy Syst.*, 9(1):164–172, 2001.
- [68] J.-L. Marichal. Aggregation of interacting criteria by means of the discrete choquet integral. In *Aggregation operators: new trends and applications*, pages 224–244. Physica, Heidelberg, 2002.
- [69] J.-L. Marichal. On order invariant synthesizing functions. *J. Math. Psych.*, 46(6):661–676, 2002.
- [70] J.-L. Marichal, P. Mathonet, and E. Tousset. Characterization of some aggregation functions stable for positive linear transformations. *Fuzzy Sets and Systems*, 102(2):293–314, 1999.
- [71] J.-L. Marichal, R. Mesiar, and T. Růschschlová. A complete description of comparison meaningful functions. *Aequationes Math.*, 69(3):309–320, 2005.
- [72] J.-L. Marichal and M. Roubens. Characterization of some stable aggregation functions. In *Proc. 1st Int. Conf. on Industrial Engineering and Production Management (IEPM’93)*, pages 187–196, Mons, Belgium, June 1993.
- [73] M. Mas, G. Mayor, and J. Torrens. t-operators. *Internat. J. Uncertain. Fuzziness Knowledge-Based Systems*, 7(1):31–50, 1999.
- [74] M. Mas, G. Mayor, and J. Torrens. The modularity condition for uninorms and t-operators. *Fuzzy Sets and Systems*, 126(2):207–218, 2002.
- [75] M. Mas, M. Monserrat, and J. Torrens. On left and right uninorms. *Internat. J. Uncertain. Fuzziness Knowledge-Based Systems*, 9(4):491–507, 2001.
- [76] J. Matkowski. Invariant and complementary quasi-arithmetic means. *Aequationes Math.*, 57(1):87–107, 1999.
- [77] R. Mesiar and T. Růschschlová. Characterization of invariant aggregation operators. *Fuzzy Sets and Systems*, 142(1):63–73, 2004.

- [78] F. Modave, D. Dubois, M. Grabisch, and H. Prade. A choquet integral representation in multicriteria decision making. In *AAAI Fall Symposium on Frontiers in Soft Computing and Decisions Systems*, pages 30–39, Boston, MA, November 7–9 1997.
- [79] F. Modave and M. Grabisch. Preference representation by the choquet integral: the commensurability hypothesis. In *Proc. 7th Int. Conf. on Information Processing and Management of Uncertainty in Knowledge-Based Systems (IPMU'98)*, pages 164–171, Paris, 1998.
- [80] P. S. Mostert and A. L. Shields. On the structure of semigroups on a compact manifold with boundary. *Ann. of Math. (2)*, 65:117–143, 1957.
- [81] T. Murofushi and M. Sugeno. An interpretation of fuzzy measures and the Choquet integral as an integral with respect to a fuzzy measure. *Fuzzy Sets and Systems*, 29(2):201–227, 1989.
- [82] T. Murofushi and M. Sugeno. A theory of fuzzy measures: representations, the Choquet integral, and null sets. *J. Math. Anal. Appl.*, 159(2):532–549, 1991.
- [83] T. Murofushi and M. Sugeno. Some quantities represented by the Choquet integral. *Fuzzy Sets Syst.*, 56(2):229–235, 1993.
- [84] M. Nagumo. Über eine klasse der mittelwerte. (German). *Japanese Journ. of Math.*, 7:71–79, 1930.
- [85] Y. Narukawa and T. Murofushi. The n -step Choquet integral on finite spaces. In *9th Int. Conf. on Information Processing and Management of Uncertainty in Knowledge-Based Systems (IPMU 2002)*, pages 539–543, Annecy, France, July 1-5 2002.
- [86] A. I. Orlov. The connection between mean values and the admissible transformations of scale. *Math. Notes*, 30:774–778, 1981.
- [87] S. Ovchinnikov. Means on ordered sets. *Math. Social Sci.*, 32(1):39–56, 1996.
- [88] S. Ovchinnikov. Invariant functions on simple orders. *Order*, 14(4):365–371, 1997/98.
- [89] A. L. Ralescu and D. A. Ralescu. Extensions of fuzzy aggregation. *Fuzzy Sets and Systems*, 86(3):321–330, 1997.
- [90] D. A. Ralescu and M. Sugeno. Fuzzy integral representation. *Fuzzy Sets and Systems*, 84(2):127–133, 1996.
- [91] U. Ricci. Confronti tra medie. (Italian). *Giorn. Economisti e Rivista di Statistica*, 26:38–66, 1915.

- [92] F. S. Roberts. *Measurement theory*, volume 7 of *Encyclopedia of Mathematics and its Applications*. Addison-Wesley Publishing Co., Reading, Mass., 1979. With applications to decisionmaking, utility and the social sciences, Advanced Book Program.
- [93] F. S. Roberts. Merging relative scores. *J. Math. Anal. Appl.*, 147(1):30–52, 1990.
- [94] F. S. Roberts. Limitations on conclusions using scales of measurement. In *Operation Research and the Public Sector*, pages 621–671. Elsevier, Amsterdam, 1994.
- [95] W. Sander. Associative aggregation operators. In *Aggregation operators*, volume 97 of *Stud. Fuzziness Soft Comput.*, pages 124–158. Physica, Heidelberg, 2002.
- [96] R. Sarin and P. Wakker. A simple axiomatization of nonadditive expected utility. *Econometrica*, 60(6):1255–1272, 1992.
- [97] D. Schmeidler. Integral representation without additivity. *Proc. Amer. Math. Soc.*, 97(2):255–261, 1986.
- [98] B. Schweizer and A. Sklar. Associative functions and statistical triangle inequalities. *Publ. Math. Debrecen*, 8:169–186, 1961.
- [99] B. Schweizer and A. Sklar. Associative functions and abstract semigroups. *Publ. Math. Debrecen*, 10:69–81, 1963.
- [100] B. Schweizer and A. Sklar. *Probabilistic metric spaces*. North-Holland Series in Probability and Applied Mathematics. North-Holland Publishing Co., New York, 1983.
- [101] S. S. Stevens. Mathematics, measurement, and psychophysics. In *Handbook of Experimental Psychology*, pages 1–49. Wiley, New York, 1951.
- [102] S. S. Stevens. Measurement, psychophysics, and utility. In *Measurement: Definitions and Theories*, pages 18–63. Wiley, New York, 1959.
- [103] M. Sugeno. *Theory of fuzzy integrals and its applications*. PhD thesis, Tokyo Institute of Technology, Tokyo, 1974.
- [104] M. Sugeno. Fuzzy measures and fuzzy integrals—a survey. In *Fuzzy automata and decision processes*, pages 89–102. North-Holland, New York, 1977.
- [105] P. Wakker. Continuous subjective expected utility with nonadditive probabilities. *J. Math. Econom.*, 18(1):1–27, 1989.
- [106] S. Weber. A general concept of fuzzy connectives, negations and implications based on t -norms and t -conorms. *Fuzzy Sets and Systems*, 11(2):115–134, 1983.

- [107] R. Yager and J. Kacprzyk, editors. *The Ordered Weighted Averaging operators*. Kluwer Academic Publishers, USA, 1997. Theory and Applications.
- [108] R. R. Yager. On ordered weighted averaging aggregation operators in multicriteria decisionmaking. *IEEE Trans. Systems Man Cybernet.*, 18(1):183–190, 1988.
- [109] R. R. Yager and A. Rybalov. Uninorm aggregation operators. *Fuzzy Sets and Systems*, 80(1):111–120, 1996.
- [110] E. B. Yanovskaya. Group choice rules in problems with interpersonal preference comparisons. *Automat. Remote Control*, 50(6):822–830, 1989.
- [111] H.-J. Zimmermann and P. Zysno. Latent connectives in human decision making. *Fuzzy Sets and Systems*, 4:37–51, 1980.