

# The Induced Generalized Hybrid Averaging Operator and its Application in Financial Decision Making

José M. Merigó, and Montserrat Casanovas

**Abstract**—We present the induced generalized hybrid averaging (IGHA) operator. It is a new aggregation operator that generalizes the hybrid averaging (HA) by using generalized means and order inducing variables. With this formulation, we get a wide range of mean operators such as the induced HA (IHA), the induced hybrid quadratic averaging (IHQA), the HA, etc. The ordered weighted averaging (OWA) operator and the weighted average (WA) are included as special cases of the HA operator. Therefore, with this generalization we can obtain a wide range of aggregation operators such as the induced generalized OWA (IGOWA), the generalized OWA (GOWA), etc. We further generalize the IGHA operator by using quasi-arithmetic means. Then, we get the Quasi-IHA operator. Finally, we also develop an illustrative example of the new approach in a financial decision making problem. The main advantage of the IGHA is that it gives a more complete view of the decision problem to the decision maker because it considers a wide range of situations depending on the operator used.

**Keywords**—Decision making, Aggregation operators, OWA operator, Generalized means, Selection of investments.

## I. INTRODUCTION

IN the literature, we find a wide range of aggregation operators for aggregating the information. A very common aggregation method is the ordered weighted averaging (OWA) operator [1]. It has been used in an astonishingly wide range of applications [2-8]. The main advantage of this operator is that it provides a parameterized family of aggregation operators that includes the maximum, the minimum and the average, as special cases.

An interesting extension of the OWA operator is the generalized OWA (GOWA) operator [9-10]. It generalizes the OWA operator by using generalized means [11-12]. Then, it includes all the special cases of the OWA operator and a lot of other extensions such as the ordered weighted geometric

averaging (OWG) operator, the ordered weighted quadratic averaging (OWQA) operator, etc. Note that the GOWA can be further generalized [13] by using quasi-arithmetic means [14-16]. The result is the Quasi-OWA operator [17]. Recently, Merigó and Gil-Lafuente [18] have suggested an extension of the GOWA operator that uses order inducing variables in a similar way as the induced OWA (IOWA) operator [19-20]. This operator has been called the induced generalized OWA (IGOWA) operator. It provides a wider generalization than the GOWA because it includes the GOWA as a special case, but it also includes a wide range of induced aggregation operators such as the IOWA, the induced OWG, the induced OWQA, etc. This operator has also been further generalized by using quasi-arithmetic means [18] and it is known as the Quasi-IOWA operator. Other generalizations of the OWA operator are found in [21-23]. Note that these generalizations have a different meaning than those developed in [24].

A further interesting aggregation operator is the hybrid averaging (HA) operator [25]. It is an aggregation operator that uses the weighted average (WA) and the OWA operator in the same formulation. The HA operator has been studied by several authors [4,26-27]. Another interesting extension of the HA operator is the one that uses a more general attitudinal character by using order inducing variables. It is known as the induced HA (IHA) operator. In the HA operator, it is also possible to generalize it by using generalized means. Then, we get the generalized hybrid averaging (GHA) operator. This generalization includes a wide range of mean operators such as the HA, the hybrid geometric averaging (HGA), the hybrid quadratic averaging (HQA), etc. Note that in this case, it is also possible to generalize it by using quasi-arithmetic means. The result is the Quasi-HA operator.

Going a step further, we see that it is also possible to develop a generalization of the HA operator that uses order inducing variables. We will call this aggregation operator, the induced generalized hybrid averaging (IGHA) operator. The main advantage of this operator is that it provides a wider generalization of the GHA because it provides a more complete attitudinal character by using inducing variables. The IGHA operator includes the GHA as a particular case. Therefore, all the particular cases of the GHA are also included in this generalization. It also provides with other types of means such as the IHA, the induced HGA, the induced HQA, the IGOWA operator, etc.

Manuscript received April 03, 2009.

J.M. Merigó is with the Department of Business Administration, University of Barcelona, Av. Diagonal 690, 08034, Barcelona, Spain (corresponding author: +34-93-4021962; fax: +34-93-4024580; e-mail: jmerigo@ub.edu).

M. Casanovas is with the Department of Business Administration, University of Barcelona, Av. Diagonal 690, 08034, Barcelona, Spain (e-mail: mcasanovas@ub.edu).

We further generalize it by using quasi-arithmetic means and we obtain, as a result, the Quasi-IHA operator. Finally, we will also develop an illustrative example of the new aggregation operator. We will focus on a financial decision making problem about the selection of investments. The main advantage of using the IGHA in decision making problems is that it gives a more complete view of the decision problem to the decision maker. Then, the decision maker will be able to consider a wide range of scenarios and select the one that it is in accordance with its interests.

In order to do this, this paper is organized as follows. In Section 2, we briefly review some basic concepts such as the IHA and the IGOWA operator. Section 3 presents the IGHA operator. Section 4 analyzes different families of IGHA operators. In Section 5, we present an illustrative example of the new approach in a financial decision making problem. Finally, in Section 6 we summarize the main conclusions of the paper.

## II. AGGREGATION OPERATORS

### A. Induced Generalized OWA Operator

The IGOWA operator was introduced in [18] and it represents a generalization of the IOWA operator by using generalized means. Then, it is possible to include in the same formulation, different types of induced operators such as the IOWA operator or the induced OWG (IOWG) operator. It can be defined as follows.

**Definition 1.** An IGOWA operator of dimension  $n$  is a mapping IGOWA:  $R^n \rightarrow R$  that has an associated weighting vector  $W$  of dimension  $n$  such that  $w_j \in [0, 1]$  and  $\sum_{j=1}^n w_j = 1$ , then:

$$IGOWA (\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \left( \sum_{j=1}^n w_j b_j^\lambda \right)^{1/\lambda} \quad (1)$$

where  $b_j$  is the  $a_i$  value of the IGOWA pair  $\langle u_i, a_i \rangle$  having the  $j$ th largest  $u_i$ ,  $u_i$  is the order inducing variable,  $a_i$  is the argument variable and  $\lambda$  is a parameter such that  $\lambda \in (-\infty, \infty)$ .

As we can see, if  $\lambda = 1$ , we get the IOWA operator. If  $\lambda = 0$ , the IOWG operator and if  $\lambda = 2$ , the IOWQA operator. Note that it is possible to further generalize the IGOWA operator by using quasi-arithmetic means. The result is the Quasi-IOWA operator.

### B. Induced Hybrid Averaging Operator

From a generalized perspective of the reordering process in the OWG operator, we have to distinguish between the Descending OWG (DOWG) operator and the Ascending OWG (AOWG) operator. The induced HA (IHA) operator is an extension of the HA operator that uses order inducing variables. The HA operator [25] is an aggregation operator that uses the WA and the OWA in the same formulation. Then, in the IHA operator it is possible to consider in the

same problem, a complex attitudinal character of the decision maker and its subjective probability.

**Definition 2.** An IHA operator of dimension  $n$  is a mapping IHA:  $R^n \rightarrow R$  that has an associated weighting vector  $W$  of dimension  $n$  such that the sum of the weights is 1 and  $w_j \in [0, 1]$ , then:

$$IHA (\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \sum_{j=1}^n w_j b_j \quad (2)$$

where  $b_j$  is the  $\hat{a}_i$  value ( $\hat{a}_i = n\omega_i a_i$ ,  $i = 1, 2, \dots, n$ ), of the IHA pair  $\langle u_i, a_i \rangle$  having the  $j$ th largest  $u_i$ ,  $u_i$  is the order inducing variable,  $\omega = (\omega_1, \omega_2, \dots, \omega_n)^T$  is the weighting vector of the  $a_i$ , with  $\omega_i \in [0, 1]$  and the sum of the weights is 1.

From a generalized perspective of the reordering step, we can distinguish between the descending IHA (DIHA) operator and the ascending IHA (AIHA) operator. The weights of these operators are related by  $w_j = w_{n-j+1}^*$ , where  $w_j$  is the  $j$ th weight of the DIHA and  $w_{n-j+1}^*$  the  $j$ th weight of the AIHA operator.

Different families of IHA operators are found by using a different manifestation in the weighting vector such as the step-IHA operator, the window-IHA operator, the median-IHA operator, the centered-IHA operator, etc. [4].

## III. THE INDUCED GENERALIZED HYBRID AVERAGING OPERATOR

The IGHA operator is a generalization of the IHA operator by using generalized means. It includes in the same formulation the weighted generalized mean and the IGOWA operator. It also uses order inducing variables in the reordering process. Then, this operator includes the WA, the OWA, the IOWA and the IOWG operator as special cases. It is defined as follows.

**Definition 3.** An IGHA operator of dimension  $n$  is a mapping IGHA:  $R^n \rightarrow R$  that has an associated weighting vector  $W$  of dimension  $n$  such that the sum of the weights is 1 and  $w_j \in [0, 1]$ , then:

$$IGHA (\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \left( \sum_{j=1}^n w_j b_j^\lambda \right)^{1/\lambda} \quad (3)$$

where  $b_j$  is the  $\hat{a}_i$  value ( $\hat{a}_i = n\omega_i a_i$ ,  $i = 1, 2, \dots, n$ ), of the IHA pair  $\langle u_i, a_i \rangle$  having the  $j$ th largest  $u_i$ ,  $u_i$  is the order inducing variable,  $\omega = (\omega_1, \omega_2, \dots, \omega_n)^T$  is the weighting vector of the  $a_i$ , with  $\omega_i \in [0, 1]$  and the sum of the weights is 1, and  $\lambda$  is a parameter such that  $\lambda \in (-\infty, \infty)$ .

From a generalized perspective of the reordering step, we can distinguish between the descending IGHA (DIGHA) operator and the ascending IGHA (AIGHA) operator. Note that they can be used in situations where the highest value is the best result and in situations where the lowest value is the best result. But in a more efficient context, it is better to use one of them for one situation and the other one for the other situation. The weights of these operators are related by  $w_j =$

$w_{n-j+1}^*$ , where  $w_j$  is the  $j$ th weight of the DIGHA and  $w_{n-j+1}^*$  the  $j$ th weight of the AIGHA operator. As we can see, the main difference is that in the AIGHA operator, the elements  $b_j$  ( $j=1, 2, \dots, n$ ) are ordered in an increasing way:  $b_1 \leq b_2 \leq \dots \leq b_n$  while in the DIGHA (or IGHA) they are ordered in a decreasing way.

If  $B$  is a vector corresponding to the ordered arguments  $b_j^\lambda$ , we shall call this the ordered argument vector and  $W^T$  is the transpose of the weighting vector, then, the IGHA operator can be expressed as:

$$IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = (W^T B)^{1/\lambda} \quad (4)$$

Note that if the weighting vector is not normalized, i.e.,  $W = \sum_{j=1}^n w_j \neq 1$ , then, the IGHA operator can be expressed as:

$$IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = \left( \frac{1}{W} \sum_{j=1}^n w_j b_j^\lambda \right)^{1/\lambda} \quad (5)$$

The IGHA operator is commutative, monotonic and idempotent. It is commutative because any permutation of the arguments has the same evaluation. That is,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = IGHA(\langle u_1, d_1 \rangle, \langle u_2, d_2 \rangle, \dots, \langle u_n, d_n \rangle)$ , where  $(d_1, \dots, d_n)$  is any permutation of the arguments  $(a_1, \dots, a_n)$ . It is monotonic because if  $a_i \geq d_i$ , for all  $a_i$ , then,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) \geq IGHA(\langle u_1, d_1 \rangle, \langle u_2, d_2 \rangle, \dots, \langle u_n, d_n \rangle)$ . It is idempotent because if  $a_i = a$ , for all  $a_i$ , then,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = a$ .

Another interesting issue when analysing the IGHA operator is the problem of ties in the reordering step. In order to solve this problem, we recommend the policy developed by Yager and Filev [20] where they replace each argument of the tied IOWA pairs by their average. For the IGHA operator, instead of using the arithmetic mean, we will replace each argument of the tied IGHA pairs by its generalized mean. Then, depending on the parameter  $\lambda$ , we will use a different type of mean to replace the tied arguments.

As it is explained in [20] for the IOWA operator, when studying the order inducing variable of the IGHA operator, we should note that the values used can be drawn from a space such that the only requirement is to have a linear ordering. Then, it is possible to use different kinds of attributes for the order inducing variables that permit us, for example, to mix numbers with words in the aggregations. Note that in some situations it is possible to use the implicit lexicographic ordering associated with words such as the ordering of words in dictionaries [20].

#### IV. FAMILIES OF IGHA OPERATORS

In this Section, we will analyze different types of IGHA operators. We will distinguish between two general classes: those found in the weighting vector  $W$  and those found in the parameter  $\lambda$ .

##### A. Analyzing the Weighting Vector $W$

By using a different manifestation of the weighting vector in the IGHA operator, we are able to obtain different types of aggregation operators. For example, we can obtain the hybrid maximum, the hybrid minimum, the generalized mean (GM), the weighted generalized mean (WGM) and the IGOWA operator.

The hybrid maximum is obtained if  $w_p = 1$  and  $w_j = 0$ , for all  $j \neq p$ , and  $u_p = \text{Max}\{a_i\}$ , then,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = \text{Max}\{a_i\}$ . The hybrid minimum is obtained if  $w_p = 1$  and  $w_j = 0$ , for all  $j \neq p$ , and  $u_p = \text{Min}\{a_i\}$ , then,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = \text{Min}\{a_i\}$ . More generally, if  $w_k = 1$  and  $w_j = 0$ , for all  $j \neq k$ , we get for any  $\lambda$ ,  $IGHA(\langle u_1, a_1 \rangle, \langle u_2, a_2 \rangle, \dots, \langle u_n, a_n \rangle) = b_k$ , where  $b_k$  is the  $a_i$  value of the IGHA pair  $\langle u_i, a_i \rangle$  having the  $k$ th largest  $u_i$ . The GM is found when  $w_j = 1/n$ , and  $\omega_i = 1/n$ , for all  $a_i$ . The WGM is obtained when  $w_j = 1/n$ , for all  $a_i$ . The GOWA is found when  $\omega_i = 1/n$ , for all  $a_i$ , and the ordered position of  $u_i$  is the same than the ordered position of  $b_j$  such that  $b_j$  is the  $j$ th largest of  $a_i$ .

Following a similar methodology as it has been developed in [4,7,28-29], we could study other particular cases of the IGHA operators such as the step-IGHA, the window-IGHA, the olympic-IGHA, the centered-IGHA operator, the S-IGHA operator, the median-IGHA, the E-Z IGHA, the nonmonotonic IGHA operator, etc.

For example, when  $w_j = 1/m$  for  $k \leq j \leq k+m-1$  and  $w_j = 0$  for  $j > k+m$  and  $j < k$ , we are using the window-IGHA operator. Note that  $k$  and  $m$  must be positive integers such that  $k+m-1 \leq n$ . Also note that if  $m = k = 1$ , and the initial position of the highest  $u_i$  is also the initial position of the highest  $a_i$ , then, the window-IGHA is transformed in the hybrid maximum. If  $m = 1$ ,  $k = n$ , and the initial position of the lowest  $u_i$  is also the initial position of the lowest  $a_i$ , then, the window-IGHA becomes the hybrid minimum.

If  $w_1 = w_n = 0$ , and for all others  $w_j = 1/(n-2)$ , we are using the olympic-IGHA. Note that if  $n = 3$  or  $n = 4$ , the olympic-IGHA is transformed in the median-IGHA and if  $m = n-2$  and  $k = 2$ , the window-IGHA becomes the olympic-IGHA. Also note that the olympic-IGHA is transformed in the olympic hybrid generalized average if  $w_p = w_q = 0$ , such that  $u_p = \text{Max}_i\{a_i\}$  and  $u_q = \text{Min}_i\{a_i\}$ , and for all others  $w_j = 1/(n-2)$ .

Another type of aggregation that could be used is the E-Z IGHA weights that it is based on the E-Z OWA weights [30]. In this case, we should distinguish between two classes. In the first class, we assign  $w_j = (1/k)$  for  $j = 1$  to  $k$  and  $w_j = 0$  for  $j > k$ , and in the second class, we assign  $w_j = 0$  for  $j = 1$  to  $n-k$  and  $w_j = (1/k)$  for  $j = n-k+1$  to  $n$ . Note that the E-Z IGHA weights becomes the E-Z GHA weights for the first class if the ordered position of  $u_i$  is the same than the ordered position of  $b_j$  such that  $b_j$  is the  $j$ th largest of  $a_i$ , from  $j = 1$  to  $k$ . And for the second class, the E-Z IGHA weights becomes the E-Z GHA weights if the ordered position of  $u_i$  is the same than the ordered position of  $b_j$  such that  $b_j$  is the  $j$ th largest of  $a_i$ , from  $j = n-k+1$  to  $n$ .

A further type that could be used is the median-IGHA operator. In this case, we should distinguish between two

cases. If  $n$  is odd we assign  $w_{(n+1)/2} = 1$  and  $w_j = 0$  for all others, and this affects the argument  $a_i$  with the  $[(n+1)/2]$ th largest  $u_i$ . If  $n$  is even we assign for example,  $w_{n/2} = w_{(n/2)+1} = 0.5$ , and this affects the arguments with the  $(n/2)$ th and  $[(n/2)+1]$ th largest  $u_i$ . Note that it is also possible to use the weighted IGHA median. We select the argument  $a_i$  that has the  $k$ th largest inducing variable  $u_i$ , such that the sum of the weights from 1 to  $k$  is equal or higher than 0.5 and the sum of the weights from 1 to  $k-1$  is less than 0.5. Note that if the ordered position of  $u_i$  is the same than the ordered position of  $b_j$  such that  $b_j$  is the  $j$ th largest of  $a_i$ , then, the IGHA median and the weighted IGHA median become the GHA median and the weighted GHA median, respectively.

Another family of aggregation operators that could be used in the IGHA operator is the centered-IGHA weights. This type of operator has been suggested by Yager [31] for the OWA operator. Following the same methodology, we could define a centered-IGHA operator if it is symmetric, strongly decaying and inclusive. It is symmetric if  $w_j = w_{j+n-j}$ . It is strongly decaying when  $i < j \leq (n+1)/2$  then  $w_i < w_j$  and when  $i > j \geq (n+1)/2$  then  $w_i < w_j$ . It is inclusive if  $w_j > 0$ . Note that it is possible to consider a softening of the second condition by using  $w_i \leq w_j$  instead of  $w_i < w_j$ . We shall refer to this as softly decaying centered-IGHA operator. Note that the generalized mean is an example of this particular case of centered-IGHA operator. Another particular situation of the centered-IGHA operator appears if we remove the third condition. We shall refer to it as a non-inclusive centered-IGHA operator. For this situation, we find the median-IGHA as a particular case.

A further interesting family is the S-IGHA operator based on the S-OWA operator [7,32]. It can be divided in three classes, the "orlike", the "andlike" and the generalized S-IGHA operator. The "orlike" S-IGHA operator is found when  $w_p = (1/n)(1-\alpha) + \alpha$ ,  $u_p = \text{Max}\{a_i\}$ , and  $w_j = (1/n)(1-\alpha)$  for all  $j \neq p$  with  $\alpha \in [0, 1]$ . The "andlike" S-IGHA operator is found when  $w_q = (1/n)(1-\beta) + \beta$ ,  $u_q = \text{Min}\{a_i\}$ , and  $w_j = (1/n)(1-\beta)$  for all  $j \neq q$  with  $\beta \in [0, 1]$ . Finally, the generalized S-IGHA operator is obtained when  $w_p = (1/n)(1-(\alpha+\beta) + \alpha)$ , with  $u_p = \text{Max}\{a_i\}$ ;  $w_q = (1/n)(1-(\alpha+\beta) + \beta)$ , with  $u_q = \text{Min}\{a_i\}$ ; and  $w_j = (1/n)(1-(\alpha+\beta))$  for all  $j \neq p, q$  where  $\alpha, \beta \in [0, 1]$  and  $\alpha + \beta \leq 1$ . Note that if  $\alpha = 0$ , the generalized S-IGHA operator becomes the "andlike" S-IGHA operator and if  $\beta = 0$ , it becomes the "orlike" S-IGHA operator.

Finally, note that other families could be studied such as the Gaussian IGHA weights, the nonmonotonic-IGHA operator, etc. For more information, see [4].

#### B. Analyzing the parameter $\lambda$

If we analyze different values of the parameter  $\lambda$ , we obtain another group of particular cases such as the usual IHA operator, the induced hybrid geometric averaging (IHGA) operator, the induced hybrid harmonic averaging (IHHA) operator and the induced hybrid quadratic averaging (IHQA) operator.

When  $\lambda = 1$ , we get the IHA operator.

$$IGHA(\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \sum_{j=1}^n w_j b_j \quad (6)$$

From a generalized perspective of the reordering step we can distinguish between the DIHA operator and the AIHA operator. Note that if  $w_j = 1/n$ , for all  $a_i$ , we get the WA and if  $\omega_j = 1/n$ , for all  $a_i$ , we get the IOWA operator. If  $w_j = 1/n$ , and  $\omega_j = 1/n$ , for all  $a_i$ , then, we get the arithmetic mean (AM).

When  $\lambda = 0$ , the IGHA operator becomes the IHGA operator.

$$IGHA(\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \prod_{j=1}^n b_j^{w_j} \quad (7)$$

In this case, it is also possible to distinguish between descending (DIHGA) and ascending (AIHGA) orders. Note that if  $w_j = 1/n$ , for all  $a_i$ , we get the WGM and if  $\omega_j = 1/n$ , for all  $a_i$ , we get the IOWG operator. If  $w_j = 1/n$ , and  $\omega_j = 1/n$ , for all  $a_i$ , then, we get the geometric average (GA).

When  $\lambda = -1$ , we get the IHHA operator.

$$IGHA(\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \frac{1}{\sum_{j=1}^n \frac{w_j}{b_j}} \quad (8)$$

In this case, we get the descending IHHA (DIHHA) operator and the ascending IHHA (AHHA) operator. Note that if  $w_j = 1/n$ , for all  $a_i$ , we get the weighted harmonic mean (WHM) and if  $\omega_j = 1/n$ , for all  $a_i$ , we get the induced ordered weighted harmonic averaging (IOWHA) operator. If  $w_j = 1/n$ , and  $\omega_j = 1/n$ , for all  $a_i$ , then, we get the harmonic mean (HM).

When  $\lambda = 2$ , we get the IHQA operator.

$$IGHA(\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = \left( \sum_{j=1}^n w_j b_j^2 \right)^{1/2} \quad (9)$$

In this case, we get the descending IHQA (DIHQA) operator and the ascending IHQA (AIHQA) operator. If  $w_j = 1/n$ , for all  $a_i$ , we get the WQM and if  $\omega_j = 1/n$ , for all  $a_i$ , we get the induced OWQA (IOWQA) operator. If  $w_j = 1/n$ , and  $\omega_j = 1/n$ , for all  $a_i$ , then, we get the quadratic mean (QM).

Note that we could analyze other families by using different values in the parameter  $\lambda$ . Also note that it is possible to study these families individually. Then, we could develop for each case, a similar analysis as it has been developed in Section 3 and 4.1 where we study different properties and families of the aggregation operator.

#### V. QUASI-IHA OPERATOR

Going a step further, it is possible to generalize the IGHA operator by using quasi-arithmetic means in a similar way as it was done for the IGOWA [18]. The result is the Quasi-IHA operator which is a hybrid version of the Quasi-OWA [17] and the Quasi-IOWA operator [18]. It can be defined as follows.

**Definition 4.** A Quasi-IHA operator of dimension  $n$  is a mapping  $QIHA: R^n \rightarrow R$  that has an associated weighting vector  $W$  of dimension  $n$  such that the sum of the weights is 1 and  $w_j \in [0,1]$ , then:

$$Quasi-IHA(\langle u_1, a_1 \rangle, \dots, \langle u_n, a_n \rangle) = g^{-1} \left( \sum_{j=1}^n w_j g(b_{(j)}) \right) \quad (10)$$

where  $b_j$  is the  $\hat{a}_i$  value ( $\hat{a}_i = n\omega_i a_i$ ,  $i = 1, 2, \dots, n$ ), of the Quasi-IHA pair  $\langle u_i, a_i \rangle$  having the  $j$ th largest  $u_i$ ,  $u_i$  is the order inducing variable,  $\omega = (\omega_1, \omega_2, \dots, \omega_n)^T$  is the weighting vector of the  $a_i$ , with  $\omega_i \in [0, 1]$  and the sum of the weights is 1.

As we can see, we replace  $b^{\lambda}$  with a general continuous strictly monotone function  $g(b)$ . In this case, the weights are also related by  $w_j = w_{n-j+1}^*$ , where  $w_j$  is the  $j$ th weight of the Quasi-DIHA and  $w_{n-j+1}^*$  the  $j$ th weight of the Quasi-AIHA.

Note that all the properties and particular cases commented in the IGHA operator, are also included in this generalization. For example, we could study different families of Quasi-IHA operators such as the Quasi-IOWA, the Quasi-WA, the Quasi-step-IHA, the Quasi-window-IHA, the Quasi-median-IHA, the Quasi-olympic-IHA, the Quasi-centered-IHA, etc.

#### VI. ILLUSTRATIVE EXAMPLE

In the following, we are going to develop an illustrative example of the new approach in a decision making problem. We will study an investment selection problem where an investor is looking for an optimal investment. Note that other decision making applications could be developed such as the selection of human resources [4], etc.

We will analyze different particular cases of the IGHA operator such as the AM, the WA, the OWA, the IOWA, the HA, the IHA, the IHQA, etc.

Assume an investor wants to invest some money in an enterprise in order to get high profits. Initially, he considers five possible alternatives.

- $A_1$  is a computer company.
- $A_2$  is a chemical company.
- $A_3$  is a food company.
- $A_4$  is a car company.
- $A_5$  is a TV company.

In order to evaluate these investments, the investor uses a group of experts. This group of experts considers that the key factor is the economic environment of the economy. After careful analysis, they consider five possible situations:  $S_1$  = Negative growth rate,  $S_2$  = Growth rate near 0,  $S_3$  = Low growth rate,  $S_4$  = Medium growth rate,  $S_5$  = High growth rate. The expected results depending on the situation  $S_i$  and the alternative  $A_k$  are shown in Table 1.

TABLE I  
PAYOFF MATRIX

	$S_1$	$S_2$	$S_3$	$S_4$	$S_5$
$A_1$	50	70	40	80	30
$A_2$	30	60	50	90	50
$A_3$	60	40	30	80	40
$A_4$	20	70	70	50	50
$A_5$	70	30	40	60	40

In this problem, the experts assume the following weighting vector:  $W = (0.1, 0.2, 0.2, 0.2, 0.3)$ . Due to the fact that the attitudinal character is very complex because it involves the opinion of different members of the board of directors, the experts use order inducing variables to express it. The results are represented in Table 2.

TABLE II  
ORDER INDUCING VARIABLES

	$S_1$	$S_2$	$S_3$	$S_4$	$S_5$
$A_1$	7	9	6	5	8
$A_2$	4	3	6	8	7
$A_3$	2	8	4	3	6
$A_4$	5	6	9	2	7
$A_5$	8	4	3	6	5

With this information, we can aggregate the expected results for each state of nature in order to take a decision. In Table 3, we present different results obtained by using different types of IGHA operators.

TABLE III  
AGGREGATED RESULTS

	AM	WA	OWA	HA	IOWA	IHA	IHQA
$A_1$	54	52	49	46.5	55	63.5	73.77
$A_2$	56	58	50	50.5	56	61	65.34
$A_3$	50	48	45	43	52	59	65.19
$A_4$	52	55	47	48.5	47	46.5	48.70
$A_5$	48	45	44	42	49	53.5	55.87

If we establish an ordering of the alternatives, a typical situation if we want to consider more than one alternative, then, we get the following results shown in Table 4.

TABLE IV  
ORDERING OF THE INVESTMENTS

AM	$A_2 \succ A_1 \succ A_4 \succ A_3 \succ A_5$	IOWA	$A_2 \succ A_1 \succ A_3 \succ A_5 \succ A_4$
WA	$A_2 \succ A_4 \succ A_1 \succ A_3 \succ A_5$	IHA	$A_1 \succ A_2 \succ A_3 \succ A_5 \succ A_4$
OWA	$A_2 \succ A_1 \succ A_4 \succ A_5 \succ A_3$	IHQA	$A_1 \succ A_2 \succ A_3 \succ A_5 \succ A_4$
HA	$A_2 \succ A_4 \succ A_1 \succ A_3 \succ A_5$		

As we can see, depending on the aggregator operator used, the ordering of the investments may be different. Then, it is clear that each particular case of the IGHA may lead to different results and decisions. Obviously, the decision maker will select the particular case that it is in accordance with its interests.

## VII. CONCLUSIONS

In this paper, we have presented the IGHA operator. It is a generalization of the OWA operator that uses the characteristics of three well known aggregation operators: the HA, the GOWA and the IOWA operator. Therefore, this operator uses a unifying framework between the WA and the OWA, generalized means and order inducing variables, in the same formulation. We have studied some of the main properties of this new aggregation operator. We have further generalized it by using quasi-arithmetic means. Then, we have obtained the Quasi-IHA operator.

We have also presented a numerical example of the new approach. We have developed a financial decision making problem about the selection of investments. The main idea behind this aggregation operator is that it includes a wide range of particular cases. Then, depending on the particular case used, the results and decisions may be different.

In future research, we expect to develop further extensions by adding new characteristics in the problem such as the use of uncertain information in the problem represented in the form of interval numbers, fuzzy numbers, linguistic variables, etc. We will also consider other business decision making problems such as human resource management, strategic management, etc.

## REFERENCES

- [1] R.R. Yager, "On Ordered Weighted Averaging Aggregation Operators in Multi-Criteria Decision Making", *IEEE Trans. Systems, Man and Cybernetics*, vol. 18, pp. 183-190, 1988.
- [2] G. Beliakov, A. Pradera, and T. Calvo, *Aggregation Functions: A guide for practitioners*, Springer-Verlag, Berlin, 2007.
- [3] T. Calvo, G. Mayor, and R. Mesiar, *Aggregation Operators: New Trends and applications*, Physica-Verlag, New York, 2002.
- [4] J.M. Merigó, *New Extensions to the OWA Operators and its application in decision making*, PhD Thesis (in Spanish), Dept. Business Administration, Univ. Barcelona, Barcelona, Spain, 2008
- [5] J.M. Merigó, and M. Casanovas, "Induced aggregation operators in decision making with Dempster-Shafer belief structure", *Int. J. Intelligent Systems* (to be published).
- [6] R.R. Yager, "On generalized measures of realization in uncertain environments", *Theory and Decision*, vol. 33, pp. 41-69, 1992.
- [7] R.R. Yager, "Families of OWA operators", *Fuzzy Sets and Systems*, vol. 59, pp. 125-148, 1993.
- [8] R.R. Yager, and J. Kacprzyck, *The Ordered Weighted Averaging Operators: Theory and Applications*, Kluwer Academic Publishers, Norwell, MA, 1997.
- [9] N. Karayiannis, "Soft Learning Vector Quantization and Clustering Algorithms Based on Ordered Weighted Aggregation Operators", *IEEE Trans. Neural Networks*, vol. 11, 1093-1105, 2000.
- [10] R.R. Yager, "Generalized OWA Aggregation Operators", *Fuzzy Opt. Decision Making*, vol. 3, pp.93-107, 2004.
- [11] J. Dujmovic, "Weighted conjunctive and disjunctive means and their application in system evaluation", *Publikacije Elektrotehnickog Fakulteta Beograd, Serija Matematika i Fizika*, No. 483, pp. 147-158, 1974.
- [12] H. Dyckhoff, and W. Pedrycz, "Generalized means as model of compensative connectives", *Fuzzy Sets and Systems*, vol. 14, pp. 143-154, 1984.
- [13] G. Beliakov, "Learning Weights in the Generalized OWA Operators", *Fuzzy Opt. Decision Making*, vol. 4, pp. 119-130, 2005.
- [14] G.H. Hardy, J.E. Littlewood, and G. Pólya, *Inequalities*, Cambridge University Press, Cambridge, 1934.
- [15] A.N. Kolmogoroff, "Sur la notion de la moyenne", *Atti Della Accademia Nazionale Dei Lincei*, vol. 12, pp. 388-391, 1930.
- [16] M. Nagumo, "Über eine klasse der mittelwerte", *Japanese J. of Mathematics*, vol. 6, pp. 71-79, 1930.
- [17] J. Fodor, J.L. Marichal, and M. Roubens, "Characterization of the ordered weighted averaging operators", *IEEE Trans. Fuzzy Systems*, vol. 3, pp. 236-240, 1995.
- [18] J.M. Merigó, and A.M. Gil-Lafuente, "The induced generalized OWA operator", *Information Sciences*, vol. 179, pp. 729-741, 2009.
- [19] R.R. Yager, "Induced aggregation operators", *Fuzzy Sets and Systems*, vol. 137, pp. 59-69, 2003.
- [20] R.R. Yager, and D.P. Filev, "Induced ordered weighted averaging operators", *IEEE Trans. Syst. Man Cybern.*, vol. 29, pp. 141-150, 1999.
- [21] J.M. Merigó, and M. Casanovas, "The fuzzy generalized OWA operator", In *Proceedings of the Conference SIGEF 2007*, pp. 504-517, Poiana-Brasov, Romania, 2007.
- [22] J.M. Merigó, M. Casanovas, "The uncertain generalized OWA operator and its application in the selection of financial strategies", In *Proceedings of the International Conference AEDEM 2007*, pp. 547-556, Krakow, Poland, 2007.
- [23] J.H. Wang, and J. Hao, "A new version of 2-tuple fuzzy linguistic representation model for computing with words", *IEEE Trans. Fuzzy Systems*, vol. 14, pp. 435-445, 2006.
- [24] P.A. Schaefer, and H.B. Mitchell, "A generalized OWA operator", *Int. J. Intelligent Systems*, vol. 14, pp. 123-143, 1999.
- [25] Z.S. Xu, and Q.L. Da, "An Overview of Operators for Aggregating Information", *Int. J. Intelligent Systems*, vol. 18, pp. 953-969, 2003.
- [26] Z.S. Xu, "A method based on linguistic aggregation operators for group decision making with linguistic preference relations", *Information Sciences*, vol. 166, pp. 19-30, 2004.
- [27] Z.S. Xu, "A Note on Linguistic Hybrid Arithmetic Averaging Operator in Multiple Attribute Group Decision Making with Linguistic Information", *Group Decision and Negotiation*, vol. 15, pp. 593-604, 2006.
- [28] R.R. Yager, "On weighted median aggregation", *Int. J. Uncertainty Fuzziness and Knowledge-Based Systems*, vol. 2, pp. 101-113, 1994.
- [29] R.R. Yager, "Quantifier Guided Aggregation Using OWA operators", *Int. J. Intelligent Systems*, vol. 11, pp. 49-73, 1996.
- [30] R.R. Yager, E-Z OWA weights, In *Proceedings of the 10th International Fuzzy Systems Association (IFSFA) World Congress*, Istanbul, Turkey, pp. 39-42, 2003.
- [31] R.R. Yager, "Centered OWA operators", *Soft Computing*, vol. 11, pp. 631-639, 2007.
- [32] R.R. Yager, and D.P. Filev, "Parameterized "andlike" and "orlike" OWA operators", *Int. J. General Systems*, vol. 22, pp. 297-316, 1994.

**José M. Merigó** (M'08) was born in Barcelona (Spain) in 1980. He is an assistant professor in the Department of Business Administration at the University of Barcelona. He holds a master and a PhD degree in Business Administration from the University of Barcelona and a Bachelor of Science and Social Science in Economics from the Lund University (Sweden).

He has written more than 60 papers in journals and conference proceedings including articles in *Information Sciences*, *Fuzzy Economic Review*, *International Journal of Computational Intelligence* and *International Journal of Information Technology*. He is on the editorial board of the *Association for Modelling and Simulation in Enterprises (AMSE)* and in the *WASET Scientific Committee – Applied and Natural Sciences*. He has served as a reviewer in different journals such as *IEEE Transactions on Fuzzy Systems*, *Information Sciences*, *International Journal of Systems Science*, *Fuzzy Optimization and Decision Making*, *International Journal of Computational Intelligence Systems* and *European Journal of Operational Research*.

**Montserrat Casanovas** was born in Barcelona (Spain) in 1947. She is a full professor in the Department of Business Administration at the University of

Barcelona. She holds a master degree and a PhD degree in Business Administration from the University of Barcelona.

She has written more than 80 papers in journals and conference proceedings including articles in *Fuzzy Economic Review*, *International Journal of Computational Intelligence* and *International Journal of Information Technology*. She is the General Secretarian of the *Catalonian School of Economists* (Spain). She is in the *Scientific Committee of WASET – Applied and Natural Sciences*. She has served as a reviewer in different journals such as *European Journal of Operational Research*.