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# Model of Multi-branch Trees for Efficient Resource **Allocation**

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**Abstract:** Although exploring the principles of resource allocation is still important in many fields, little is known about appropriate methods for optimal resource allocation thus far. This is because we should consider many issues including opposing interests between many types of stakeholders. Here, we develop a new allocation method to resolve budget conflicts. To do so, we consider two points—minimizing assessment costs and satisfying allocational efficiency. In our method, an evaluator's assessment is restricted to one's own projects in one's own department, and both an executive's and mid-level executives' assessments are also restricted to each representative project in each branch or department they manage. At the same time, we develop a calculation method to integrate such assessments by using a multi-branch tree structure, where a set of leaf nodes represents projects and a set of non-leaf nodes represents either directors or executives. Our method is incentive-compatible because no director has any incentive to make fallacious assessments.

Keywords: multi-branch trees; resource allocation; budget allocation; internal assessment; assessment costs; allocational efficiency; AHP; ternary diagram

# 1. Introduction

Exploring the principles of resource allocation is still important in many fields. Although, in many disciplines, including finance [1–3], economics [4–6], politics [7,8], marketing [9], and engineering [10–12], many approaches such as Pareto efficiency [13] or Inequality Reexamined [14] have been proposed for efficient resource allocation, little is known about appropriate methods for optimal resource allocation thus far. This is because such methods should solve lots of issues. For instance, the number of stakeholders who are operating from different standpoints is not small. Hence, the meaning of "optimal" differs between each stakeholder, so it is difficult for them to reach a good consensus. Not only that, there exist some practical restrictions such as limited resources or insufficient amounts of time. Therefore, developing appropriate budget allocation methods is still an issue. In addition, examining performance measurements for budgetary decision-making is also important for developing effective budget allocation methods [15].

Cooperative game literature has many studies on efficient resource allocation [16,17]. In particular, the core and kernel in cooperative game theory propose concrete feasible allocation. However, this method requires not only assessment values measuring all objects for allocation but also those values of any coalition of objects. Such a characteristic of requiring perfect information is almost impossible to satisfy in many real situations because all objects must be assessed with a unique measurement policy to do so.

The field of resource allocation has few unique measurement policies for assessing an object, although GMAT (Graduate Management Admission Test), for example, provides a unique measurement for measuring some skills of pupils for business school [18]. Let us consider a competitive fund organized by a national institution. Thousands of research agendas are submitted in Japan [19]. If the total required budget exceeds the available budget, the agendas should be selected. In this situation, no one knows a unified criterion for measuring all agendas, and thus, agendas are actually categorized into many small disciplines, which introduces too much segmentation. In each discipline, a feasible number of agendas are considered and selected. The important issue with this method is how much budget is distributed to each discipline. Normally, a primitive method is adopted. In Japanese competitive funds, a budget is divided and distributed to each discipline in proportion to the number of submitted agendas. That is, the acceptance rates of any of the disciplines are controlled the same or almost the same as each other.

Local governments are facing the same issue. In Japan, two kinds of budget allocation systems are generally used. One is a system in which budget allocators examine all projects. The system can force allocators to use their extensive powers and resources, though it can lead to quite appropriate allocations. The other is a system in which a budget allocator provides budget ceilings to each section for each policy. This is based on precedent or incrementalism. Although the first system has been in use for a long time, budget allocators are likely to avoid the system due to the huge costs needed. This is why a Japanese nationwide scale questionnaire survey [20] found that some local governments have switched to the second system. However, there is still a room for further improvement with this second system [21]. In fact, we find that a certain city abolished the second system after adopting it for ten fiscal years [22].

Although local governments in Japan consider such incrementalism for solving budget battles, such a simple but rigid rule cannot capture actual needs, and thus, it is difficult to respond to environmental changes adaptively. Not only that, it may lead to sectarianism, where winning budget battles and getting money for one's department are an absolute must. Moreover, they tend to spend budgets wastefully at the end of a fiscal year.

With this research background in mind, the objective of our study is to find a feasible allocation method that is better than the primitive method based on incrementalism [23,24] even if there is no appropriate unified criterion. Here, we propose an allocation method that can distribute budgets efficiently with imperfect information, not perfect information, in cooperative games.

To do so, we consider two points: minimizing assessment costs and satisfying allocational efficiency. Assessment costs here mean the costs of effort spent on assessments including the costs of designing a unified criterion that can be applied to all objects for allocation. Actually, designing such a criterion is almost impossible, and thus, we should consider a method that determines all allocation by integrating many assessments, the scope of which is local only. We developed a method in which multiple evaluators assess all objects for allocation in a manner like the division of labor, and allocation is calculated by integrating those assessments. Our method minimizes assessment costs.

The second point, allocational efficiency, is also an important issue. Let us consider a department where two projects would like to get money. The director of the department may be one the best people to assign money to those projects. Therefore, the director's assessment on the relative weights between the two can be extremely important information when considering budget allocation. We believe that the popularity of the allocation method based on incrementalism and precedent that is widely adopted in Japan is empirical evidence that budgets being distributed by directors to their own projects in their department is one of the most effective allocation methods.

Thus, are there any allocation methods that are more rational than a method that uses budget ceilings based on incrementalism? To consider this point, let us consider a small company that is working on budget allocation. The executive is the person in charge of the allocation, and there are several departments in the company. Each department is managed by a director and has several projects to which part of the budget needs to be assigned. If the directors precisely assess the rates

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of allocation for the projects in their departments, is it possible to regard assessing one project only among all projects as an assessment of all projects in the departments? An executive cannot consider all projects in one's company; however, if the executive selects one project in each department, it can be considered that the executive assesses all projects due to supporting by the directors who assess the remaining projects. The executive may not understand each project in detail. In this case, however, the executive can request that the directors send reports on the selected projects. By doing this, the executive may know the selected projects as do the directors. The executive can assess the relative values between departments from their own viewpoint by comparing each selected project.

Here, we propose a protocol of allocation based on the above discussion. In this protocol, a director's assessment is restricted to one's own projects in one's own department, and both an executive's and mid-level executives' assessments are also restricted to each representative project in each of the branches or departments that they manage. At the same time, we develop a calculation method to integrate such assessments. In our method, we use a multi-branch tree structure, where a set of leaf nodes represents either projects or policies and a set of non-leaf nodes represents either directors or executives. Our method may be balanced between minimizing assessment costs and allocational efficiency, and thus, we believe it to be novel.

The rest of this paper is organized as follows. We describe our novel budget allocation method for both a tournament model and a generalized model in Section 2. Some examples are provided in Section 3. We analyze some salient features in Section 4. We then discuss the features of our method and a further study in Section 5.

#### 2. Methods

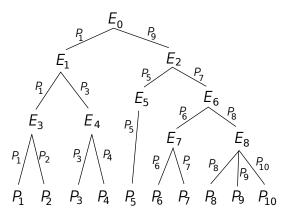
We define the new budget allocation method as a multi-branch tree structure. First, we define some terms, variables, and maps in the first subsection. Next, we explain the procedure of our method. In the procedure, we calculate a final allocation. This calculation of a specific type is easier than the generalized type; thus, we first introduce the specific type, called the "tournament model" and finally, we introduce the generalized model.

#### 2.1. Notation

Let us consider that *an organization* is considering distributing its budget to *projects* where the number of projects is set to *N*. Each project belongs to *a department*. A department has at least one project. A manager of a department is called *a director*. The top of the organization is called *an executive*. The executive manages all departments either directly or indirectly. If the executive manages them indirectly, there are mid-level departments managed by mid-level executives managing either departments or mid-level departments. This organizational structure is drawn as a tree structure using graph theory.

Figure 1 shows an example of an organization. There are 10 projects  $(P_1, P_2, \dots, P_{10})$  that require money, 5 departments (whose directors are  $E_3$ ,  $E_4$ ,  $E_5$ ,  $E_7$ , and  $E_8$ ), and 3 mid-level executives  $(E_1, E_2, E_3)$  and 1 executive  $(E_0)$  in the organization. The departments own projects are  $\{P_1, P_2\}$  for  $E_3$ ,  $\{P_3, P_4\}$  for  $E_4$ ,  $\{P_5\}$  for  $E_5$ ,  $\{P_6, P_7\}$  for  $E_7$ , and  $\{P_8, P_9, P_{10}\}$  for  $E_8$ .

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**Figure 1.** Example tree  $T_{(10,8)}$ 

We define a multi-branch tree structure  $T_{(n,m)}$ , where n is the number of leaf nodes representing projects, and m is that of internal nodes representing *evaluators* consisting of directors, mid-executives, and an executive. P denotes a set of leaf nodes  $\{P_i\}$  ( $i \in \{1, \ldots, n\}$ ), and E denotes a set of non-leaf nodes  $\{E_j\}$  ( $j \in \{0, \ldots, m\}$ ). We call  $E_0$  the root node (the executive) and the others internal nodes. The example tree of Figure 1 is defined as  $T_{(10.8)}$  with 10 projects and 9 evaluators.

For any  $j \in \{0, ..., m\}$ , we denote by  $T_j$  a tree consisting of  $E_j$  and all of its descendent nodes. Note that  $T_0 = T_{(n,m)}$ . Let  $E^j$  be the set of all child nodes of  $E_j$  and c(j) the set of the index numbers of evaluators in  $E^j$ . A tree  $T_k$  ( $k \in c(j)$ ) is called a *child tree of*  $E_j$ . Here, we call  $S_j$  the set of child trees of  $E_j$ . For example,  $S_2 = \{T_5, T_6\}$  is obtained from  $E_2$  in the example tree  $T_{(10,8)}$  of Figure 1.

Next, we define a map  $l: \{1, ..., n\} \times \{0, ..., m\} \longrightarrow \mathbb{Z} \cup \{\infty\}$  as

$$l(i, j) = h$$
,

where h means the length of the path from  $E_j$  to  $P_i$ . In contrast, we define a map  $e: \{1, ..., n\} \times \mathbb{Z} \longrightarrow \{0, ..., m\}$  as

$$e(i,h) = j$$
,

which outputs an index number of  $E_j$ , where h means the length of the path from  $E_j$  to  $P_i$ . Note that if  $P_i$  is not a descendant leaf node of  $E_j$ , we have  $l(i, j) = \infty$ , and e(i, h) is not defined.

For any  $i \in \{1, ..., n\}$ , we obtain only one shortest path from  $E_0$  to  $P_i$  and call it *path* i. For example, we consider  $P_7$  in Figure 1. The parent node of  $P_7$  is  $E_7$ , and the parent node of  $E_7$  is  $E_6$ . Repeating this procedure, we finally reach the root node,  $E_0$ . We then solve *path* 7 as follows.

$$E_0 - E_2 - E_6 - E_7 - P_7$$

Note that every *path* i for  $i \in \{1, ..., n\}$  is a sequence from  $E_0$  to  $P_i$ .

## 2.2. Procedure

We explain the procedure of our method. First, we define all projects as objects for distributing a budget, departments, directors, and executives as defined above. The second paragraph of the Notation Subsection shows these terms with the example of Figure 1.

# Step 1 Selection

First, all evaluators select projects that they must assess. However, all evaluators are prohibited from assessing them before all assessments are done by those who are children. In the example of Figure 1,  $E_1$  must wait until assessment by  $E_3$  and  $E_4$  is finished, and  $E_0$  must wait until all assessments by  $E_1$  to  $E_8$  are finished.

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A set of projects assessed by any evaluator is determined with the following procedure. If an evaluator is a director (who directly connects with leaf nodes), the director selects all projects in one's own department. In the example of Figure 1, a set of projects for  $E_3$  is  $\{P_1, P_2\}$ , and a set of projects for  $E_5$  is  $\{P_5\}$ . If an evaluator is not a director (that is, either an executive or a mid-level executive), one selects a project among descendant leaves of one's child node each. In the example of Figure 1,  $E_1$  must select two projects; one is from descendant leaves of  $E_3$ , and the other is from descendant leaves of  $E_4$ . In this case, all combinations are  $\{P_1, P_3\}$ ,  $\{P_1, P_4\}$ ,  $\{P_2, P_3\}$ , and  $\{P_2, P_4\}$ . Among them,  $E_1$  selects a set. In the example of Figure 1, a set of projects for  $E_1$  is  $\{P_1, P_3\}$ . Note that the label of every branch in Figure 1 is a selected project.

# Step 2 Evaluation

Second, all evaluators assess the projects that they must assess. They give a positive real number to each project as an assessment value. For capturing these values, we define a map  $v : \{0, ..., m\} \times \{1, ..., n\} \longrightarrow \mathbb{Z}$ , where v(j, k) means the evaluation value that  $E_j$  gives  $P_k$ .

Note that an assessment is given relatively. Let us consider that evaluator  $E_3$  assesses two projects,  $P_1$  and  $P_2$ , as shown in Figure 1. The assessment values of the two are denoted as v(3,1) and v(3,2), respectively. However, these values are relative to each other. That is, the case of  $E_3$  giving v(3,1) = 2 and v(3,2) = 5 is completely equivalent to the case of  $E_3$  giving v(3,1) = 4 and v(3,2) = 10.

#### Step 3 Calculation

In the final step, the final allocation of budgets is calculated. To do so, we first calculate an *N*-dimensional vector

$$W(T_{(i,j)}) = (w(P_1), w(P_2), \dots, w(P_n)),$$
 (1)

which consists of rates of allocation. Therefore,  $\sum w(P_i) = 1$  ( $i \in \{1, ..., n\}$ ). Using this vector, the executive distributes  $G \times w(P_i)$  to  $P_i$ , where G is the gross of the budget.

Each element of W must correspond to each evaluator's assessment. That is, for any evaluator  $E_j$  and for any two projects  $P_i$  and  $P_{i'}$  where  $E_j$  assesses both  $P_i$  and  $P_{i'}$ ,  $v(j,i):v(j,i')=w(P_i):w(P_{i'})$ . We developed a calculation method to solve W in the following subsections.

# 2.3. Tournament model

First, we consider a specific case, called the "tournament model." In this model, any evaluator except for the directors must satisfy a tournament condition where an evaluator selects projects that were selected by the evaluator's child evaluators. In the example of Figure 1, a set of projects for  $E_1$  is  $P_1$  and  $P_3$ , and both  $P_1$  being selected by  $E_3$  and  $P_3$  being selected by  $E_4$  is satisfied. Therefore,  $E_1$  satisfies the tournament condition. In comparison, the set of projects for  $E_2$  is  $P_5$  and  $P_7$ , but  $P_7$  is not selected by  $E_6$ . Therefore,  $E_2$  does not satisfy the tournament condition. There is an evaluator who does not satisfy the tournament condition in Figure 1, and thus, Figure 1 is not a tournament model.

In the tournament model, all evaluators have restricted candidate sets for selecting projects. However, the relative weight vector, W, is easily calculated. To explain this point, we define some notations. Let  $P^j$  be the set of projects from which  $E_{e(i,h-1)}$  chooses projects for each  $T_k$  ( $k \in c(e(i,h-1))$ ). Note that  $E_{e(i,h-1)}$  is the only one evaluator included both in  $E^j$  and path i for  $E_j$  ( $j \in \{0,\ldots,m\}$ ) in path i. It is easy to see that  $E_j$  should choose a project from  $P^j$ . Define a map  $p:\{1,\ldots,n\}\times \mathbb{Z} \longrightarrow \{1,\ldots,n\}$  that outputs an index number of  $P_{p(i,l(i,j))} \in P^j$ , where  $P_{p(i,l(i,j))}$  is chosen by  $E_j$  as a selected project of  $T_{e(i,h-1)}$ . We label the edge that connects  $E_j$  to  $E_{e(i,h-1)}$  " $P_{p(i,l(i,j))}$ " as follows.

path 
$$i$$
  $E_0 - \cdots - E_j \frac{P_{p(i,l(i,j))}}{E_{e(i,h-1)}} E_{e(i,h-1)} - \cdots - P_i$ .

If the evaluators are directors, that is, l(i, j) = 1, the child of  $E_j$  is just  $P_i$ . Hence,  $E_j$  should choose the only child  $P_i$  as a selected project.

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In the tournament model, each element of *W* is calculated as

$$w(P_i) = \frac{w'(P_i)}{\sum_{i=1}^{n} w'(P_i)}$$
 (2)

$$w(P_i) = \frac{w'(P_i)}{\sum_{i=1}^n w'(P_i)}$$

$$w'(P_i) = v\left(0, p(i, l(i, 0))\right) \prod_{h=1}^{l(i, 0)-1} \frac{v\left(e(i, h), p(i, h)\right)}{v\left(e(i, h), p(i, h+1)\right)}.$$
(3)

#### 2.4. Generalized model

Here, we generalize the tournament model. Any model that is not a tournament model is called a "generalized model." In this model, each evaluator is allowed to choose projects from among all descendent projects. However, the calculation of W is more difficult than in the tournament model.

To calculate W, several  $v(\alpha, \beta)$  should be calculated recursively. If  $v(\alpha, \beta)$  is not given by any evaluator,  $v(\alpha, \beta)$  is defined as

$$v(\alpha,\beta) = v\left(\alpha, p(\beta, l(\beta,\alpha))\right) \cdot \frac{v\left(e(\beta, l(\beta,\alpha) - 1), \beta\right)}{v\left(e(\beta, l(\beta,\alpha) - 1), p(\beta, l(\beta,\alpha))\right)}.$$
 (4)

Using this recursive definition, and  $v(\alpha, \beta)$ , the assessment of  $P_{\beta}$  by  $E_{\alpha}$ , is absolutely solved. This is because the first term,  $v(\alpha, p(\beta, l(\beta, \alpha)))$ , is given by  $E_{\alpha}$ , and both the numerator and denominator of the second term,  $v(e(\beta, l(\beta, \alpha) - 1), \cdot)$ , are assessments by an evaluator who is a child of  $E_{\alpha}$ .

Using v,  $w'(P_i)$  is calculated as

$$w'(P_i) = v(0, i). \tag{5}$$

# 3. Example

In this section, we show an example of our method for easily understanding our method as defined in Section 2. We consider an organization whose hierarchy is shown as Figure 1. In the first step, every evaluator selects projects that one must assess. All labels of the links in Figure 1 are projects each evaluator selects. In the second step, the relative assessment values are determined. In the example, the following values are determined.

$$v(0,1), v(0,9), v(1,1), v(1,3), v(2,5), v(2,7), v(3,1), v(3,2), v(4,3), v(4,4), v(5,5), v(6,6), v(6,8), v(7,6), v(7,7), v(8,8), v(8,9), v(8,10).$$

$$(6)$$

Note that these values are relative for each evaluator, and thus, v(5,5) is meaningless because  $E_5$ has one project to assess.

While this model is not a tournament model, the left subtree of the root node can be regarded as a tournament model because  $E_1$  satisfies the tournament condition and  $E_0$  selects  $P_1$ , which is selected by  $E_1$ . Thus, we can calculate  $w(P_4)$  by using a tournament model.

According to the tournament model,  $w'(P_4)$  is calculated as

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$$w'(P_{4}) = v(0, p(4, l(4, 0))) \prod_{h=1}^{l(4,0)-1} \frac{v(e(4, h), p(4, h))}{v(e(4, h), p(4, h + 1))}$$

$$= v(0, p(4, 3)) \prod_{h=1}^{2} \frac{v(e(4, h), p(4, h))}{v(e(4, h), p(4, h + 1))}$$

$$= v(0, p(4, 3)) \frac{v(e(4, 1), p(4, 1))}{v(e(4, 1), p(4, 2))} \frac{v(e(4, 2), p(4, 2))}{v(e(4, 2), p(4, 3))}$$

$$= v(0, 1) \frac{v(1, 3)}{v(1, 1)} \frac{v(4, 4)}{v(4, 3)}.$$
(7)

This is because we have l(4,0) = 3, p(4,1) = 4, p(4,2) = 3, p(4,3) = 1, e(4,1) = 4 and e(4,2) = 1. The next example of the calculation is on  $P_5$ . We calculate it by using the generalized model.

$$v(0,5) = v\left(0, p(5, l(5,0))\right) \cdot \frac{v\left(e(5, l(5,0) - 1), 5\right)}{v\left(e(5, l(5,0) - 1), p(5, l(5,0))\right)}$$

$$= v\left(0, p(5,3)\right) \cdot \frac{v\left(e(5,2), 5\right)}{v\left(e(5,2), p(5,3)\right)}$$

$$= v(0,9) \frac{v(2,5)}{v(2,9)}$$

$$= v(0,9) \frac{v(2,5)}{v(6,7)}$$

$$= v(0,9) \frac{v(2,5)}{v(6,8)} \frac{v(6,8) \frac{v(8,9)}{v(8,8)}}{v(6,6) \frac{v(7,7)}{v(7,6)}}$$

$$= v(0,9) \frac{v(8,8) \frac{v(6,6)}{v(6,8)} \frac{v(7,7)}{v(7,6)}}{v(6,8) \frac{v(7,7)}{v(7,6)}}$$

$$= v(0,9) \frac{v(8,8) \frac{v(6,6)}{v(6,8)} \frac{v(7,7)}{v(7,6)}}{v(7,6)}$$
(8)

This is because we have l(5,0) = 3, p(5,3) = 9, and e(5,2) = 2.

### 4. Mathematical features

Our method has some salient features. Here, we mathematically show three features. We call targets of budget allocation *projects*, the evaluators who represent the nodes connected with leaves directly *directors*, and the set of projects managed by any director its *department*.

#### 4.1. Assessment costs

Every evaluator determines the relative weights of projects whose number corresponds to one's child nodes. This is equivalent to estimating the relative weights of the other projects when a weight of a project is fixed to one. Therefore, the degree of freedom for each evaluator to assess all projects corresponds to the number of one's child nodes minus one. The following theorem shows that our

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method proposed is a method that can determine the relative weights of all projects uniquely with the lowest number of assessments.

**Theorem 1.** Let N be the number of all projects. The total of the degrees of freedom for the assessments by all evaluators is N-1.

**Proof.** Let  $n_1, n_2, \ldots, n_E$  be the numbers of projects assessed by each evaluator. Then,  $\sum_{i=1}^{E} n_i = B$ , where B represents the gross number of branches. An evaluator, i, decreases the degree of freedom by  $n_i - 1$ , and thus,  $\sum_{i=1}^{E} (n_i - 1) = B - E$ . The following corollary shows that this value is equal to N - 1.  $\square$ 

**Corollary 1.** For any tree structure, let the gross number of leaves be N, the gross number of nodes except for leaves be E, and the gross number of branches be E, respectively. E + 1 = E + N is satisfied.

**Proof.** This corollary is proven recursively. First, we consider a graph consisting of a root node only. Then, child nodes are added to the graph sequentially, and finally we assume that the graph corresponds to any tree structure. The first graph is a leaf only, and thus, the equation above is satisfied. Next, we choose a leaf node that has a child node in the final tree structure, and that node and its child nodes and branches that connect to it are added to the graph. Note that any tree structure can be reproduced by repeating this procedure. Let the number of that node's child nodes be k. By doing this procedure, the number of leaves increases by k, while the target node does not become a leaf, and thus, the increasing number of the right-hand side of the equation is k. By doing this procedure, the increasing number of the left-hand side of the equation is k because the number of branches increases by k. This is why the equation is always satisfied regardless of the procedure.  $\Box$ 

## 4.2. Allocational efficiency

In our proposed method, all projects are assessed by the directors who directly manage the projects. Therefore, in each department, the relative assessments of the projects done by each director are kept in the final allocation. This is why we regard allocational efficiency as something that is the result of a knowledgeable specialist in each department.

## 4.3. Incentive compatibility

Our method is incentive-compatible because no director has an incentive to make fallacious assessments. Let us consider when a director assesses a project lower than its true value. This underestimation has a positive effect if an ancestor of the director (an evaluator who is not a director) chooses the project because the allocation to the other projects of the department can increase. However, if no ancestor of the director selects the project, the allocation decreases. As well, let us consider when a director assesses a project to be greater than its true value. This overestimation has a positive effect if no ancestor of the director selects the project, while allocation to the other projects decreases if an ancestor of the director does choose the project. Regardless of either underestimation or overestimation, it is possible to lose one's benefit compared with the case of true assessment. Therefore, a max-min strategist has no merit to make fallacious assessments. The following theorem supports our discussion rigorously.

**Theorem 2.** If a director adopts a max-min strategy, one has no incentive to make fallacious assessments.

**Proof.** Let  $x_i$  be the assessment value of a project i in all projects, f be a project that a director wants to assess fallaciously, D be the department f belongs to,  $D_{-f}$  be the set of projects of D except for f, q be the fallacious value of f that the director wants to assign instead of  $x_f$ , and S be the total of the relative weights of all projects except for f ( $S = \sum_i x_i - x_f$ ). Let  $T = \sum_{D_{-f}} x_i$ . We set it so that the total of the budget goes to 1 without loss of generality.

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Case 1: The total number of evaluators assessing f is one (only a director). In this case, the relative weight of f only is changed to q from  $x_f$ . Therefore, the allocation of i, which is not f, is changed to  $\frac{x_i}{S+q}$  from  $\frac{x_i}{S+x_f}$ , and the allocation of f is changed to  $\frac{q}{S+q}$  from  $\frac{x_f}{S+x_f}$ . Therefore, the total allocation of the department is changed to  $\frac{T+q}{S+q}$  from  $\frac{T+x_f}{S+x_f}$ . The difference,  $\Delta_1$ , is calculated as

$$\Delta_1 = \frac{(T - S)(x_f - q)}{(S + q)(S + x_f)}. (9)$$

S > T is satisfied, and thus, the allocation of the department decreases if  $x_f > q$ .

Case 2: The total number of evaluators assessing f is more than one. In this case, no evaluators except for the director change their own assessments, and thus, the relative weights of none of the projects are changed expect for the elements of  $D_{-f}$ . The relative weight of any  $x_i$  in  $D_{-f}$  goes to  $\frac{x_f}{q}$  times of its original value. Therefore, the total allocation of the department is changed to  $\frac{T^{\frac{x_f}{q}} + x_f}{S + x_f + (\frac{x_f}{q} - 1)T}$  from  $\frac{T + x_f}{S + x_f}$ . The difference,  $\Delta_2$ , is calculated as

$$\Delta_2 = \frac{(S - T)(x_f - q)T}{\left(S + x_f + (\frac{x_f}{q} - 1)T\right)(S + x_f)q}.$$
 (10)

S > T is satisfied, and thus, the allocation of the department decreases if  $x_f < q$ .

Considering these two cases, if a director makes a fallacious assessment, the total allocation of the department can decrease regardless of projects chosen by the ancestors. Moreover, if the ancestors choose suitable projects, the total allocation of the department can decrease regardless of the value of the fallacious assessment (the value is both greater and smaller than its true value).

Note that we will extend the discusion above to analyze cases including that in which the ancestors adopt the max-min strategy, or in which the evaluators adopt the expected-utility principle.

# 5. Discussion

We propose a new budget allocation method that determines all projects' relative evaluation values by integrating assessments among projects in small groups. Using this method, adopting internal assessment within each group is considered to be quite rational because an insider generally has a very firm grasp of one's group and projects. In fact, internal assessment also lightens the evaluation cost of budget allocators compared with an overall examination.

Our method is simple because each evaluator determines the relative weights of projects whose number corresponds to the number of one's child nodes, the relative weights of all projects are calculated just as they satisfy the relative weights determined by each evaluator, and allocation is determined by using the gross. As shown in Section 4, this is one of the methods whereby assessment costs are minimized because all evaluators assess all projects through the division of labor. The method is thus regarded as a method that uses backward induction [25,26] because allocation is finally determined which keeps the relative weight rates of all evaluators. We will analyze aspects of our method through comparison with methods of backward induction in the literature for further extensions.

Our method is also one of the methods that satisfies allocational efficiency, where the lowest evaluators in a tree structure assess all projects of their departments and the assessments are completely maintained in the final allocation, as shown in Section 4. Although this simple policy is reflected in an empirical view because we modify a widely adopted method based on incrementalism, our method is deterministic and procedurally defined.

Although this method is for budget allocation for either medium-scale or small-scale organizations, it is possible to substitute an organization, a section, a policy, or a person for a project. Therefore,

the range of application for this method is very wide and includes budget allocation at large-scale organizations, labor evaluation, and the assessment of employees.

As shown in Section 4, we considered the incentive compatibility of the method. Let us assume that there is a malicious director, say M, among the lowest evaluators on a tree structure, and thus, M wants to get more money by controlling their own assessments of projects in a department that they themselves manage. If M can select the projects that M's bosses assess, one could control the budget allocation as one wants. Therefore, the projects that M's bosses assess must be selected either by the bosses themselves or randomly. As shown in the theorem of incentive compatibility in Section 4, our method is safe from such a malicious director if M cannot control M's bosses' choices. As discussed in the Introduction section, moreover, the bosses may not assess projects because they may not have special knowledge on them. This is why the bosses require reports on sales points of the projects from the directors. In consideration of this point, any evaluator must select and assess the projects that they are in charge of after all of one's lower evaluators in a tree structure have completed their assessment of the projects that they are in charge of.

This study on our method is a first step, and thus, many issues still remain. In the current version of our study, the issue of estimation is out of scope although important. This is because there is no guarantee that a relative weight of a project assessed by any evaluator is correctly measured. This point suggests that we must systematically consider errors in estimation if this is adopted for practical use.

For further studies, two kinds of errors that occur during an evaluation should be investigated. One is that internal assessment within each group is not necessarily appropriate. We cannot prevent an insider from underestimation or overestimation caused by various types of human relationships or preconceived ideas. The other is that an evaluator cannot give a relative evaluation value accurately among representatives that reflects their real values. An evaluator may not be familiar with every field, and the evaluator has to compare and evaluate projects that are in different fields. Thus, evaluation among representatives requires careful consideration.

To reduce the influence on all evaluation values from errors of the second type, it may be useful to choose more than one representative per group. In that case, we may adopt an average of the evaluation values from a plurality of comparisons among chosen representatives. The effect of errors is considered to be able to be neutralized with this scheme. We should thoroughly investigate how many comparisons are needed, for which it is suitable to adopt arithmetical mean or geometric mean, and so on.

The other extension is to consider the analytic hierarchy process [27], which is a traditional method for quantifying qualitative data by using individual preferences, a ternary diagram [28], or a ternary graph [29,30]. It may be effective to minimize the errors of both types.

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