# Optimal Challenges for Selection 

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#### Abstract

This paper generalizes the problems of optimal selection considered by Roth, Kadane and DeGroot by allowing a set of $J$ items to be chosen by two decision makers, the first of whom has $A$ challenges and the second has $B$ challenges. The two decision makers each have an opportunity to challenge each item before it is accepted, in some arbitrary fixed order. We assume that the decision makers know the utility function of the other side as well as their own over sets of $J$ items, and that they know the subjective distribution, assigned by the other side, of characteristics of potential items that will be observed, as well as their own. Under these conditions the other side's response to each potential item can be predicted with certainty, and backward induction defines an optimal strategy. We study an important special case we call regular, and show that it is never disadvantageous to go first in the regular case. The use of peremptory challenges in jury trials motivates our model. The basic model in which jurors are challenged one at a time is extended to a more general class of problems that includes the group system and the struck jury system.


IN THIS PAPER we consider a legal case which is to be tried by a jury, and shall study optimal strategies to be followed by the lawyers for the prosecution (or plaintiff) and the lawyers for the defense in their use of the peremptory challenges that are available to them. We shall begin by describing our model of the process by which the jury is chosen.

We assume that jurors are to be chosen from a venire or panel of prospective jurors that have been selected for possible jury duty from the community in which the trial is being held. In our basic model, prospective jurors are examined by the judge one at a time to make sure that they are qualified and then asked questions which could result in their being dismissed for cause. If a prospective juror is not dismissed for cause, the lawyers for either side then have the opportunity to have him dismissed by exercising a peremptory challenge. If neither side does so, he becomes a member of the jury.

We shall assume throughout this paper that all the prospective jurors who can be dismissed for cause have been eliminated from the panel, and shall restrict our attention to the population of prospective jurors who cannot be dismissed for cause. Thus, prospective jurors from this population are interviewed sequentially; after each person is interviewed, the
lawyers for each side must specify whether they wish to exercise a peremptory challenge or to accept the juror. If he is accepted, he joins the jury and cannot later be dismissed. If he is challenged, he is dismissed and cannot later be recalled.

We assume that, for each prospective juror, first one side must state its decision, and then the other side. Thus, the two sides never make decisions simultaneously and the two sides will not both exercise peremptory challenges on the same prospective juror. The question of which side is to decide first for each prospective juror is left arbitrary in our mathematics; it need not be the same side for each prospective juror. However, we assume that the rule is specified in advance and does not depend in any way on how peremptory challenges have been used on previous prospective jurors.

We assume that $J$ jurors are to be chosen for the jury. Of course, $J$ will usually be 12 , but it could be 6 or some other number. We shall shortly describe some interesting applications of our theory in which $J=1$. We assume also that the prosecution is limited to $A$ peremptory challenges and the defense to $B$, where $A$ and $B$ are given positive integers.

We assume that each prospective juror is represented by a vector $X$ of some arbitrary dimension that summarizes all the information available to the prosecution and the defense with regard to that person's possible behavior as a juror. In brief, each prospective juror is characterized by a vector $X$ that summarizes any demographic, physical, or behavioral variables that might be relevant to his performance as a juror.

Since $J$ jurors are to be seated on the jury and a total of $A+B$ peremptory challenges are available to the two sides, the jury must be fully formed after at most $J+A+B$ prospective jurors have been interviewed. We assume that the lawyers for the prosecution and the lawyers for the defense can each represent their own view of the process generating the sequence of prospective jurors by assigning a joint probability distribution to $X_{1}, \cdots, X_{J+A+B}$. This distribution need not be the same for the two sides, but it is assumed that each side knows the distribution that is assigned by the other side. The following four special cases are of particular interest:

1. The random vectors $X_{1}, \cdots, X_{J+A+B}$ might be independent and identically distributed with a particular known distribution that is agreed on by both sides. This might be the case if the distribution of the vector $X$ in the population of prospective jurors was known quite precisely to both sides through a careful survey or poll of the community.
2. Suppose that each side had conducted its own survey of the community and that the two surveys yielded different results. Then each side might be aware of the results of the survey conducted by the other side, but it might believe its own survey rather than the other one. In this
case, each side might again assume that the random vectors $X_{1}, \cdots$, $X_{J+A+B}$ are independent and identically distributed, but the two sides would assign different distributions.
3. The exact sequence of values of $X_{1}, \cdots, X_{J+A+B}$ might be known in advance to both sides. This might be the case if the lawyers could interview or otherwise study the entire specific panel of prospective jurors from which the jury was to be chosen before beginning the sequential selection and challenge process.
4. The random variables $X_{1}, \cdots, X_{J+A+B}$ might be exchangeable but dependent. This might be the case if the lawyers for both sides believe that $X_{1}, \cdots, X_{J+A+B}$ form a random sample from some distribution of prospective jurors that depends on a parameter $\theta$ whose value is unknown to both sides, and each side assigns a prior distribution to $\theta$. The two sides might agree on the conditional distribution of $X_{j}$ for any given value of $\theta$, but they might assign different prior distributions to $\theta$. The lawyers for each side will update their own distribution for $\theta$ after each prospective juror is interviewed, which in turn will affect their joint distribution for the remaining prospective jurors.

Returning to the general case, let $Y_{1}, \cdots, Y_{J}$ denote the $X$-vectors of characteristics for the $J$ jurors actually chosen. For any given strategies that the two sides may use for the exercise of peremptory challenges, $Y_{1}$, $\ldots, Y_{J}$ are random variables before the selection has actually been made. For any possible values $y_{1}, \cdots, y_{J}$ of $Y_{1}, \cdots, Y_{J}$, we shall let $\psi_{i}\left(y_{1}\right.$, $\left.\cdots, y_{J}\right)$ denote the utility function of side $i$, where $i=1$ refers to the prosecution and $i=2$ refers to the defense. Thus, we assume each side $i$ is trying to select a jury in order to maximize $E_{i}\left[\psi_{i}\left(Y_{1}, \ldots, Y_{J}\right)\right]$. Here, $E_{i}$ denotes expectation with respect to the joint distribution of $X_{1}, \cdots$, $X_{J+A+B}$ assigned by side $i$. These expectations each depend on the strategies used by both sides.

The functions $\psi_{1}$ and $\psi_{2}$ could have various interpretations. For example, if both sides in a criminal trial were interested only in whether or not the juror voted for conviction, $\psi_{1}\left(y_{1}, \cdots, y_{J}\right)$ could be interpreted as the probability, in the view of the prosecution, that a jury comprising $y_{1}$, $\cdots, y_{J}$ would vote for conviction and $\psi_{2}\left(y_{1}, \cdots, y_{J}\right)$ could be interpreted as the probability, in the view of the defense, that the jury would not vote for conviction. In more general contexts, the functions $\psi_{i}$ might take into the account the possibility that the jury does not reach any decision (i.e., that it becomes a hung jury), or the possibility that the jury might recommend a heavier or a lighter punishment or penalty.

Often the behavior of a jury depends only on the values of $y_{1}, \cdots, y_{J}$ and not on the order in which these $J$ values were selected, so that the functions $\psi_{1}$ and $\psi_{2}$ can be taken to be symmetric. Sometimes, however, the first juror chosen, who has characteristics $y_{1}$, is automatically the foreman. Also, sometimes the last jurors chosen are alternates who
participate in the jury decision only if one of the other jurors is incapacitated. Since the assumption of symmetry is not necessary for our mathematics and does not seem to simplify our analysis, we do not make that assumption.

Finally, it should be emphasized that, although both sides observe the vector $X$ for each prospective juror, the prosecution and defense may well disagree on what aspects of this vector are important or relevant. On the other hand, the prosecution and defense may agree on the importance of the various components of each $y_{j}$, but may disagree on what these values imply about how the juror will behave.

We shall now define what we mean by optimal procedures in this problem. Since a jury of $J$ persons must have been found after at most $A$ $+B+J$ people have been interviewed, the number of decisions in the selection process is bounded. Consider the last possible decision that could arise in this process, when one side has one challenge remaining, the other side has none, and only one juror remains to be seated. If the sequential decision process has not terminated before this state is reached, then the side with the one available challenge has a well-defined optimal decision for each possible prospective juror that might be interviewed.

Under the assumption that this last possible choice will be made optimally, the consequences of the next-to-last possible decision are known, and hence it can also be made optimally. By backward induction, each decision can be made optimally under the assumption that both sides will act optimally in all possible subsequent decisions. The optimal procedure is taken to be the one resulting from all these optimal actions of both sides. Thus we assume that juror selection is a noncooperative two-player sequential game in which each side is trying to maximize its own expected utility. If the sides could collude, they might under some circumstances both improve their expected utilities, but we assume that they do not. Noncooperative two-person games with alternating choices are also used in studies of duopoly by Cyert and DeGroot [4, 5].

The next section describes the relation of our problem to the previous literature. Sections 2, 3 and 4 are devoted to our basic model in which jurors are either chosen or rejected one at a time. Section 2 gives our notation, and, in Theorem 1, the expected utility of being first and of being second to exercise challenges. Section 3 discusses the important concept of regularity, and shows that if the two sides have the same opinion about the characteristics of the unseen jurors, or if there is only one juror to be selected, then the problem is regular. An example is given which is not regular. Section 4 discusses the advantage of going first. In a regular problem it is never disadvantageous to go first. If the two sides have the same opinion about the characteristics of unseen jurors, and have either diametrically opposed or exactly coincident utilities, then the
order in which they exercise challenges is irrelevant to both of them. Finally an example is given in which it is strictly advantageous to go second. Section 5 discusses a generalization of the basic sequential model and examples described above to other jury selection processes including the group system and the struck jury system.

## 1. NATURE OF THE MODEL AND RELATION TO PREVIOUS LITERATURE

Roth, Kadane and DeGroot [9] studied problems of the type we have described under the following special assumptions: Both the prosecution and the defense are interested only in the probability that the jury will vote for conviction. Each prospective juror is characterized by a vector $X$ $=\left(p_{1}, p_{2}\right)$, where $p_{i}$ is the assessment of side $i$ of the probability that the prospective juror will vote for conviction. It is assumed that these twodimensional vectors for successive prospective jurors are independent and identically distributed drawings from some bivariate distribution known to both sides. Furthermore, each side assumes that the probability that the final jury will vote for conviction is equal to the product of the individual probabilities that each member of the jury will vote for conviction. Finally, each side assigns utilities only to the possibilities of a conviction or no conviction.

In this paper, these assumptions are relaxed to permit a more sophisticated view of the jury selection and jury decision process. We allow an arbitrary representation of the relevant characteristics of each prospective juror, arbitrary probability distributions, and arbitrary utility functions over possible juries. However the assumptions of this paper are restrictive in that we assume that each side is fully aware of the information and beliefs of the other side.

Sakaguchi [10] and Kadane [8] study a similar problem in which exactly $r$ of $n$ available random vectors must be chosen jointly by several players. In their problem the identity of the challenger does not limit the available future strategies of any player. Under these circumstances, the order in which the players announce their decisions does not affect the outcome. The optimal use of peremptory challenges in trials by jury is a generalization of the problems of optimal selection discussed by Gilbert and Mosteller [7] and DeGroot [6, Sec. 13.4], among others, and much earlier by Cayley [3].

In summary, the problems of jury selection that we are studying can be described in the following general context: A group of $J$ items with characteristics $y_{1}, \cdots, y_{J}$ is to be selected jointly by two persons. If $J=$ 1 , the item might be a house or a car to be selected jointly by a husband and wife, or an employee to be hired jointly by two executives in a particular firm. If $J \geq 2$, the items might be thought of as $J$ persons that
will form a team or committee, or a staff of $J$ employees, to be selected jointly by the two decision makers. The interests and evaluations of the two decision makers need not coincide, and $\psi_{1}\left(y_{1}, \cdots, y_{J}\right)$ and $\psi_{2}\left(y_{1}\right.$, $\left.\cdots, y_{J}\right)$ represent the utilities to each of them of any possible selection of $J$ items with characteristics $y_{1}, \cdots, y_{J}$. Each of the two decision makers can either accept or reject each item, and has a fixed number of available challenges. The observations $X_{1}, X_{2}, \ldots$ have a specified joint distribution that is known to both decision makers, and each of them tries to maximize his own expected utility.

While we have limited our considerations in this paper to two sides, we believe that the problems, the point of view and our results generalize to more than two sides.

## 2. NOTATION AND PRELIMINARY RESULTS FOR THE BASIC MODEL

This section and the next two are devoted to the basic sequential model described in the beginning of this paper. Suppose that $k$ prospective jurors with characteristics $X_{1}, \cdots, X_{k}$ have been observed, some of whom may have been challenged and the others seated on the jury. This history comprising these values and a specification of which jurors were seated is denoted $h_{k}$. The history $h_{k}$ may affect the future decisions by the two sides in the following ways:
(i) If $J^{\prime}$ jurors have been seated then the first $J^{\prime}$ components of the utility functions $\psi_{1}$ and $\psi_{2}$ have been determined and the utility of remaining groups of jurors may be affected;
(ii) The expected utility for each side is now calculated with respect to its conditional joint distribution of $X_{k+1}, X_{k+2}, \cdots$ given $X_{1}, \cdots, X_{k}$.
Let $E_{i}\left(\psi_{i} \mid h_{k}, a, b, j\right)$ denote the expected utilities to side $i$ of the optimal strategies given the history $h_{k}$ and given that the prosecution has $a$ challenges remaining, the defense has $b$, and $j$ jurors remain to be chosen.

Suppose now that some history $h_{k}$ has already happened, and let $X_{k+1}=x$ be the characteristics of the next prospective juror observed. Let $\left[h_{k}, x^{c}\right.$ ] denote the history consisting of $h_{k}$ followed by $X_{k+1}=x$ and the superscript " $c$ " denote that prospective juror $k+1$ was challenged. Similarly a superscript " $s$ " indicates that the prospective juror in question was seated. Let

$$
F_{1}=E_{1}\left(\psi_{1} \mid\left[h_{k}, x^{c}\right], a-1, b, j\right)
$$

so that $F_{1}$ is the worth to the prosecution of the optimal strategies in the situation where $j$ jurors are left to be chosen, the prosecution has $a$ challenges, the defense has $b$ challenges, and the prosecution uses one of its challenges. Similarly, let $G_{1}=E_{1}\left(\psi_{1} \mid\left[h_{k}, x^{c}\right], a, b-1, j\right)$ so that $G_{1}$ is the worth to the prosecution of the same situation except that the
defense, instead of the prosecution, exercises the peremptory challenge. Finally, let $C_{1}=E_{1}\left(\psi_{1} \mid\left[h_{k}, x^{s}\right], a, b, j-1\right)$, so that $C_{1}$ is the worth of the above situation to the prosecution if the juror with characteristics $x$ is not challenged by either side and, hence, is seated on the jury.

Similarly, let $F_{2}=E_{2}\left(\psi_{2} \mid\left[h_{k}, x^{c}\right], a, b-1, j\right), G_{2}=E_{2}\left(\psi_{2} \mid\left[h_{k}, x^{c}\right], a-\right.$ $1, b, j)$, and $C_{2}=E_{2}\left(\psi_{2} \mid\left[h_{k}, x^{s}\right], a, b, j-1\right)$, which are, respectively, the expected utilities of the optimal strategies to the defense if the defense challenges, the prosecution challenges, or the prospective juror is seated. Since one of these three outcomes must occur, the $F$ 's, G's, and C's fully describe the expected utility of the situation. We now describe how to determine the optimal strategies and their expected utilities.

We impose the convention $F_{1}=G_{2}=-\infty$ if $a=0$ and $F_{2}=G_{1}=-\infty$ if $b=0$ so that neither side wishes to use a challenge it does not have. When $j=0$ the process ends.

Suppose that the prosecution goes first. If the prosecution does not challenge the juror, then the defense will challenge the juror if $F_{2}>C_{2}$, and will accept the juror if $F_{2}<C_{2}$. A special problem occurs if $F_{2}=C_{2}$, because in this case the defense could optimally take either action. In order not to burden our analysis and notation excessively, we will break ties by supposing that challenges will be exercised only when they are strictly necessary. Thus by assumption the defense will challenge the juror if $F_{2}>C_{2}$, and will accept the juror otherwise. Therefore, the worth to the prosecution of the choice not to challenge is $G_{1}$ if $F_{2}>C_{2}$ and $C_{1}$ otherwise. Consequently, when $F_{2}>C_{2}$, the prosecution will challenge if $F_{1}>G_{1}$. When $F_{2} \leq C_{2}$, the prosecution will challenge if $F_{1}>C_{1}$. This type of reasoning leads to the following result:

Theorem 1. For each side $i,(i=1,2)$, the expected utility of going first if both sides use optimal strategies is

$$
\begin{array}{ll}
F_{i} & \text { if } \quad\left(F_{3-i}>C_{3-i} \quad \text { and } \quad F_{i}>G_{i}\right) \\
\text { or } \quad\left(C_{3-i} \geq F_{3-i} \quad \text { and } \quad F_{i}>C_{i}\right), \\
G_{i} & \text { if } \quad F_{3-i}>C_{3-i} \quad \text { and } \quad G_{i} \geq F_{i}, \\
C_{i} & \text { if } \quad C_{i} \geq F_{i} \quad \text { and } \quad C_{3-i} \geq F_{3-i},
\end{array}
$$

and the expected utility of going second is

$$
\begin{aligned}
& F_{i} \quad \text { if } \quad F_{i}>C_{i} \quad \text { and } \quad G_{3-i} \geq F_{3-i}, \\
& G_{i} \quad \text { if } \quad\left(F_{i}>C_{i} \quad \text { and } \quad F_{3-i}>G_{3-i}\right) \\
& \text { or } \quad\left(C_{i} \geq F_{i} \quad \text { and } \quad F_{3-i}>C_{3-i}\right) \text {, } \\
& C_{i} \quad \text { if } \quad C_{i} \geq F_{i} \quad \text { and } \quad C_{3-i} \geq F_{3-i} .
\end{aligned}
$$

## 3. REGULARITY

It is natural to suppose that $G_{i} \geq F_{i}(i=1,2)$ for any possible values of $h_{k}, x, a, b$, and $j$ that might arise during the jury selection process. These inequalities compare a situation in which the prosecution has $a$ challenges remaining and the defense has $b-1$ remaining, with a situation in which the prosecution has $a-1$ remaining and the defense has $b$ remaining. The inequalities simply state that the prosecution would prefer the first situation and that the defense would prefer the second situation, all other conditions being equal. We shall say that a problem in which these relations are satisfied is regular.

At first thought, it might appear that every problem must be regular. In fact, Brams and Davis [2] refer to the irregular case in problems of jury selection as "absurd" and assume that regularity holds. Certainly, every problem that might arise in practice will be regular, because if a problem is not regular then a situation might arise in which the lawyers for one side would actually want to give one of their remaining challenges to the other side, a somewhat impractical move. However, the following example shows that there do exist problems that are not regular.

Example 1. Suppose that two jurors are to be chosen. Suppose also that there are three kinds of jurors denoted $H, M$ and $L$ ("High," "Medium" and "Low") and the sequence of the appearance of the first four prospective jurors is known by both sides with certainty to be $H, M$, $L, L$. Suppose finally that the preferences of each side are given by the relations $\psi_{1}(H L)>\psi_{1}(H M)>\psi_{1}(M L)>\psi_{1}(L L)$ and $\psi_{2}(H M)>\psi_{2}(L L)>$ $\psi_{2}(M L)>\psi_{2}(H L)$.

Now suppose that $a=1$ and $b=1$. If the defense goes first and accepts the first prospective juror, with characteristics $H$, then the prosecution will also accept him and will use its challenge on the second juror, with characteristics $M$, to obtain an optimal jury of type $H L$, which the defense does not like. Consequently, the defense will challenge the first juror, and the outcome will be a jury of type $M L$.

Next suppose that $a=0$ and $b=2$. In this case, the defense will not use either of its challenges, and the outcome will be a jury of type $H M$. Hence, the outcome for the prosecution is better with $a=0$ and $b=2$ than with $a=1$ and $b=1$. In this bizarre circumstance then, the prosecution would, if it could, give its challenge to the defense, contradicting regularity.

We do not have a good characterization of when regularity obtains. Even in the special case studied in Roth, Kadane and DeGroot [9], we do not know if regularity must always hold. Checking the conditions for regularity in a given problem is typically difficult. However there are two important and broad classes of problems which are regular, as shown in

Theorems 2 and 3 which follow. In the first of these classes, the utility functions of the two sides are diametrically opposed, and they agree on the joint probability distribution of the sequence of prospective jurors. In this case, we have the following theorem:

Theorem 2. Suppose that both sides assign the same joint distribution to the sequence $X_{1}, \cdots, X_{J+A+B}$. Suppose also that there exist constants $a_{1}, a_{2}$, and $c$, with $a_{1} a_{2}>0$, such that

$$
\begin{equation*}
a_{1} \psi_{1}\left(y_{1}, \cdots, y_{J}\right)+a_{2} \psi_{2}\left(y_{1}, \cdots, y_{J}\right)=c \tag{1}
\end{equation*}
$$

for all possible values of $y_{1}, \cdots, y_{J}$. Then the problem is regular.
Proof. Since utility functions are defined only up to an arbitrary increasing linear transformation, we can assume without loss of generality that $a_{1}=a_{2}=1$ and $c=0$. In this proof we shall be considering strategies for each side other than the optimal ones, so we shall extend our notation to indicate explicitly the strategies being used. Also, since both sides are using the same probability distribution, we shall delete the subscript on the expectation symbol. Thus, we write $E\left(\psi_{i} \mid h_{k}, a, b, j, s_{1}, s_{2}\right)$ to mean the expected utility of the situation to side $i$ after history $h_{k}$ is observed and before the next juror is drawn, when $a$ challenges remain to the prosecution and $b$ to the defense, $j$ jurors remain to be chosen, and the prosecution follows strategy $s_{1}$ and the defense follows $s_{2}$.

Consider now the situation just described, and suppose that the defense adopts the following strategy $s_{d}$ : At any stage of the process where the prosecution has $a^{*}$ challenges remaining, the defense has $b^{*}$, and $j^{*}$ jurors remain to be seated, the defense makes the decision that would be optimal if the stage were $\left(a^{*}+1, b^{*}-1, j^{*}\right)$ until the first time, if ever, that a stage of the form $\left(0, b^{*}, j^{*}\right)$, with $b^{*} \geq 1$, is reached and the next prospective juror is such that, if the stage were ( $1, b^{*}-1, j^{*}$ ), it would be optimal for the prosecution to challenge him. (In other words if the prosecution went first it would be optimal for it to challenge the candidate, and if the defense went first it would be optimal for the defense to accept and the prosecution to challenge.) At such a stage, the defense challenges, and then simply follows its true optimal strategy for the remainder of the process.

Suppose that the prosecution's optimal strategy at $\left(a^{*}, b^{*}, j^{*}\right)$ is $s_{p}{ }^{*}$. Then since $s_{d}$ is not necessarily optimal, we have

$$
E\left(\psi_{2} \mid h_{k}, a, b, j, s_{p}^{*}, s_{d}^{*}\right) \geq E\left(\psi_{2} \mid h_{k}, a, b, j, s_{p}^{*}, s_{d}\right)
$$

where $s_{d}{ }^{*}$ is the defense's optimal strategy. Now let $s_{p}$ be the strategy for the prosecution that maximizes its expected utility when the defense uses $s_{d}$, so that

$$
\begin{aligned}
E\left(\psi_{1} \mid h_{k}, a, b, j, s_{p}, s_{d}\right) & \geq E\left(\psi_{1} \mid h_{k}, a, b, j, s_{p}^{*}, s_{d}\right) \\
& \geq E\left(\psi_{1} \mid h_{k}, a, b, j, s_{p}^{*}, s_{d}^{*}\right) .
\end{aligned}
$$

But when the prosecution and defense use the strategies $s_{p}$ and $s_{d}$, they will obtain exactly the same jury as if they had used their optimal strategies at ( $a+1, b-1$ ), since in effect the defense has reserved one of its challenges for the use of the prosecution should the prosecution exhaust all of its $a$ challenges and need an extra one. Even if the prosecution does not exhaust all of its $a$ challenges, the defense will not use the reserved challenge. The prosecution makes full use of its awareness of this policy in determining its own strategy. Hence,

$$
\begin{aligned}
E\left(\psi_{1} \mid h_{k}, a+1, b-1, j\right) & =E\left(\psi_{1} \mid h_{k}, a, b, j, s_{p}, s_{d}\right) \\
& \geq E\left(\psi_{1} \mid h_{k}, a, b, j\right) \\
E\left(\psi_{2} \mid h_{k}, a+1, b-1, j\right) & =E\left(\psi_{2} \mid h_{k}, a, b, j, s_{p}, s_{d}\right) \\
& \leq E\left(\psi_{2} \mid h_{k}, a, b, j\right) .
\end{aligned}
$$

and

Theorem 2 pertains only to problems in which the jury selection process is, in effect, a zero-sum game, and it says nothing about regularity when the interests of the two sides are not directly opposed. However, the next result applies to all utility functions $\psi_{i}$ and all possible probability distributions that might be used by either side when only one juror is to be chosen. Since $j=1$ throughout this theorem, it is suppressed from our notation.

Theorem 3. When $J=1$, every problem is regular; i.e.,

$$
\begin{array}{ll} 
& E_{1}\left(\psi_{1} \mid h_{k}, a+1, b\right) \geq E_{1}\left(\psi_{1} \mid h_{k}, a, b+1\right) \\
\text { and } & E_{2}\left(\psi_{2} \mid h_{k}, a+1, b\right) \leq E_{2}\left(\psi_{2} \mid h_{k}, a, b+1\right)
\end{array}
$$

for all nonnegative integers $a$ and $b$ and all histories $h_{k}$.
Proof. We proceed by induction on the value of $a+b$. Suppose first that $a+b=0$; i.e., $a=b=0$. We know that in this case $E_{1}\left(\psi_{1} \mid h_{k}, 1,0\right)$ $\geq E_{1}\left(\psi_{1} \mid h_{k}, 0,1\right)$, since $E\left(\psi_{1} \mid h_{k}, 1,0\right)$ is the maximum value of $E_{1}\left(\psi_{1}\right)$ that can be obtained when there is only one challenge available to the two sides. Similarly,

$$
E_{2}\left(\psi_{2} \mid h_{k}, 1,0\right) \leq E_{2}\left(\psi_{2} \mid h_{k}, 0,1\right)
$$

Now suppose that the relations (2) hold for all histories $h_{k}$ when $a+b$ $=n$, where $n$ is some nonnegative integer. We shall prove that (2) holds when $a+b=n+1$.

To be specific, suppose that the prosecution must decide first on the
first prospective juror, and consider the following nine conceivable pairs of optimal decisions in the two problems $(a+1, b)$ and $(a, b+1)$, depending on the value $x$ of the first prospective juror and the history $h_{k}$ :

| Optimal decisions in $(a+1, b)$ | Optimal decisions in $(a, b+1)$ |
| :--- | :--- |
| 1) Accept by both sides | Accept by both sides |
| 2) Accept by both sides | Challenge by prosecution |
| 3) Accept by both sides | Accept by prosecution, challenge by |
| defense |  |

We shall now calculate the differences

$$
\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k}, a+1, b\right)-E_{1}\left(\psi_{1} \mid h_{k}, a, b+1\right)
$$

and

$$
\Delta_{2}=E_{2}\left(\psi_{2} \mid h_{k}, a+1, b\right)-E_{2}\left(\psi_{2} \mid h_{k}, a, b+1\right)
$$

in each of these nine cases; i.e., conditionally on $x$ lying in each of these nine regions.

1) In this case
and

$$
\begin{aligned}
& \Delta_{1}=\psi_{1}(x)-\psi_{1}(x)=0 \\
& \Delta_{2}=\psi_{2}(x)-\psi_{2}(x)=0 .
\end{aligned}
$$

2) The decisions under $(a, b+1)$ imply, by the induction hypothesis, that the defense would have accepted the juror with characteristics $x$ in $(a, b+1)$ if the prosecution had accepted. Therefore, $E_{1}\left(\psi_{1} \mid h_{k+1}, a-1\right.$, $b+1)>\psi_{1}(x)$ where $h_{k+1}$ is the history [ $\left.h_{k}, x^{c}\right]$. Since both sides accept in the $(a+1, b)$ case, $\psi_{1}(x)>E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right)$. But these inequalities violate the induction hypothesis. Hence, this case is impossible.
3) Here $\Delta_{1}=\psi_{1}(x)-E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right) \geq 0$, since this is why it is optimal for prosecution to accept the juror with characteristics $x$ under ( $a+1, b$ ). Also, $\Delta_{2}=\psi_{2}(x)-E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right) \leq 0$, since this is why the defense challenges under $(a, b+1)$.
4) Here $\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right)-\psi_{1}(x) \geq 0$, since this is why the prosecution challenges under $(a+1, b)$. Also, $\Delta_{2}=E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right)-$ $\psi_{2}(x) \leq 0$, since this is why the defense accepts under $(a, b+1)$.
5) Here $\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right)-E_{1}\left(\psi_{1} \mid h_{k+1}, a-1, b+1\right) \geq 0$ and $\Delta_{2}$ $=E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right)-E_{2}\left(\psi_{2} \mid h_{k+1}, a-1, b+1\right) \leq 0$, by induction.
6) Here $\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right)-E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right)=0$ and $\Delta_{2}=$ $E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right)-E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right)=0$.
7) Since the defense challenges under $(a+1, b)$, then

$$
E_{2}\left(\psi_{2} \mid h_{k+1}, a+1, b-1\right)>\psi_{2}(x)
$$

But the defense accepts under $(a, b+1)$, which means that

$$
E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right) \leq \psi_{2}(x)
$$

These inequalities violate the induction hypothesis. Hence, this case is impossible.
8) Here $\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k+1}, a+1, b-1\right)-E_{1}\left(\psi_{1} \mid h_{k+1}, a-1, b+1\right) \geq 0$, by the induction hypothesis applied twice. Also, $\Delta_{2}=E_{2}\left(\psi_{2} \mid h_{k+1}, a+1\right.$, $b-1)-E_{2}\left(\psi_{2} \mid h_{k+1}, a-1, b+1\right) \leq 0$.


Figure 1. Game tree of decisions for $J=1$.
9) Here $\Delta_{1}=E_{1}\left(\psi_{1} \mid h_{k+1}, a+1, b-1\right)-E_{1}\left(\psi_{1} \mid h_{k+1}, a, b\right) \geq 0$ and $\Delta_{2}$ $=E_{2}\left(\psi_{2} \mid h_{k+1}, a+1, b-1\right)-E_{2}\left(\psi_{2} \mid h_{k+1}, a, b\right) \leq 0$, by induction.

A similar breakdown can be given if the defense must decide first. Thus, in all possible cases, the relations (2) are satisfied.

The decision process in the proof of Theorem 3 can be represented by the game tree in Figure 1.

## 4. THE ADVANTAGE OF GOING FIRST

In this section we show that in a regular problem it is never disadvantageous to go first and that in an important class of problems it is irrelevant which side goes first. We begin by establishing the special conditions that are needed in order for it to be strictly advantageous to go second.

Theorem 4. For any given $h_{k}, x, a, b$, and $j$ it is strictly advantageous for side $i$ to go second for the juror with characteristics $x$ if and only if

$$
G_{i}>F_{i}>C_{i} \quad \text { and } \quad C_{3-i} \geq F_{3-i} \geq G_{3-i}
$$

Proof. Let $\Delta$ be the expected utility of going first minus the expected utility of going second. By Theorem 1,
$\Delta=\left\{\begin{array}{c}G_{i}-F_{i} \quad \text { if } \quad G_{i} \geq F_{i}>C_{i} \quad \text { and } \quad G_{3-i} \geq F_{3-i}>C_{3-i}, \\ F_{i}-G_{i} \quad \text { if } \quad F_{i}>C_{i}, F_{i}>G_{i}, F_{3-i}>C_{3-i}, \\ \text { and } \quad F_{3-i}>G_{3-i}, \\ F_{i}-G_{i} \\ \text { if } \quad C_{i}>F_{i}>G_{i} \quad \text { and } \quad F_{3-i}>C_{3-i}, \\ F_{i}-G_{i} \\ \text { if } \quad F_{i}>C_{i} \quad \text { and } \quad C_{3-i} \geq F_{3-i}>G_{3-i}, \\ 0 \text { otherwise. }\end{array}\right.$
Only in (6) might $\Delta$ be negative. Thus $\Delta<0$ if and only if $G_{i}>F_{i}>C_{i}$ and $C_{3-i} \geq F_{3-i}>G_{3-i}$.
Corollary. In a regular problem,

$$
\Delta=\left\{\begin{array}{l}
G_{i}-F_{i} \text { if } F_{i}>C_{i} \text { and } F_{3-i}>C_{3-i} \\
0 \text { otherwise },
\end{array}\right.
$$

and it is never disadvantageous to go first.
Proof. Regularity (i.e., $G_{i} \geq F_{i}$ and $G_{3-i} \geq F_{3-i}$ ) eliminates (4), (5), and (6), and reduces (3) as shown.

The expression for $\Delta$ in the Corollary has a natural interpretation. If $F_{i}$ $>C_{i}$ and $F_{3-i}>C_{3-i}$, then each side prefers challenging the prospective juror to letting him be seated on the jury. Consequently, whichever side goes first can accept the juror, confident that the side going second must challenge. This yields a gain of $G_{i}-F_{i}$ to the side that goes first, which is how much that side prefers the other side to exercise a challenge compared with exercising a challenge itself. In all other cases, where at least one side would prefer seating the juror to challenging him, the order of challenges is irrelevant, and there is no gain in going first.

Theorem 4 leaves open the question of whether there could be a problem that was not regular in which it was actually advantageous to go second. The next example presents such a problem.

Example 2. Suppose as in Example 1 that $J=2$. Suppose now, however, that there are four kinds of jurors denoted $S, H, M$ and $L$, and that the sequence of the appearance of the first five prospective jurors is known by both sides with certainty to be $S, H, M, L, L$. Suppose also that the preferences of each side are given by the relations

$$
\psi_{1}(S H)=\psi_{1}(S M)=\psi_{1}(S L)>\psi_{1}(H L)>\psi_{1}(H M)>\psi_{1}(M L)>\psi_{1}(L L)
$$

and

$$
\psi_{2}(H M)>\psi_{2}(L L)>\psi_{2}(M L)>\psi_{2}(H L)>\psi_{2}(S H)=\psi_{2}(S M)=\psi_{2}(S L)
$$

Now suppose that $a=1$ and $b=2$. If the defense goes first, and accepts, the prosecution will also accept, which is bad for the defense. Thus the defense will challenge, which leads to a situation with $a=1$ and $b=1$. By Example 1, the outcome will be a jury of type ML.

If the prosecution goes first, it sees that the defense will challenge. However, it was shown in Example 1 that the prosecution would prefer to use a challenge itself rather than have the defense use a challenge. Consequently, the prosecution will challenge, which leads to a situation with $a=0$, and $b=2$. By Example 1, the outcome will be a jury of type $H M$. Hence, the defense prefers to go second in this situation.

It is interesting to note that, in Example 2, it is optimal for the prosecution, going first, to challenge $S$ even though it prefers any jury containing $S$ to any jury without $S$.

The next result shows that when the prosecution and defense use the same probability distributions and have either exactly the same utilities or diametrically opposed utilities, neither side cares who goes first. Thus, it is only when their interests are partially coincident and partially opposed, as must typically be the case, that it matters who goes first.

Theorem 5. Suppose that both sides assign the same joint distribution to $X_{1}, \cdots, X_{J+A+B}$. Suppose also that there exist constants $a_{1}, a_{2}$ and $c$, with $a_{1} a_{2} \neq 0$, such that (1) holds for every value of $y_{1}, \cdots, y_{J}$. Then the order in which the two sides exercise their challenges is irrelevant to both of them.

Proof. As in Theorem 2, we may, without loss of generality, take $\psi_{1}=$ $\pm \psi_{2}$.
If $\psi_{1}=-\psi_{2}$, then by Theorem 2 the problem is regular. Consequently by Corollary 1 , the only case to be concerned with is that in which $F_{i}>$ $C_{i}$ and $F_{3-i}>C_{3-i}$. But since $\psi_{1}=-\psi_{2}$, it follows that $F_{i}=-G_{3-i}$ and $C_{i}$ $=-C_{3-i}$. Thus, by regularity, $F_{i}>C_{i}$ implies that $C_{3-i}>G_{3-i} \geq F_{3-i}$. Hence the only case in which $\Delta>0$ in Corollary 1 cannot occur here, so $\Delta=0$ and the order is irrelevant.

If $\psi_{1}=\psi_{2}$, then $F_{i}=G_{3-i}$ and $C_{i}=C_{3-i}$. Substituting these values into the expressions given in Theorem 1 for the expected utility of going first and of going second, we find that they both reduce to $\operatorname{Max}\left(F_{i}, G_{i}, C_{i}\right)$. Consequently $\Delta=0$ and again the order is irrelevant.

## 5. OTHER SEQUENTIAL PROCEDURES

There are a variety of other sequential processes by which peremptory challenges are exercised. In one system, called the group system, prospective jurors are examined for qualifications and possible excusal for cause until a full jury of $J$ persons is found. The two sides are then invited
to challenge peremptorily, the jury is refilled, and this process continues until no more peremptory challenges are exercised either because the jury is satisfactory or because the dissatisfied side has run out of peremptory challenges. A second system, called the struck jury system, has the judge examine prospective jurors until $J+A+B$ of them have been found qualified and not been excused for cause. Then the two sides use their peremptory challenges in a fixed order. Some preliminary work on the group and struck jury system was done by Brams and Davis [1, 2]. Below we give a class of sequential procedures that includes the one-byone system of Sections 1 through 5, the group system and the struck jury system.

Assume that prospective jurors are interviewed in groups of size $T$. First one side states which, if any, of the $T$ prospective jurors it wishes to challenge. If it does not wish to challenge any of them, it passes. After the first side has stated its decision, the other side must state whether it wishes to pass or to challenge one or more of the remaining jurors. If at least one side exercises peremptory challenges, new prospective jurors (if there are any of the $J+A+B$ left who are not already being considered) join the group, and the process is repeated. If both sides pass, all $T$ jurors are accepted and join the jury. If the jury has $J$ or more jurors on it with the addition of these $T$, the first $J$ jurors to be accepted constitute the jury, and the process stops. If, after the addition of the $T$ jurors the jury still does not have $J$ jurors, a new group of size $T$ (or all the $J+A+B$ jurors that have not been considered, if they are fewer than $T$ ) is formed and the process is repeated.

When $T=1$, this model specializes to the one-by-one case considered in Sections 1 to 5 of this paper. When $T=J$, this model is the group system, and when $T=J+A+B$, this model is the struck jury system. We understand that $T=4$ is used by certain courts in Illinois.

Example 3. It is natural to hope that irregularity can occur only when $T=1$, since it happens that if $T>1$, Example 1 is regular. However if the order of appearance of the jurors is changed to $H, L, L, M$, the following argument shows that this problem is irregular for all the special cases mentioned above.

Suppose $a=b=T=1$. If the defense goes first and accepts the first juror $H$, then the prosecution can accept him also and by not using any challenges force an $H L$ jury, the prosecution's first choice. Since this is the defense's last choice, he challenges $H$. Now the prosecution challenges one juror with characteristic $L$ to produce an $L M$ jury, the best he can do after $H$ is challenged.

Next suppose $a=0, b=2$, and $T=1$. In this case the defense has complete control, and will challenge both jurors with characteristic $L$, leading to an $H M$ jury. Since this is better for the prosecution than the
$L M$ jury that was the consequence of $a=1, b=1$, regularity is contradicted.

Now suppose $T=2$. In the $a=b=1$ case, this gives the defense another choice, namely to challenge the first juror with characteristic $L$. But this would allow the prosecution to pass on the next round and force an $H L$ jury, to the defense's disadvantage. Consequently, the defense continues to challenge $H$, and the outcome is an $L M$ jury. Since the case $a=0, b=2$ is unchanged, regularity continues to be contradicted.

Similarly it is easy to see that the cases $T=3$ and $T=4$ continue to lead to an $L M$ jury when $a=b=1$ and an $H M$ jury when $a=0$ and $b$ $=2$. Thus regularity fails for all possible values of $T$ in this example.

Consequently regularity is not a general theorem for the group system, the struck jury system, or the Illinois $T=4$ system, just as it was not for the one-by-one system. It can be shown, however, that Theorem 2 applies to this more general class of problems.

Finally, we observe the following generalization of Example 2.
Example 4. For $T=1$, Example 2 (where $J=2, A=1$ and $B=2$ ) gives a case in which the defense prefers to go second. A simple calculation shows that for $T>1$, the defense is indifferent whether it goes first or second. Thus, Example 2 leaves open the question of whether, for $T>1$ it might never be advantageous to go second.

Return, however, to Example 3, with $A=B=1$, and $T=4$. If the prosecution goes first, it can do one of four things: challenge $H$, leading to an $L L$ jury; challenge $L$, leading to an $H M$ jury; challenge $M$, leading to an $L L$ jury again, or pass. Faced with a pass, the defense has four options again: challenge $H$, which leads to an $L M$ jury; or challenge $L$ or $M$ or pass, all of which lead to an $H L$ jury. Since the defense prefers $L M$ to $H L$, it would challenge $H$ here. Consequently the prosecution's best strategy is to challenge $L$, and the result is an $H M$ jury.

Now suppose, however, that the defense goes first. To challenge $H$ leads to an $L M$ jury; to challenge $L$ or $M$, or to pass, all lead to an $H L$ jury. Consequently the defense would challenge $H$, and the result is an $L M$ jury.

Thus the defense again prefers going second in this case.
Since the choices that make this example work are always first or second, the same results are obtained if $T=2$ or 3 as well, as can be checked directly. However when $T=1$, there is no advantage to going second for the defense.

The combination of Examples 2 and 4 shows, however, that for the one-by-one system, the group system and the struck jury system, there are situations in which it is advantageous to go second.

## 6. SUMMARY

We have shown in the one-by-one case that in a regular problem, it is never disadvantageous to go first. We have shown also, that if the two sides assign the same joint distribution to prospective jurors and have diametrically opposed utilities then the problem is regular. In this particular type of problem, the two sides never want to challenge the same prospective juror, so it does not matter which side goes first. We have also shown that any problem in which only one juror is to be chosen must be regular.

Examples were given to establish that there are problems that are not regular and in which it is advantageous to go second. The model, and these examples were extended to a more general class of sequential problems that includes the group system and the struck jury system.

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## REFERENCES

1. S. J. Brams and M. D. Davis, "A Game-Theory Approach to Jury Selection," Trial 12, 47-49 (1976).
$\rightarrow$ S. J. Brams and M. D. Davis, "Optimal Jury Selection: A Game-Theoretic Model for the Exercise of Peremptory Challenges," Opns. Res. 26, 966-991 (1978).
2. A. Cayley "Mathematical Questions and Their Solutions," Educational Times 22, 18-19 (1875).
$\rightarrow$ R. M. Cyert and M. H. DeGroot, "Multiperiod Decision Models with Alternating Choice as a Solution to the Duopoly Problem," Quart. J. Econ. 84, 410-429 (1970).
3. R. M. Cyert and M. H. DeGroot, "An Analysis of Cooperation and Learning in a Duopoly Context," Am. Econ. Rev. 63, 24-37 (1973).
4. M. H. DeGroot, Optimal Statistical Decisions, McGraw-Hill, New York, 1970.
$\rightarrow$ J. P. Gilbert and F. Mosteller, "Recognizing the Maximum of a Sequence," J. Am. Statist. Assoc. 61, 35-73 (1966).
5. J. B. Kadane, "Reversibility of a Multilateral Sequential Game: Proof of a Conjecture of Sakaguchi," J. Opns. Res. Soc. Jpn. 21, 509-515 (1978).
6. A. Roth, J. B. Kadane and M. H. DeGroot, "Optimal Peremptory Challenges in Trials by Juries: A Bilateral Sequential Process," Opns. Res. 25, 901-919 (1977).
7. M. Sakaguchi, "A Bilateral Sequential Game for Sums of Bivariate Random Variables," J. Opns. Res. Soc. Jpn. 21, 486-507 (1978).
