

EVALUATING BETTING ODDS AND FREE COUPONS USING DESIRABILITY

NAWAPON NAKHARUTAI, CAMILA C. S. CAIADO, AND MATTHIAS C. M. TROFFAES

ABSTRACT. In the UK betting market, bookmakers often offer a free coupon to new customers. These free coupons allow the customer to place extra bets, at lower risk, in combination with the usual betting odds. We are interested in whether a customer can exploit these free coupons in order to make a sure gain, and if so, how the customer can achieve this. To answer this question, we evaluate the odds and free coupons as a set of desirable gambles for the bookmaker.

We show that we can use the Choquet integral to check whether this set of desirable gambles incurs sure loss for the bookmaker, and hence, results in a sure gain for the customer. In the latter case, we also show how a customer can determine the combination of bets that make the best possible gain, based on complementary slackness.

As an illustration, we look at some actual betting odds in the market and find that, without free coupons, the set of desirable gambles derived from those odds avoids sure loss. However, with free coupons, we identify some combinations of bets that customers could place in order to make a guaranteed gain.

1. INTRODUCTION

Consider the football betting market in the UK where a bookmaker typically offers fractional betting odds for possible outcomes. For example, in a match between Manchester United and Liverpool, the bookmaker offers odds in the form a/b for Manchester United winning, c/d for a draw and e/f for Liverpool winning. Suppose a customer accepts the odds a/b by placing a stake of b pounds on a Manchester United win, which he pays to the bookmaker in advance of the match. After the match, if Manchester United wins, the bookmaker will pay him $a + b$ pounds. So, if Manchester United wins, then the customer's total return will be a pounds; otherwise the customer will lose b pounds.

To predict the outcome of a match, the bookmaker may encounter difficulties such as lack of data (e.g. team A has never played with team B during last five years), missing data, limited football expert opinion, or even contradicting information from different football experts. Various authors [14, 15, 13, 10] have argued that these issues can be handled by using *sets of desirable gambles*. A gamble represents a reward (i.e. money in our case) that depends on an uncertain outcome (i.e. the match result). The bookmaker can model his belief about this outcome by stating a collection of gambles that he is willing to offer. Such set is called a set of desirable gambles. Through duality, stating a set of desirable gambles is mathematically equivalent to stating a set of probability distributions.

Key words and phrases. betting; coupon; Choquet integration; complementary slackness.

If there are no combinations of desirable gambles that result in a guaranteed loss, then we say that a set of desirable gambles *avoids sure loss* [14, 15]. Thus, if the bookmaker’s set of desirable gambles avoids sure loss, then there is no combination of bets from which customers can make a guaranteed gain. On the other hand, if the set does not avoid sure loss, then there is a combination of bets that customers can exploit to incur a sure gain.

In addition to avoiding sure loss, the bookmakers also want to entice new customers. There are several techniques that bookmakers can use to persuade customers to bet with their companies. Some bookmakers may offer greater betting odds than others since greater odds means a greater payoff to the customers. Another technique is to offer a “free coupon”, which is a stake that customers can spend on betting. The free coupon can also be viewed as part of a desirable gamble.

However, bookmakers may worry that customers will find a combination of different odds and free coupons that they can bet on and make a guaranteed profit. Therefore, from the bookmaker’s perspective, they would like to check whether sets of desirable gambles derived from different odds and free coupons avoid sure loss or not. Conversely, in theory, a customer may be interested in the case where the bookmaker’s set does not avoid sure loss, because then the customer can make a guaranteed profit. In that case, a customer may want to find the combination of bets which results in the best possible sure gain.

There are several studies on exploiting betting odds and free bets in order to find strategies that make a profit. For example, Walley [13, Appendix I] and Quaeghebeur et al. [7] study an application of sets of desirable gambles on sports; Milliner et al. [5], Schervish et al. [9], Vlastakis et al. [12] exploit betting odds directly, whilst Emiliano [2] takes free bets into account. Emiliano considers the case of only two possible outcomes, and allows cooperation between customers. In this paper, we look at any finite number of possible outcomes, but we only consider a single customer. We evaluate betting odds and free coupons and check whether a set of desirable gambles derived from odds and free coupons avoids sure loss (or not) via the natural extension. If the set does not avoid sure loss, then we show exactly how a customer can incur a sure gain.

In general, one can check avoiding sure loss by solving a linear programming problem [13, p. 151]. In our previous work [6], we provided efficient algorithms for solving these linear programming problems. For our specific problem, we show that we can calculate the natural extension through the Choquet integral, or through solving a linear programming problem where the optimal value is equal to the natural extension. In the case of not avoiding sure loss, we know that we can find a strategy that the customer can bet on to make a guaranteed gain. We show that this strategy can be identified using the Choquet integral and complementary slackness conditions. Our method for finding this strategy is generally applicable not just to this betting problem, but to arbitrary problems involving upper probability mass functions. Specifically, by using the Choquet integral and exploiting complementary slackness conditions, we can find optimal solutions of the corresponding pair of dual linear programming programs without directly solving them.

The paper is organised as follows. Section 2 briefly reviews the main concepts behind desirability, avoiding sure loss and natural extension. We also discuss the Choquet integral which can be used to calculate the natural extension. In section 3,

we introduce fractional fixed odds and explain how betting odds work. As betting odds can be viewed as a set of desirable gambles, we revisit a simple known algorithm to check whether such set avoids sure loss or not. In section 4, we discuss free coupons from the perspective of desirability. We show how we can check whether the problem with free coupons avoids sure loss or not, by means of the natural extension. We demonstrate how we can use the Choquet integral to calculate this natural extension. Next, we exploit complementary slackness to find a combination of bets which makes the best possible guaranteed gain. To illustrate our results, in section 5, we consider some actual betting odds and free coupons in the market, and provide an example where a customer can make a sure gain with a free coupon. Section 6 concludes this paper.

2. AVOIDING SURE LOSS AND NATURAL EXTENSION

In this section, we will briefly discuss desirability, avoiding sure loss and natural extension. We will also explain the Choquet integral which can be used to calculate the natural extension in the case considered in this paper. The material in this section will be useful later when we view betting odds and free coupons as a set of desirable gambles and when we want to check whether this set avoids sure loss or not.

2.1. Avoiding sure loss. Let Ω be a finite set of uncertain outcomes. A *gamble* is a bounded real-valued function on Ω . Let $\mathcal{L}(\Omega)$ denote the set of all gambles on Ω . Let \mathcal{D} be a finite set of gambles that a subject deems acceptable; we call \mathcal{D} the subject's *set of desirable gambles*. Rationality conditions for desirability have been proposed as follows [10, p. 29]:

Axiom 1 (Rationality axioms for desirability). *For every f and g in $\mathcal{L}(\Omega)$ and every non-negative $\alpha \in \mathbb{R}$, we have that:*

- (D1) *If $f \leq 0$ and $f \neq 0$, then f is not desirable.*
- (D2) *If $f \geq 0$, then f is desirable.*
- (D3) *If f is desirable, then so is αf .*
- (D4) *If f and g are desirable, then so is $f + g$.*

The first two axioms are trivial as the subject should accept any gamble that he cannot lose from, but he should not accept any gamble that he cannot win from. Axiom (D3) follows the linearity of the utility scale and axiom (D4) shows that a combination of desirable gambles should also be desirable.

We do not assume that any set \mathcal{D} , specified by the subject, satisfies these axioms. However, we can use these axioms to examine the rationality of \mathcal{D} . Indeed, the rationality axioms essentially state that a non-negative combination of desirable gambles should not produce a sure loss [10, p. 30]. In that case, we say that \mathcal{D} avoids sure loss.

Definition 1. [10, p. 32] *A set $\mathcal{D} \subseteq \mathcal{L}(\Omega)$ is said to avoid sure loss if for all $n \in \mathbb{N}$, all $\lambda_1, \dots, \lambda_n \geq 0$, and all $f_1, \dots, f_n \in \mathcal{D}$,*

$$(1) \quad \max_{\omega \in \Omega} \left(\sum_{i=1}^n \lambda_i f_i(\omega) \right) \geq 0.$$

Note that the rationality axioms for desirability are stronger than the condition of avoiding sure loss [10, p. 32].

We can also model uncertainty via acceptable buying (or selling) prices for gambles. A *lower prevision* \underline{P} is a real-valued function defined on some subset of $\mathcal{L}(\Omega)$. We denote the domain of \underline{P} by $\text{dom } \underline{P}$. Given a gamble $f \in \text{dom } \underline{P}$, we interpret $\underline{P}(f)$ as a subject's supremum buying price for f , i.e. $f - \alpha$ is deemed desirable for all $\alpha < \underline{P}(f)$ [10, p. 40].

Definition 2. [10, p. 42] A lower prevision \underline{P} is said to avoid sure loss if for all $n \in \mathbb{N}$, all $\lambda_1, \dots, \lambda_n \geq 0$, and all $f_1, \dots, f_n \in \text{dom } \underline{P}$,

$$(2) \quad \max_{\omega \in \Omega} \left(\sum_{i=1}^n \lambda_i [f_i(\omega) - \underline{P}(f_i)] \right) \geq 0.$$

Any lower prevision \underline{P} induces a *conjugate upper prevision* \bar{P} on $-\text{dom } \underline{P} := \{-f : f \in \text{dom } \underline{P}\}$, defined by $\bar{P}(f) := -\underline{P}(-f)$ for all $f \in -\text{dom } \underline{P}$. $\bar{P}(f)$ represents a subject's infimum selling price for f [10, p. 41].

Next, let A denote a subset of Ω , also called an *event*. Its associated *indicator function* I_A is given by

$$(3) \quad \forall \omega \in \Omega: I_A(\omega) := \begin{cases} 1 & \text{if } \omega \in A \\ 0 & \text{otherwise.} \end{cases}$$

Further in the paper, we will also extensively use *upper probability mass functions*. An upper probability mass function \bar{p} is a mapping from Ω to $[0, 1]$, and represents the following lower prevision [10, p. 123]:

$$(4) \quad \forall \omega \in \Omega: \underline{P}_{\bar{p}}(-I_{\{\omega\}}) := -\bar{p}(\omega),$$

where $\text{dom } \underline{P}_{\bar{p}} = \bigcup_{\omega \in \Omega} \{-I_{\{\omega\}}\}$. We can check whether $\underline{P}_{\bar{p}}$ avoids sure loss by theorem 1.

Theorem 1. [10, p. 124] $\underline{P}_{\bar{p}}$ avoids sure loss if and only if $\sum_{\omega \in \Omega} \bar{p}(\omega) \geq 1$.

Proof. See [10, p. 124, Prop. 7.2] with lower probability mass function $\underline{p} = 0$. \square

We can interpret an upper probability mass function as providing an upper bound on the probability of each $\{\omega\}$, for all $\omega \in \Omega$ [10, p. 123].

2.2. Natural extension. The natural extension of a set of desirable gambles \mathcal{D} is defined as the smallest set of gambles which includes all finite non-negative combinations of gambles in \mathcal{D} and all non-negative gambles [10, § 3.7]:

Definition 3. [10, p. 32] The natural extension of a set $\mathcal{D} \subseteq \mathcal{L}(\Omega)$ is:

$$(5) \quad \mathcal{E}_{\mathcal{D}} := \left\{ g_0 + \sum_{i=1}^n \lambda_i g_i : g_0 \geq 0, n \in \mathbb{N}, g_1, \dots, g_n \in \mathcal{D}, \lambda_1, \dots, \lambda_n \geq 0 \right\}.$$

From this natural extension, we can derive a supremum buying price for any gamble f .

Definition 4. [10, p. 46] For any set $\mathcal{D} \subseteq \mathcal{L}(\Omega)$ and $f \in \mathcal{L}(\Omega)$, we define:

$$(6) \quad \underline{E}_{\mathcal{D}}(f) := \sup \{ \alpha \in \mathbb{R} : f - \alpha \in \mathcal{E}_{\mathcal{D}} \}$$

$$(7) \quad = \sup \left\{ \alpha \in \mathbb{R} : f - \alpha \geq \sum_{i=1}^n \lambda_i f_i, n \in \mathbb{N}, f_i \in \mathcal{D}, \lambda_i \geq 0 \right\}.$$

Note that $\underline{E}_{\mathcal{D}}$ is finite, and hence, is a lower prevision, if and only if \mathcal{D} avoids sure loss [10, p. 68].

We denote the conjugate of $\underline{E}_{\mathcal{D}}$ by $\overline{E}_{\mathcal{D}}$ which is defined by

$$(8) \quad \overline{E}_{\mathcal{D}}(f) := -\underline{E}_{\mathcal{D}}(-f) = \inf \left\{ \beta \in \mathbb{R} : \beta - f \geq \sum_{i=1}^n \lambda_i f_i, n \in \mathbb{N}, f_i \in \mathcal{D}, \lambda_i \geq 0 \right\}.$$

for all f in $\mathcal{L}(\Omega)$ [13, p. 124]. $\underline{E}_{\mathcal{D}}$ is simply denoted by \underline{E} when there is no confusion.

Given a lower prevision \underline{P} , we can derive a set of desirable gambles corresponding to \underline{P} as follows [10, p. 42]:

$$(9) \quad \mathcal{D}_{\underline{P}} := \{g - \mu : g \in \text{dom } \underline{P} \text{ and } \mu < \underline{P}(g)\}.$$

Combining definition 4 and eq. (9) together, we can define the natural extension of \underline{P} :

Definition 5. [10, p. 47] *Let \underline{P} be a lower prevision. The natural extension of \underline{P} is defined for all $f \in \mathcal{L}(\Omega)$ by:*

$$(10) \quad \underline{E}_{\underline{P}}(f) := \underline{E}_{\mathcal{D}_{\underline{P}}}(f) \\ = \sup \left\{ \alpha \in \mathbb{R} : f - \alpha \geq \sum_{i=1}^n \lambda_i (f_i - \underline{P}(f_i)), n \in \mathbb{N}, f_i \in \text{dom } \underline{P}, \lambda_i \geq 0 \right\}.$$

Similarly, $\underline{E}_{\underline{P}}$ is finite if and only if \underline{P} avoids sure loss [10, p. 68].

In the next section, we briefly explain the use of the Choquet integral to calculate the natural extension for the type of lower previsions considered in this paper; see [11, 10] for more detail.

2.3. Upper probability mass functions and Choquet integration. Let $\underline{E}_{\overline{p}}$ be the natural extension of $\underline{P}_{\overline{p}}$ that avoids sure loss. Then $\underline{E}_{\overline{p}}$ is 2-monotone and can be computed via the Choquet integral [10, p. 125]. In this section, based on the results from [10, Sec. 7.1], we give a closed form expression for this integral.

For simplicity, we denote the natural extension $\underline{E}_{\overline{p}}(I_A)$ of an indicator I_A as $\underline{E}_{\overline{p}}(A)$. We can use the following theorem to calculate $\underline{E}_{\overline{p}}(A)$.

Theorem 2. [10, p. 125] *Let $\underline{P}_{\overline{p}}$ avoid sure loss. Then for all $A \subseteq \Omega$,*

$$(11) \quad \underline{E}_{\overline{p}}(A) = \max\{0, 1 - U(A^c)\} \quad \text{and} \quad \overline{E}_{\overline{p}}(A) = \min\{U(A), 1\},$$

where $U(A) := \sum_{\omega \in A} \overline{p}(\omega)$.

Proof. See [10, p. 125] with lower probability mass function $\underline{p} = 0$. □

Theorem 3. *Let f be decomposed in terms of its level sets A_i , $i = 0, 1, \dots, n$:*

$$(12) \quad f = \sum_{i=0}^n \lambda_i I_{A_i}$$

where $\lambda_0 \in \mathbb{R}$, $\lambda_1, \dots, \lambda_n > 0$ and $\Omega = A_0 \supseteq A_1 \supseteq \dots \supseteq A_n \neq \emptyset$. Then

$$(13) \quad \underline{E}_{\overline{p}}(f) = \sum_{i=0}^n \lambda_i \underline{E}_{\overline{p}}(A_i).$$

Proof. The right hand side is the Choquet integral [10, p. 379, Eq. (C.8)] and the natural extension $\underline{E}_{\overline{p}}(f)$ is equal to the Choquet integral [10, p. 125, Prop. 7.3(ii)] (with lower probability mass function $\underline{p} = 0$). □

Note that theorem 3 also holds for the upper natural extension.

Corollary 1. *Let f be a gamble decomposed as in eq. (12). Then*

$$(14) \quad \bar{E}_{\bar{P}}(f) = \sum_{i=0}^n \lambda_i \bar{E}_{\bar{P}}(A_i).$$

Proof. See appendix A. □

The Choquet integral will be useful when we want to calculate the natural extension later in section 4.

2.4. Avoiding sure loss with one extra gamble. Let $\mathcal{D} = \{g_1, \dots, g_n\}$ be a set of desirable gambles that avoids sure loss and let f be another desirable gamble. We want to check whether $\mathcal{D} \cup \{f\}$ still avoids sure loss or not. This idea will be used when we want to check avoiding sure loss with a free coupon in section 4.

By the condition of avoiding sure loss in definition 1, $\mathcal{D} \cup \{f\}$ avoids sure loss if and only if for all $\lambda_0 \geq 0$, $n \in \mathbb{N}$, $g_i \in \mathcal{D}$ and $\lambda_1, \dots, \lambda_n \geq 0$,

$$(15) \quad \max_{\omega \in \Omega} \left(\sum_{i=1}^n \lambda_i g_i(\omega) + \lambda_0 f(\omega) \right) \geq 0.$$

We can simplify eq. (15) as follows.

Lemma 1. *Let Ω be a finite set, $\mathcal{D} = \{g_1, \dots, g_n\}$ be a set of desirable gambles that avoids sure loss and f be another desirable gamble. Then, $\mathcal{D} \cup \{f\}$ avoids sure loss if and only if for all $n \in \mathbb{N}$, $g_i \in \mathcal{D}$ and $\lambda_1, \dots, \lambda_n \geq 0$,*

$$(16) \quad \max_{\omega \in \Omega} \left(\sum_{i=1}^n \lambda_i g_i(\omega) + f(\omega) \right) \geq 0.$$

Proof. If $\lambda_0 = 0$ in eq. (15), then eq. (15) is trivially satisfied because \mathcal{D} avoids sure loss. Otherwise $\lambda_0 > 0$, and for all i , $\lambda_i \geq 0$, so $\lambda_i/\lambda_0 \geq 0$. Therefore eq. (15) is equivalent to

$$(17) \quad \max_{\omega \in \Omega} \left(\sum_{i=1}^n \left(\frac{\lambda_i}{\lambda_0} \right) g_i(\omega) + f(\omega) \right) \geq 0.$$

Therefore, $\mathcal{D} \cup \{f\}$ avoids sure loss if and only if eq. (16) holds. □

Next, we give a method not only for checking avoiding sure loss of $\mathcal{D} \cup \{f\}$, but also for bounding the worst case loss, which will be useful later in section 4.

Theorem 4. *Let $f \in \mathcal{L}(\Omega)$ and let $\mathcal{D} = \{g_1, \dots, g_n\}$ be a set of desirable gambles that avoids sure loss. Then, $\mathcal{D} \cup \{f\}$ avoids sure loss if and only if $\bar{E}_{\mathcal{D}}(f) \geq 0$. If $\mathcal{D} \cup \{f\}$ does not avoid sure loss, then there exist $\lambda_1 \geq 0, \dots, \lambda_n \geq 0$ such that $f + \sum_{i=1}^n \lambda_i g_i$, which is a combination of desirable gambles, results in a loss at least $|\bar{E}_{\mathcal{D}}(f)|$.*

Proof. See appendix B. □

Note that by definition 5, theorem 4 can also be applied to $\bar{E}_{\bar{P}}$.

3. BETTING SCHEME

In this section, we explain how fractional betting odds work and look at two scenarios: (i) a customer bets against a bookmaker and (ii) a customer bets against multiple bookmakers. In both cases, we view betting odds as a set of desirable gambles and check whether such a set avoids sure loss or not.

3.1. Betting with one bookmaker. In the UK, a bookmaker usually offers fixed fractional odds on possible outcomes of an event that customers are interested in. For example, in the European Football Championship 2016, customers are interested in the winner of the championship. Suppose that a bookmaker sets odds on France, say $9/2$, and one customer accepts this odds. For every stake £2 that the customer bets on France, he will win £9 plus the return of his stake. So the bookmaker will lose £9 in total. Otherwise, the bookmaker will pay nothing and keep £2. The bookmaker often writes $a/1$ as a .

Given fractional odds a/b , a customer can simply calculate his return as follows. For every amount b that the customer bets, he will either get nothing (in case the bet is lost), or gain a plus the return of his stake (in case the bet is won). As the bookmaker accepts this transaction, the total payoff can be seen as a desirable gamble, say g , to the bookmaker:

$$(18) \quad g(\omega) = \begin{cases} -a & \text{if } \omega = x \\ b & \text{otherwise.} \end{cases}$$

Note that $-g$ is a desirable gamble to the customer, should the customer decide to accept the bookmaker's odds.

Let $\Omega = \{\omega_1, \dots, \omega_n\}$ be a finite set of outcomes. Suppose that for each i , the bookmaker sets betting odds a_i/b_i on ω_i . By eq. (18), these odds can be viewed as a set of desirable gambles $\mathcal{D} = \{g_1, \dots, g_n\}$, where

$$(19) \quad g_i(\omega) := \begin{cases} -a_i & \text{if } \omega = \omega_i \\ b_i & \text{otherwise.} \end{cases}$$

Given odds a_i/b_i on ω_i , suppose that we modify the denominator in this odds to be b_j . To do so, we can multiply a_i/b_i by b_j/b_j to be

$$(20) \quad a_i b_j / b_i b_j = \left(\frac{a_i b_j}{b_i} \right) / b_j.$$

Are new odds still desirable? By the rationality axioms for desirability, the modified odds are still desirable.

Lemma 2. *Let a/b be odds on an outcome $\tilde{\omega}$ that are desirable. Then, for all $\alpha > 0$, the odds $\alpha a / \alpha b$ on $\tilde{\omega}$ are also desirable.*

Proof. Consider the desirable gamble corresponding to the odds a/b :

$$(21) \quad g(\omega) := \begin{cases} -a & \text{if } \omega = \tilde{\omega} \\ b & \text{otherwise.} \end{cases}$$

By rationality axiom (D3), for any $\alpha > 0$, the gamble αg is also desirable. Hence, the corresponding odds $\alpha a / \alpha b$ are also desirable. \square

Lemma 2 will be very useful when we want to modify odds to have the same denominator.

Suppose that the bookmaker specifies betting odds for all possible outcomes in Ω . Before announcing these odds, the bookmaker may want to check whether there is a combination of bets from which the customer can make a sure gain, or in other words, whether he avoids sure loss [13, Appendix 1, I4, p. 635]:

Theorem 5. *Let $\Omega = \{\omega_1, \dots, \omega_n\}$. Suppose a_i/b_i are betting odds on ω_i . For each $i \in \{1, \dots, n\}$, let*

$$(22) \quad g_i(\omega) := \begin{cases} -a_i & \text{if } \omega = \omega_i \\ b_i & \text{otherwise} \end{cases}$$

be the gamble corresponding to the odds a_i/b_i . Then $\mathcal{D} := \{g_1, \dots, g_n\}$ avoids sure loss if and only if

$$(23) \quad \sum_{i=1}^n \frac{b_i}{a_i + b_i} \geq 1.$$

Proof. Theorem 5 follows from theorem 6 (proved further) for $m = 1$. (Note that theorem 5 is not used in the proof of theorem 6.) \square

Note that, in practice, $\sum_{i=1}^n \frac{b_i}{a_i + b_i}$ is normally strictly greater than 1, and

$$(24) \quad 100 \times \left(\sum_{i=1}^n \frac{b_i}{a_i + b_i} - 1 \right)$$

is called the *over-round margin* [2, 12].

Let's see an example of theorem 5.

Example 1. *Suppose that a bookmaker provides betting odds 3/4 for W, 13/5 for D, and 16/5 for L. As*

$$(25) \quad \frac{4}{3+4} + \frac{5}{13+5} + \frac{5}{16+5} = 1.087 \geq 1,$$

by theorem 5, the bookmaker avoids sure loss. Therefore, a customer cannot exploit these odds in order to make a sure gain.

Note that the condition for avoiding sure loss of \mathcal{D} in theorem 5 is exactly the same as the condition for avoiding sure loss of \underline{P}_p in theorem 1. This condition is also equivalent to Proposition 4 in Cortis [1].

Next, we show that those odds can be modelled through an upper probability mass function:

Lemma 3. *Let $\Omega = \{\omega_1, \dots, \omega_n\}$, let $\omega_i \in \Omega$ and let g be the corresponding gamble to the odds on ω_i defined as in eq. (19), that is,*

$$(26) \quad g_i(\omega) := \begin{cases} -a_i & \text{if } \omega = \omega_i \\ b_i & \text{otherwise,} \end{cases}$$

where a_i and b_i are non-negative. If p is a probability mass function, that is, if $\sum_{\omega \in \Omega} p(\omega) = 1$ and $p(\omega) \geq 0$ for all $\omega \in \Omega$, then

$$(27) \quad \sum_{\omega \in \Omega} g_i(\omega)p(\omega) \geq 0 \quad \iff \quad \frac{b_i}{a_i + b_i} \geq p(\omega_i).$$

Proof. Suppose that $\sum_{\omega \in \Omega} p(\omega) = 1$ and for all $i, p(\omega_i) \geq 0$, then

$$(28) \quad \sum_{\omega \in \Omega} g_i(\omega)p(\omega) \geq 0 \iff -a_i p(\omega_i) + b_i \sum_{\omega \neq \omega_i} p(\omega) \geq 0$$

$$(29) \quad \iff -a_i p(\omega_i) + b_i(1 - p(\omega_i)) \geq 0$$

$$(30) \quad \iff \frac{b_i}{a_i + b_i} \geq p(\omega_i).$$

□

In order to avoid sure loss, the odds a_i/b_i on ω_i must satisfy eq. (30) [13, §3.3.3 (a)] (see the proof of theorem 6 for more detail). Therefore, the collection of these odds can be viewed as an upper probability mass function, that is,

$$(31) \quad \forall i \in \{1, \dots, n\}: \bar{p}(\omega_i) := \frac{b_i}{a_i + b_i}.$$

3.2. Betting with multiple bookmakers. In the market, there are many bookmakers. We are interested in whether a customer can exploit odds from different bookmakers in order to make a sure gain. To do so, we model betting odds from different bookmakers as a set of desirable gambles, and we check avoiding sure loss of this set. We recover the known result that it is optimal to pick maximal odds on each outcome [12]. As greater odds correspond to a higher payoff to a customer, a sensible strategy for him is to pick the greatest odds on each outcome.

Theorem 6. *Let $\Omega = \{\omega_1, \dots, \omega_n\}$. Suppose there are m different bookmakers. For each $k \in \{1, \dots, m\}$, let a_{ik}/b_{ik} be the betting odds on ω_i provided by bookmaker k . For each $i \in \{1, \dots, n\}$ and $k \in \{1, \dots, m\}$, let*

$$(32) \quad g_{ik}(\omega) := \begin{cases} -a_{ik} & \text{if } \omega = \omega_i \\ b_{ik} & \text{otherwise.} \end{cases}$$

be the desirable gamble corresponding to the odds a_{ik}/b_{ik} . Let a_i^/b_i^* be the maximal betting odds on outcome ω_i , that is,*

$$(33) \quad a_i^*/b_i^* := \max_{k=1}^m \{a_{ik}/b_{ik}\}.$$

Then the set of desirable gambles $\mathcal{D} = \{g_{ik}: i \in \{1, \dots, n\}, k \in \{1, \dots, m\}\}$ avoids sure loss if and only if

$$(34) \quad \sum_{i=1}^n \frac{b_i^*}{a_i^* + b_i^*} \geq 1.$$

Proof. See appendix C. □

Theorem 6 tells us that to check avoiding sure loss of several bookmakers, we only need to consider the maximal odds on each outcome. Let's see an example.

Example 2. *Suppose that in the market there are three bookmakers providing different odds for outcomes W , D , and L as in table 1.*

Outcomes	Betting companies			Maximum odds
	River	Mountain	Forest	
W	4/5	17/20	3/4	17/20
D	13/5	14/5	13/5	14/5
L	10/3	3	16/5	10/3

TABLE 1. Table of odds provided by three bookmakers

Let \mathcal{D} be the set of desirable gambles corresponding to all of these odds. Note that the maximal betting odds are 17/20 for W , 14/5 for D and 10/3 for L . As

$$(35) \quad \frac{20}{17+20} + \frac{5}{14+5} + \frac{3}{10+3} = 1.034 \geq 1,$$

by theorem 6, we conclude that \mathcal{D} avoids sure loss. Therefore, a customer cannot exploit these odds to make a sure gain.

Consider a customer who is interested in odds provided by the three bookmakers as in table 1. A sensible strategy to him is to pick the greatest odds on each outcome. However, this means that the customer will never choose any odds provided by Forest, because all of Forest's odds are less than the odds provided by other bookmakers. Therefore, to encourage customers to bet with them, Forest may offer free coupons to the customer under certain conditions. In the next section, we will look at these free coupons in more detail.

4. FREE COUPONS FOR BETTING

A free coupon is a free stake that is given by a bookmaker to a customer who first bets with him. The free coupon can be spent on some betting odds that the customer wants to bet. In fact, the free coupon is not truly free, since the customer firstly has to bet on some odds before he claims the free coupon. Moreover, the bookmakers usually set some required conditions, for instance, a limit on the amount of free coupons that customers can claim, or a restriction of choices that customers can spend their free coupons.

We were wondering whether customers can exploit those given odds and free coupons in order to find a strategy of betting that incurs a sure gain. If there is a possible way to do that, then we will find an algorithm that gives such a strategy.

For simplicity in this study, we set up standard requirements for claiming free coupons from the bookmakers as follows:

- (1) Once the customer has placed his first bet, the bookmaker will give him a free coupon whose value is equal to the value of the bet that he placed.
- (2) The bookmaker sets the maximum value of the free coupon.
- (3) The free coupon only applies to the customer's first bet with the bookmaker.
- (4) The customer must spend his free coupon with the same bookmaker on other outcomes.
- (5) The customer must spend his free coupon on only a single outcome.

Here is an example of claiming free coupons.

Example 3. Suppose that Forest has the following offer: a free coupon will be given to a customer who first bets with Forest, and the value of the coupon is equal to the value of the first bet that the customer placed.

From table 1, if James, who is a customer, has never bet with Forest and he decides to place £5 on the odds 13/5 of the outcome D , then he will play £5 to Forest and he will claim a free coupon valued £5. James can use the free coupon to bet on other outcomes with Forest.

Once James receives a free coupon, he can spend his free coupons as in the next example.

Example 4. Continuing from the previous example, James has his free coupon valued £5 from Forest. Since James must spend his free coupon valued £5 on only a single outcome, by lemma 2, we modify odds 3/4 by multiplying them by 5/5. Now all odds have the same denominator which is 5.

Outcomes	W	D	L
odds	$(\frac{3 \cdot 5}{4})/5$	13/5	16/5

TABLE 2. Table of modified odds

If James spends his free coupon to bet on L and the true outcome is L , then Forest will lose £16; otherwise Forest will lose nothing. On the other hand, if James spends the coupon to bet on W and the true outcome is W , then Forest will lose £ $\frac{3 \cdot 5}{4}$; otherwise Forest will lose nothing. A total payoff to Forest is summarised in table 3.

Betting a free coupon on	Outcomes		
	W	D	L
L	0	0	-16
W	$-\frac{3 \cdot 5}{4}$	0	0

TABLE 3. Table of total payoff

Suppose that the customer first bets on an outcome ω_i with corresponding odds a_i/b_i . The payoff to the bookmaker is represented as a gamble g_{ω_i} in the table 4. Because this is his first bet, the customer receives a free coupon valued b_i , and he will spend this free coupon to bet on a single outcome. Suppose that he bets on ω_j with corresponding odds a_j/b_j . As the denominators are not necessarily equal, we multiply odds a_j/b_j by $\frac{b_i}{b_i}$. The modified odds are $(\frac{a_j \cdot b_i}{b_j})/b_i$. Note that as the free coupon must be spent on other outcomes, ω_j cannot coincide with ω_i .

If the true outcome is ω_j , then the bookmaker will lose $\frac{a_j \cdot b_i}{b_j}$. Otherwise the bookmaker will gain nothing. This payoff to the bookmaker is viewed as a gamble \tilde{g}_{ω_j} in the table 4. As g_{ω_i} and \tilde{g}_{ω_j} are desirable to the bookmaker, by rationality axiom (D4), $g_{\omega_i} + \tilde{g}_{\omega_j}$ is also desirable.

Outcomes	ω_i	ω_j	others
g_{ω_i}	$-a_i$	b_i	b_i
\tilde{g}_{ω_j}	0	$-\frac{a_j \cdot b_i}{b_j}$	0
$g_{\omega_i} + \tilde{g}_{\omega_j}$	$-a_i$	$\frac{(b_j - a_j)b_i}{b_j}$	b_i

TABLE 4. Table of the first-free desirable gamble to the bookmaker

We denote $g_{\omega_i \omega_j} := g_{\omega_i} + \tilde{g}_{\omega_j}$ and call it the *first-free* desirable gamble to the bookmaker. Note that $-g_{\omega_i \omega_j}$ is desirable to the customer. The customer can bet

on other odds, but he will not get any free coupon from his additional bets. This is because the bookmaker gives him the free coupon only once.

Also note that in the actual market, there is usually more than one bookmaker offering a free coupon. Therefore, the customer can first bet with different bookmakers in order to obtain several free coupons. These can be viewed as a first-free desirable gamble combining from several first-free desirable gambles. In this study, we only consider the case that customer first bets and claims a free coupon from a single bookmaker. In this case, we face a combinatorial problem over all first-free desirable gambles.

We would like to check whether $\mathcal{D} \cup \{g_{\omega_i \omega_j}\}$ avoids sure loss or not. By theorem 4, if \mathcal{D} avoids sure loss, then $\mathcal{D} \cup \{g_{\omega_i \omega_j}\}$ avoids sure loss if and only if $\overline{E}(g_{\omega_i \omega_j}) \geq 0$. In the case that $\mathcal{D} \cup \{g_{\omega_i \omega_j}\}$ does not avoid sure loss, by theorem 4, the bookmaker will lose at least $|\overline{E}(g_{\omega_i \omega_j})|$ which is the customer's highest sure gain. Therefore, the customer can combine $g_{\omega_i \omega_j}$ with a non-negative combination of g_i to obtain a sure gain $|\overline{E}(g_{\omega_i \omega_j})|$.

Let f be any first-free desirable gamble to the bookmaker. Before using the results in Section 2.3 to calculate the natural extension of f , we have to check whether \mathcal{D} avoids sure loss. If $\underline{P}_{\overline{p}}$ does not avoid sure loss, then without a free coupon, there is a non-negative combination of gambles that the customer can exploit to make a sure gain. On the other hand, if $\underline{P}_{\overline{p}}$ avoids sure loss, then we can write f in terms of its level sets and use corollary 1 to calculate the natural extension of f .

Example 5. Let Forest provide betting odds on W , D , and L as in table 1. By eq. (31), we have

$$(36) \quad \overline{p}(W) = \frac{4}{7} \quad \overline{p}(D) = \frac{5}{18} \quad \overline{p}(L) = \frac{5}{21}.$$

Since $\overline{p}(W) + \overline{p}(D) + \overline{p}(L) \geq 1$, $\underline{P}_{\overline{p}}$ avoids sure loss by theorem 1.

Continuing from example 4, suppose that James first bets on D and spends his free coupon to bet on L . Then, the first-free desirable gamble g_{DL} to Forest is as follows:

Outcomes	W	D	L
g_D	5	-13	5
g_L	0	0	-16
g_{DL}	5	-13	-11

TABLE 5. Table of desirable gambles to Forest

We decompose g_{DL} in terms of its level sets as

$$(37) \quad g_{DL} = -13I_{A_0} + 2I_{A_1} + 16I_{A_2}$$

where $A_0 = \{W, D, L\}$, $A_1 = \{W, L\}$ and $A_2 = \{W\}$. By theorem 2, we have

$$(38) \quad \overline{E}_{\overline{p}}(A_0) = \min\{\overline{p}(W) + \overline{p}(D) + \overline{p}(L), 1\} = 1$$

$$(39) \quad \overline{E}_{\overline{p}}(A_1) = \min\{\overline{p}(W) + \overline{p}(L), 1\} = \frac{17}{21}$$

$$(40) \quad \overline{E}_{\overline{p}}(A_2) = \min\{\overline{p}(W), 1\} = \frac{4}{7}.$$

Substitute $\bar{E}_{\bar{p}}(A_i)$, $i \in \{0, 1, 2\}$ into eq. (37). By corollary 1, we have

$$(41) \quad \bar{E}_{\bar{p}}(g_{DL}) = -13\bar{E}_{\bar{p}}(A_0) + 2\bar{E}_{\bar{p}}(A_1) + 16\bar{E}_{\bar{p}}(A_2) = -\frac{47}{21}.$$

As $\bar{E}_{\bar{p}}(g_{DL}) = -\frac{47}{21} < 0$, by theorem 4, Forest does not avoid sure loss. Therefore, with the free coupon, James can make a sure gain.

How should James bet? Remember that $\Omega = \{\omega_1, \dots, \omega_n\}$ and that g_i is the corresponding gamble to the odds a_i/b_i on ω_i :

$$(42) \quad g_i(\omega) = \begin{cases} -a_i & \text{if } \omega = \omega_i \\ b_i & \text{otherwise.} \end{cases}$$

Note that we can calculate $\bar{E}_{\bar{p}}(f)$, or $\bar{E}_{\mathcal{D}_{\bar{p}}}(f)$, by definition 5, for any gamble f by solving the following linear program:

$$(Pa) \quad (P) \quad \min \quad \alpha$$

$$(Pb) \quad \text{subject to} \quad \begin{cases} \forall \omega \in \Omega: \alpha - \sum_{i=1}^n g_i(\omega)\lambda_i \geq f(\omega) \\ \forall i = 1, \dots, n: \lambda_i \geq 0, \end{cases}$$

where the optimal α gives $\bar{E}_{\bar{p}}(f)$. If the optimal α is strictly negative, then the optimal $\lambda_1, \dots, \lambda_n$ give a combination of bets for a customer to make a sure gain. The dual of (P) is

$$(Da) \quad (D) \quad \max \quad \sum_{\omega \in \Omega} f(\omega)p(\omega)$$

$$(Db1) \quad \text{subject to} \quad \begin{cases} \forall g_i: \sum_{\omega \in \Omega} g_i(\omega)p(\omega) \geq 0 \\ \forall \omega: p(\omega) \geq 0 \\ \sum_{\omega \in \Omega} p(\omega) = 1. \end{cases}$$

After applying lemma 3, the constraints in eq. (Db1) become:

$$(Db2) \quad \text{subject to} \quad \begin{cases} \forall \omega: 0 \leq p(\omega) \leq \bar{p}(\omega) \\ \sum_{\omega \in \Omega} p(\omega) = 1. \end{cases}$$

We see that the objective function eq. (Da) is $E_p(f)$, the expectation of f with respect to the probability mass function p . As the optimal value of (D) is $\bar{E}_{\bar{p}}(f)$, if we can find a p that satisfies the dual constraints eq. (Db2) and $\bar{E}_{\bar{p}}(f) = E_p(f)$, then we have found an optimal solution of (D).

We now first construct a p , by assigning as much mass as possible to the smallest level sets. Then, in theorem 7, we prove that this p satisfies eq. (Db2) and $\bar{E}_{\bar{p}}(f) = E_p(f)$.

Algorithm 1 Construct an optimal solution p of (D)

Input: A gamble f , a set of outcomes Ω .

Output: An optimal solution p of (D).

(1) Rewrite f as

$$(43) \quad f = \sum_{i=0}^m \lambda_i A_i$$

where $\Omega = A_0 \supseteq A_1 \supseteq \dots \supseteq A_m \supseteq \emptyset$ are the level sets of f and $\lambda_0 \in \mathbb{R}$, $\lambda_1, \dots, \lambda_m > 0$.

(2) Order $\omega_1, \omega_2, \dots, \omega_n$ such that

$$(44) \quad \forall i \leq j: A_{\omega_i} \subseteq A_{\omega_j},$$

where A_ω is the smallest level set to which ω belongs, that is

$$(45) \quad A_\omega = \bigcap_{\substack{i=0 \\ \omega \in A_i}}^m A_i.$$

So, we start with those ω in A_m , then those in $A_{m-1} \setminus A_m$, then those in $A_{m-2} \setminus A_{m-1}$, and so on.

(3) Let k be the smallest index such that

$$(46) \quad \sum_{j=1}^k \bar{p}(\omega_j) \geq 1.$$

There is always such k because $\underline{P}_{\bar{p}}$ avoids sure loss. Define p as follows:

$$(47) \quad p(\omega_i) := \begin{cases} \bar{p}(\omega_i) & \text{if } i < k \\ 1 - \sum_{j=1}^{i-1} \bar{p}(\omega_j) & \text{if } i = k \\ 0 & \text{if } i > k. \end{cases}$$

We then show that p in eq. (47) satisfies eq. (Db2) and $\bar{E}_{\bar{p}}(f) = E_p(f)$.

Theorem 7. *The probability mass function p defined by eq. (47) satisfies eq. (Db2) and $\bar{E}_{\bar{p}}(f) = E_p(f)$.*

Proof. Let $\Omega = \{\omega_1, \dots, \omega_n\}$ be ordered as in eq. (44), and let k be the smallest index such that $\sum_{j=1}^k \bar{p}(\omega_j) \geq 1$. By eq. (47), $\sum_{i=1}^n p(\omega_i) = 1$ and

$$(48) \quad p(\omega_k) = 1 - \sum_{j=1}^{k-1} \bar{p}(\omega_j) \leq \sum_{j=1}^k \bar{p}(\omega_j) - \sum_{j=1}^{k-1} \bar{p}(\omega_j) = \bar{p}(\omega_k),$$

so for all $i \in \{1, \dots, n\}$, $0 \leq p(\omega_i) \leq \bar{p}(\omega_i)$. Therefore, p satisfies eq. (Db2). Next, we will show that for all level sets A_i ,

$$(49) \quad \min \left\{ \sum_{\omega \in A_i} \bar{p}(\omega), 1 \right\} = E_p(A_i).$$

Remember that A_{ω_k} is the smallest level set that contains ω_k . By eq. (47), for all $A_i \subsetneq A_{\omega_k}$, we know that $p(\omega) = \bar{p}(\omega)$ for all $\omega \in A_i$, and so

$$(50) \quad \min \left\{ \sum_{\omega \in A_i} \bar{p}(\omega), 1 \right\} = \sum_{\omega \in A_i} \bar{p}(\omega) = \sum_{\omega \in A_i} p(\omega).$$

For all $A_i \supseteq A_{\omega_k}$, we know that $\sum_{\omega \in A_i} p(\omega) = 1$ and $\sum_{\omega \in A_i} \bar{p}(\omega) \geq 1$, so

$$(51) \quad \min \left\{ \sum_{\omega \in A_i} \bar{p}(\omega), 1 \right\} = 1 = \sum_{\omega \in A_i} p(\omega).$$

Hence, eq. (49) holds. Therefore,

$$(52) \quad \bar{E}_{\bar{p}}(f) = \sum_{i=0}^m \lambda_i \bar{E}(A_i) \quad (\text{by eq. (14)})$$

$$(53) \quad = \sum_{i=0}^m \lambda_i \min \left\{ \sum_{\omega \in A_i} \bar{p}(\omega), 1 \right\} \quad (\text{by eq. (11)})$$

$$(54) \quad = \sum_{i=0}^m \lambda_i E_p(A_i) \quad (\text{by eq. (49)})$$

$$(55) \quad = E_p(f)$$

□

To sum up, we can use eq. (47) to construct an optimal solution p of (D).

We will use complementary slackness to find an optimal solution of the dual of (D) [16, p. 329]. Note that, as (D) has an optimal solution and the dual problem is bounded above, then by the strong duality theorem [8, p. 71], an optimal solution of (P) exists and achieves the same optimal value. In addition, a pair of solutions to (P) and (D) is optimal if, and only if, they satisfy the complementary slackness condition [3, p. 62]. Specifically, in our case, the condition holds for any non-negative variable and its corresponding dual constraint [4, p. 184, ll. 3–5]. More, precisely, let $p(\omega_1), \dots, p(\omega_n)$ be any feasible solution of (D), and let $\alpha, \lambda_1, \dots, \lambda_n$ be any feasible solution of (P). Then, by complementary slackness, these solutions are optimal if, and only if, for all $j \in \{1, \dots, n\}$, we have that

$$(56) \quad \left(\alpha - \sum_{i=1}^n g_i(\omega_j) \lambda_i - f(\omega_j) \right) p(\omega_j) = 0 \quad \text{and} \quad (\bar{p}(\omega_j) - p(\omega_j)) \lambda_j = 0.$$

This is equivalent to

- (1) if $p(\omega_j) > 0$, then $\alpha - \sum_{i=1}^n g_i(\omega_j) \lambda_i = f(\omega_j)$, and
- (2) if $p(\omega_j) < \bar{p}(\omega_j)$, then $\lambda_j = 0$.

So, if we have an optimal solution $p(\omega_1), \dots, p(\omega_n)$ of (D) and the optimal value α , then we can use these equations as a system of equalities in $\lambda_1, \dots, \lambda_n$. Note that some solutions of this system may not satisfy feasibility, i.e. they may violate $\lambda_i \geq 0$. However, all solutions of this system that satisfy $\lambda_i \geq 0$ are guaranteed to be optimal solutions of (P).

How does this system of equalities look like? Remember that k was defined as the smallest index such that $\sum_{j=1}^k \bar{p}(\omega_j) \geq 1$. According to eq. (47), for all $j \in \{1, \dots, k-1\}$ we have that $p(\omega_j) > 0$, so we have the following equalities: for all $j \in \{1, \dots, k-1\}$,

$$(57) \quad \alpha - \sum_{i=1}^n g_i(\omega_j) \lambda_i = f(\omega_j).$$

For all $j \in \{k+1, \dots, n\}$ we have that $p(\omega_j) = 0 < \bar{p}(\omega_j)$, so $\lambda_j = 0$ for all $j \in \{k+1, \dots, n\}$. For $j = k$, if $p(\omega_k) < \bar{p}(\omega_k)$, then we can also set $\lambda_k = 0$. Otherwise, we know that $p(\omega_k) = \bar{p}(\omega_k) > 0$ and so we can simply impose the same equality as for $j \in \{1, \dots, k-1\}$. Concluding, let k' be the largest index j for

which $p(\omega_j) = \bar{p}(\omega_j)$. Then as the optimal solution of (P) exists, it can be found by solving the following system:

$$(58) \quad \forall j \in \{1, \dots, k'\}: \alpha - \sum_{i=1}^{k'} g_i(\omega_j) \lambda_i = f(\omega_j)$$

$$(59) \quad \forall j \in \{k' + 1, \dots, n\}: \lambda_j = 0$$

So, effectively, all we are left with is a system of k' variables in k' constraints.

Note that we can modify the odds to have the same denominator (all b_i are equal), so it will be much easier to solve the new system.

Finally, note that in the first-free coupon scenario, to make a sure gain, the customer has to bet on every outcome. This implies that the only coefficients λ_i whose value can be zero are those corresponding to the gambles in the first-free gamble chosen by the customer. Hence, in that specific case, $k' \geq n - 2$.

Example 6. *Continuing from example 5, the corresponding linear programs to $\bar{E}(g_{DL})$ are as follows:*

$$(P1a) \quad (P1) \quad \min \quad \alpha$$

$$(P1b) \quad \text{subject to} \quad \begin{cases} \alpha + 3\lambda_W - 5\lambda_D - 5\lambda_L \geq 5 \\ \alpha - 4\lambda_W + 13\lambda_D - 5\lambda_L \geq -13 \\ \alpha - 4\lambda_W - 5\lambda_D + 16\lambda_L \geq -11 \end{cases}$$

$$(P1c) \quad \text{and} \quad \lambda_W, \lambda_D, \lambda_L \geq 0, \alpha \text{ free,}$$

$$(D1a) \quad (D1) \quad \max \quad 5p(W) - 13p(D) - 11p(L)$$

$$(D1b) \quad \text{subject to} \quad \begin{cases} 0 \leq p(W) \leq 4/7 \\ 0 \leq p(D) \leq 5/18 \\ 0 \leq p(L) \leq 5/21 \\ p(W) + p(D) + p(L) = 1. \end{cases}$$

By eq. (44), we see that

$$(60) \quad A_W \subseteq A_L \subseteq A_D,$$

so an optimal solution of (D1) is as follows:

$$(61) \quad p(W) = \frac{4}{7}, \quad p(L) = \frac{5}{21}, \quad p(D) = 1 - \left(\frac{4}{7} + \frac{5}{21} \right) = \frac{4}{21}.$$

As $p(W) = \bar{p}(W)$ and $p(L) = \bar{p}(L)$, whilst $p(D) < \bar{p}(D)$, by the complementary slackness, the optimal solution of (P1) must have $\lambda_D = 0$ and solves the following system:

$$(P1b1) \quad \alpha + 3\lambda_W - 5\lambda_L = 5$$

$$(P1b2) \quad \alpha - 4\lambda_W + 16\lambda_L = -11,$$

where the value of α is $-\frac{47}{21}$. We solve this system and get an optimal solution: $\lambda_W = \frac{18}{7}$ and $\lambda_L = \frac{2}{21}$.

A strategy for James to make a guaranteed gain is as follows. He first bets £5 on D and claims a free coupon valued £5 to bet on L. Next, he additionally bets £ $\frac{18}{7}$ on W and £ $\frac{2}{21}$ on D. He will make a sure gain of £ $\frac{47}{21}$ from Forest.

Country	Odds	Country	Odds	Country	Odds
France	10/3	Austria	45	Czech Republic	135
Germany	23/5	Poland	50	Slovakia	150
Spain	5	Switzerland	66	Rep of Ireland	170
England	9	Russia	85	Iceland	180
Belgium	57/5	Turkey	94	Romania	275
Italy	91/5	Wales	100	N Ireland	400
Portugal	20	Ukraine	100	Hungary	566
Croatia	27	Sweden	104	Albania	531

TABLE 6. Table of maximum betting odds for the European Football Championship 2016

5. ACTUAL FOOTBALL BETTING ODDS

In this section, we will look at some actual odds in the market, and we will check whether and how a customer can exploit those odds and free coupons in order to make a sure gain.

Consider table 9 which is in appendix D. We list betting odds provided by 27 bookmakers on the winner of the European Football Championship 2016. From table 9, the maximum betting odds on each outcome are listed in table 6. For all $i \in \{1, \dots, 24\}$, let a_i^*/b_i^* be the maximal betting odds in table 6. Since $\sum_{i=1}^{24} \frac{b_i^*}{a_i^* + b_i^*} = 1.0349 \geq 1$, by theorem 6, the set of desirable gambles corresponding to the odds in table 9 avoids sure loss. Therefore, there is no combination of bets which results in a sure gain.

Suppose that James is interested in betting with one of them, say Bet2. As he has never bet with Bet2 before, Bet2 will give him a free coupon on his first bet with them. With free coupons, we will check whether and how James can bet to make a guaranteed gain. Let \mathcal{D} be a set of desirable gambles corresponding to the odds and let g be any first-free desirable gamble to the company Bet2. We want to check whether $\mathcal{D} \cup \{g\}$ avoids sure loss or not. As there are 24 possible outcomes, the total number of different first-free desirable gambles with Bet2 is $24 \times 23 = 552$.

Suppose that James first bets on France and then spends his free coupon on Spain. So, the the first-free desirable gamble g_{FG} is

Outcomes	France	Spain	others
g_F	-3	1	1
\tilde{g}_S	0	-5	0
g_{FS}	-3	-4	1

TABLE 7. James' first-free gamble

where F and S denote France and Spain respectively. Again, we calculate $\bar{E}(g_{FS})$ by the Choquet integral. We decompose g_{FS} in terms of its level sets as

$$(62) \quad g_{FS} = -4I_{A_0} + I_{A_1} + 4I_{A_2}$$

where $A_0 = \Omega$, $A_1 = \Omega \setminus \{S\}$ and $A_2 = \Omega \setminus \{F, S\}$. By theorem 2, we have

$$(63) \quad \overline{E}(A_0) = 1 \quad \overline{E}(A_1) = 0.9810 \quad \overline{E}(A_2) = 0.7310.$$

By corollary 1, we substitute $\overline{E}(A_i)$, $i \in \{0, 1, 2\}$ to eq. (62) and obtain

$$(64) \quad \overline{E}(g_{FS}) = -4\overline{E}(A_0) + \overline{E}(A_1) + 4\overline{E}(A_2) = -0.0950.$$

Therefore, $\mathcal{D} \cup \{g_{FS}\}$ does not avoid sure loss.

Among all possible first-free gambles, we find that there are three further gambles whose \overline{E} is less than zero, namely $\overline{E}(g_{FG}) = -0.2093$, $\overline{E}(g_{GF}) = -0.0117$ and $\overline{E}(g_{GS}) = -0.0950$, where G denotes Germany. So, by theorem 4, $\mathcal{D} \cup \{g\}$ does not avoid sure loss when $g \in \{g_{FS}, g_{FG}, g_{GF}, g_{GS}\}$; otherwise $\mathcal{D} \cup \{g\}$ avoids sure loss. Therefore, if

- (1) James first bets on France and then spends his free coupon to bet on either Spain or Germany, or
- (2) James first bets on Germany and then spends his free coupon to bet on either France or Spain,

then there is a combination of bets for him to bet in order to make a sure gain from Bet2.

Consider the case where James first bets £1 on France and claims his free coupon to bet on Spain. An optimal solution of the corresponding problem (D) (the column $p(\omega_i)$ in table 8) can be found through algorithm 1. Then, we can find the optimal solution of the corresponding problem (P) by using the optimal solution of (D) with the complementary slackness condition. The optimal solution of (P) is presented in a column λ_i in table 8. Therefore, if James additionally bets as in column λ_i , then he will make a sure gain of £0.095 from Bet2.

6. CONCLUSION

In this paper, we studied whether and how a customer can exploit given betting odds and free coupons in order to make a sure gain. Specifically, we viewed these odds and free coupons as a set of desirable gambles and checked whether such a set avoids sure loss or not via the natural extension. We showed that the set avoids sure loss if, and only if, the natural extension of the first-free gamble corresponding to the free coupon is non-negative. If the set does not avoid sure loss, then a combination of bets can be derived from the optimal solution of the corresponding linear programming problem.

We showed that for this specific problem, we can easily find the natural extension through the Choquet integral. In the case that the set does not avoid sure loss, we presented how to use the Choquet integral and the complementary slackness condition to directly obtain the desired combination of bets, without actually solving linear programming problems, but instead just solving a linear system of equalities. This technique can be applied to arbitrary problems involving upper probability mass functions.

To illustrate the results, we looked at some actual betting odds on the winning of the European Football Championship 2016 in the market, and checked avoiding sure loss. We found that any sets of desirable gambles derived from those odds avoid sure loss. Having said that, with a free coupon, we identified sets of desirable gambles that no longer avoid sure loss. So, interestingly, in this case, when a free

Order ω_i	Countries	Odds	$\bar{p}(\omega_i)$	Optimal solutions	
				$p(\omega_i)$	λ_i
1	Germany	4	$\frac{1}{5}$	$\frac{1}{5}$	1
2	England	9	$\frac{1}{10}$	$\frac{1}{10}$	0.5
3	Belgium	10	$\frac{1}{11}$	$\frac{1}{11}$	$\frac{5}{11}$
4	Italy	16	$\frac{1}{17}$	$\frac{1}{17}$	$\frac{5}{17}$
5	Portugal	18	$\frac{1}{19}$	$\frac{1}{19}$	$\frac{5}{19}$
6	Croatia	25	$\frac{1}{26}$	$\frac{1}{26}$	$\frac{5}{26}$
7	Austria	40	$\frac{1}{41}$	$\frac{1}{41}$	$\frac{5}{41}$
8	Poland	50	$\frac{1}{51}$	$\frac{1}{51}$	$\frac{5}{51}$
9	Switzerland	40	$\frac{1}{41}$	$\frac{1}{41}$	$\frac{5}{41}$
10	Russia	66	$\frac{1}{67}$	$\frac{1}{67}$	$\frac{5}{67}$
11	Turkey	80	$\frac{1}{81}$	$\frac{1}{81}$	$\frac{5}{81}$
12	Wales	80	$\frac{1}{81}$	$\frac{1}{81}$	$\frac{5}{81}$
13	Ukraine	66	$\frac{1}{67}$	$\frac{1}{67}$	$\frac{5}{67}$
14	Sweden	80	$\frac{1}{81}$	$\frac{1}{81}$	$\frac{5}{81}$
15	Czech Republic	100	$\frac{1}{101}$	$\frac{1}{101}$	$\frac{5}{101}$
16	Slovakia	100	$\frac{1}{101}$	$\frac{1}{101}$	$\frac{5}{101}$
17	Rep of Ireland	150	$\frac{1}{151}$	$\frac{1}{151}$	$\frac{5}{151}$
18	Iceland	150	$\frac{1}{151}$	$\frac{1}{151}$	$\frac{5}{151}$
19	Romania	100	$\frac{1}{101}$	$\frac{1}{101}$	$\frac{5}{101}$
20	N Ireland	250	$\frac{1}{251}$	$\frac{1}{251}$	$\frac{5}{251}$
21	Albania	250	$\frac{1}{251}$	$\frac{1}{251}$	$\frac{5}{251}$
22	Hungary	250	$\frac{1}{251}$	$\frac{5}{251}$	$\frac{5}{251}$
23	France	3	$\frac{1}{4}$	$\frac{1}{4}$	$\frac{1}{4}$
24	Spain	5	$\frac{1}{6}$	$\frac{586}{579}$	0

TABLE 8. A summary of odds provided by Bet2, the upper probability mass function $\bar{p}(\omega_i)$, and optimal solution of (D) and (P)

coupon is added, there was a combination of bets from which the customer could have made a sure gain.

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APPENDIX A. PROOF OF COROLLARY 1

Proof. Since $A_0 = \Omega$, we can write f as

$$(65) \quad f = \sum_{i=1}^n \lambda_i I_{A_i} + \lambda_0$$

where $\lambda_0 \in \mathbb{R}$, $\lambda_1, \dots, \lambda_n > 0$ and $A_1 \supseteq \dots \supseteq A_n \supseteq \emptyset$. Then

$$(66) \quad \begin{aligned} -f &= -\sum_{i=1}^n \lambda_i (1 - I_{A_i^c}) - \lambda_0 \\ &= -\sum_{i=1}^n \lambda_i - \lambda_0 + \sum_{i=1}^n \lambda_i I_{A_i^c}. \end{aligned}$$

Therefore,

$$(67) \quad \bar{E}_{\bar{p}}(f) = -\underline{E}_{\bar{p}}(-f)$$

$$(68) \quad = -\left(-\sum_{i=1}^n \lambda_i - \lambda_0 + \sum_{i=1}^n \lambda_i \underline{E}_{\bar{p}}(A_i^c)\right)$$

$$(69) \quad = \lambda_0 + \sum_{i=1}^n \lambda_i (1 - \underline{E}_{\bar{p}}(A_i^c))$$

$$(70) \quad = \lambda_0 + \sum_{i=1}^n \lambda_i \bar{E}_{\bar{p}}(A_i),$$

where eq. (68) holds by constant additivity and comonotone additivity [10, p. 382, Prop. C.5(v)&(vii)]. \square

APPENDIX B. PROOF OF THEOREM 4

Proof. For the first part, suppose that $f \in \mathcal{L}(\Omega)$ and $\mathcal{D} = \{g_i : i \in \{1, \dots, n\}\}$ is a set of desirable gambles that avoids sure loss. We find that

$$(71) \quad \begin{aligned} \bar{E}_{\mathcal{D}}(f) &= \inf \left\{ \alpha \in \mathbb{R} : \alpha - f \geq \sum_{i=1}^n \lambda_i g_i, \lambda_i \geq 0 \right\} \\ &= \min \left\{ \max_{\omega \in \Omega} \left(f(\omega) + \sum_{i=1}^n \lambda_i g_i(\omega) \right) : \lambda_i \geq 0 \right\}, \end{aligned}$$

where the inf is actually a min because \mathcal{D} is finite. So, by lemma 1,

$$(72) \quad \bar{E}_{\mathcal{D}}(f) \geq 0 \iff \forall \lambda_i \geq 0, \max_{\omega \in \Omega} \left(\sum_{i=1}^n \lambda_i g_i(\omega) + f(\omega) \right) \geq 0.$$

For the second part, if $\mathcal{D} \cup \{f\}$ does not avoid sure loss, then $\bar{E}_{\mathcal{D}}(f) < 0$. So, by eq. (71), there exists an ω^* in Ω and some $\lambda_i \geq 0$ such that

$$(73) \quad \bar{E}_{\mathcal{D}}(f) = f(\omega^*) + \sum_{i=1}^n \lambda_i g_i(\omega^*) \geq f(\omega) + \sum_{i=1}^n \lambda_i g_i(\omega), \quad \forall \omega \in \Omega.$$

Hence there is a sure loss of at least $|\overline{E}_{\mathcal{D}}(f)|$. \square

APPENDIX C. PROOF OF THEOREM 6

Proof. Note that for each i and k , we have

$$(74) \quad \frac{a_{ik}}{b_{ik}} \leq \frac{a_i^*}{b_i^*} \iff \frac{b_i^*}{a_i^* + b_i^*} \leq \frac{b_{ik}}{a_{ik} + b_{ik}}.$$

So,

$$(75) \quad \frac{b_i^*}{a_i^* + b_i^*} = \min_k \left\{ \frac{b_{ik}}{a_{ik} + b_{ik}} \right\}.$$

(\implies) Suppose the set of desirable gambles \mathcal{D} avoids sure loss. We will show that eq. (34) holds. As \mathcal{D} avoids sure loss, the following system of linear inequalities:

$$(76) \quad \forall i: p(\omega_i) \geq 0$$

$$(77) \quad \sum_{i=1}^n p(\omega_i) = 1$$

$$(78) \quad \forall i, k: \sum_{i=1}^n g_{ik}(\omega_i) p(\omega_i) \geq 0,$$

has a solution [13, p. 175, ll. 10–13], say $p = (p(\omega_1), \dots, p(\omega_n))$. By lemma 3, for each i and k ,

$$(79) \quad \frac{b_{ik}}{a_{ik} + b_{ik}} \geq p(\omega_i).$$

Then, by eq. (75) for each i ,

$$(80) \quad \frac{b_i^*}{a_i^* + b_i^*} \geq p(\omega_i).$$

Therefore,

$$(81) \quad \sum_{i=1}^n \frac{b_i^*}{a_i^* + b_i^*} \geq \sum_{i=1}^n p(\omega_i) = 1.$$

(\Leftarrow) Suppose $\sum_{i=1}^n \frac{b_i^*}{a_i^* + b_i^*} \geq 1$ holds. Let

$$(82) \quad S = \sum_{i=1}^n \frac{b_i^*}{a_i^* + b_i^*} \quad \text{and} \quad p(\omega_i) = \frac{b_i^*}{S(a_i^* + b_i^*)}.$$

If we show that p is a feasible solution of eqs. (76), (77) and (78), then \mathcal{D} avoids sure loss. Note that by eq. (82), $p(\omega_i) \geq 0$ for all i , $\sum_{i=1}^n p(\omega_i) = 1$ and with eq. (75), $\frac{b_{ik}}{a_{ik} + b_{ik}} \geq p(\omega_i)$. So, by lemma 3, $\sum_{i=1}^n g_{ik}(\omega) p(\omega_i) \geq 0$ holds for all g_{ik} . Therefore, p is a feasible solution of eqs. (76), (77) and (78) and by [13, p. 175, ll. 10–13], \mathcal{D} avoids sure loss. \square

APPENDIX D. BETTING ODDS ON THE WINNER OF THE EUROPEAN FOOTBALL CHAMPIONSHIP 2016

Countries	bookmakers																																
	Bet1	Bet2	Bet3	Bet4	Bet5	Bet6	Bet7	Bet8	Bet9	Bet10	Bet11	Bet12	Bet13	Bet14	Bet15	Bet16	Bet17	Bet18	Bet19	Bet20	Bet21	Bet22	Bet23	Bet24	Bet25	Bet26	Bet27						
France	3	3	3	3	3	11/4	3	16/5	3	10/5	16/5	3	3	3	16/5	3	10/3	16/5	16/5	16/5	3	16/5	3	3	3	3	3	3	3				
Germany	4	4	9/2	4	9/2	4	4	9/2	10/3	9/2	9/2	9/2	4	7/2	4	9/2	9/2	19/5	9/2	15/4	9/2	19/5	9/2	4	9/2	22/5	23/5	23/5	23/5				
Spain	5	5	9/2	5	9/2	5	5	9/2	5	9/2	5	9/2	5	5	5	5	9/2	5	9/2	5	9/2	5	5	5	5	5	5	5	5				
England	17/2	9	9	8	9	8	9	8	9	9	8	9	8	8	9	9	9	17/2	9	9	9	17/2	8	8	8	17/2	43/5	9	9				
Belgium	11	10	10	10	10	11	10	11	10	10	10	10	11	10	11	11	11	9	10	9	10	9	10	10	10	54/5	53/5	57/5	57/5	57/5			
Italy	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	16	14	17	18	89/5	91/5	91/5	91/5	91/5			
Portugal	18	18	18	18	18	18	18	14	20	17	18	18	14	18	12	18	20	15	17	18	17	15	18	208/17	88/5	92/5	91/5	91/5	91/5	91/5	91/5		
Croatia	25	25	22	25	22	25	25	25	22	25	25	22	25	25	25	25	25	25	25	25	25	25	22	25	26	26	24	27	27	27	27		
Austria	40	40	33	33	40	40	40	40	33	40	40	40	33	33	28	40	33	40	40	40	40	40	33	40	45	43	43	45	45	45	45		
Poland	50	50	50	50	50	40	50	50	50	50	50	50	50	50	50	40	50	45	50	40	50	45	50	50	47	48	48	50	50	50	50	50	
Switzerland	66	40	66	50	66	66	50	66	66	66	66	50	66	66	66	66	66	66	66	66	66	66	66	66	66	66	65	64	65	64	65	64	
Russia	66	66	80	66	80	80	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	66	85	84	79	84	79	84	
Turkey	80	80	80	80	80	80	80	66	80	80	66	66	66	66	80	80	66	80	80	80	80	80	80	80	80	80	94	92	89	89	89	89	
Wales	80	80	80	80	80	80	66	80	100	80	66	66	66	66	100	66	66	80	80	80	80	80	80	80	80	80	81	80	80	80	80	80	
Ukraine	100	66	80	80	80	80	66	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80	80
Sweden	100	80	100	80	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	100	104	90	90	90	90	90	
Czech Rep	125	100	125	80	125	100	100	125	80	100	100	125	66	100	100	125	100	100	100	100	100	100	100	100	100	100	132	135	135	135	135	135	
Slovakia	150	100	150	150	150	150	150	150	100	100	150	150	150	150	150	100	125	187/2	100	150	100	100	100	100	100	100	142	143	143	143	143	143	143
Rep of Ireland	150	150	150	150	150	125	150	100	150	150	150	150	150	150	150	125	125	349/4	150	150	150	150	112	125	150	170	156	149	149	149	149	149	149
Iceland	100	150	100	100	100	100	100	150	80	100	80	100	100	100	100	150	100	110	100	100	100	100	100	100	100	180	179	140	140	140	140	140	140
Romania	200	100	150	125	150	200	200	125	150	200	150	150	150	150	80	200	150	309/4	200	200	200	287/4	125	200	275	256	238	238	238	238	238	238	238
N Ireland	350	250	400	400	400	350	300	300	300	400	300	300	250	250	300	250	400	359/4	400	300	400	359/4	400	400	389	377	376	376	376	376	376	376	376
Hungary	350	250	400	400	400	350	300	300	300	400	300	300	250	250	300	250	400	359/4	400	250	400	359/4	400	400	350	341	340	340	340	340	340	340	340
Albania	500	250	500	400	500	350	500	400	500	500	250	200	300	250	300	400	500	363/4	500	300	500	177/4	400	500	531	513	513	513	513	513	513	513	513

TABLE 9. Table of betting odds on the winner of the European Football Championship 2016 where bookmaker names are modified. Collect data from www.oddschecker.com/football/euro-2016/winner on 13-06-2016.

DURHAM UNIVERSITY, DEPARTMENT OF MATHEMATICAL SCIENCES, UK
E-mail address: `nawapon.nakharutai@durham.ac.uk`

DURHAM UNIVERSITY, DEPARTMENT OF MATHEMATICAL SCIENCES, UK
E-mail address: `c.c.d.s.caiado@durham.ac.uk`

DURHAM UNIVERSITY, DEPARTMENT OF MATHEMATICAL SCIENCES, UK
E-mail address: `matthias.troffaes@durham.ac.uk`