## ANALYSIS OF N-CARD LE HER

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ABSTRACT. We present a complete solution to a card game with historical origins. Our analysis exploits convexity properties in the payoff matrix, allowing this discrete game to be resolved by continuous methods.

In this paper, we analyze a variant of the card-game Le Her, which has a long history in the mathematical literature (cf. Section 18.6 of [7]). The authentic two-player 52-card version is reported and solved by Dresher [3, 4], with some anticipation by R.A. Fisher [6]. Todhunter [10] describes efforts at its solution by N. Bernoulli and Montmort; retrospectively, their lack of the "mixed strategy" concept can be recognized as crucial. The present version, formulated by Karlin ([9], p. 100) who poses the case N = 5 as a problem, involves a single-suit deck of  $N \ge 3$  cards with respective face-values  $1, 2, \ldots, N$ . Let X, Y, Z denote the top three cards, all face down, after a randomizing shuffle of the deck. Cards X and Y are dealt to Players 1 and 2 respectively, leaving Z on top. Each player inspects his or her own card; thus Player 1 knows X but not Y or Z, while Player 2 knows Y but not X or Z. (Our notation will slur the distinction between a random variable and its realization, without real risk of confusion.)

Player 1 moves first. He can either keep X, or else elect a swap of cards with Player 2. In the latter case, both players inspect their new cards, and therefore know both X and Y (but not Z). Next, it is Player 2's turn to move. She can either keep her current card, or else elect to swap that card for Z. That concludes play: the player holding the higher card wins one unit from the opponent.

The pure strategies for Player 1 are associated one-to-one with the subsets S of  $\{1, 2, \ldots, N\}$ ; playing strategy S, Player 1 keeps X if  $X \in S$ , and otherwise swaps X for Y. Note that if Player 1 swaps, then Player 2 will know that she holds X while Player 1 is holding Y, and will therefore surely keep X if X > Y, and surely swap X for Z if X < Y, the swap "succeeding" iff Z > Y. Thus a pure strategy for Player 2 need specify that player's action only when Player 1 keeps his card. Those strategies are associated one-to-one with subsets T of  $\{1, 2, \ldots, N\}$ ; playing strategy T after a "keep" by Player 1, Player 2 keeps Y if  $Y \in T$ , and otherwise swaps Y for Z.

The joint distribution of (X, Y) is of course given by  $P(X, Y) = p = \frac{1}{N(N-1)}$ if  $X \neq Y$ , P(X, Y) = 0 if X = Y. Let P(S, T|X, Y) denote the probability of a win by Player 1 when respective strategies S and T are employed, conditional on (X, Y); the corresponding *unconditional* probability is given by

(1) 
$$P(S,T) = \sum_{X,Y} P(S,T|X,Y) P(X,Y) = p \sum_{X \neq Y} P(S,T|X,Y).$$

The entries of the payoff matrix are given by  $1 \cdot P(S,T) + (-1) \cdot [1 - P(S,T)]$ , but an equivalent strategic analysis results if this payoff function is replaced by P(S,T), and we will do so.

The preceding description yields a  $2^N \times 2^N$  matrix game. But this size can clearly be reduced; for instance, it would be foolish to swap away the highest possible card N, so that rational play requires  $N \in S \cap T$ . Intuitively, Players 1 and 2 can restrict themselves to "gapless" strategies. That is, Player 1 has a critical number  $s \ge 2$ where he will keep exactly those cards greater than or equal to s, and Player 2 has a critical number  $t \ge 2$  where if Player 1 keeps his card, she will keep just those cards that are greater than or equal to t. For brevity we omit the confirmation (in [1]) of this intuition, i.e., the formal proof that any strategy that keeps k cards is dominated by the strategy that keeps the k cards of highest value. We let  $S_s = \{X : X \ge s\}$  and  $T_t = \{Y : Y \ge t\}$ . Thus our matrix game can be reduced to the  $(N-1) \times (N-1)$  payoff matrix A = [a(s,t)], where  $a(s,t) = P(S_s, T_t)$  for  $2 \le s, t \le N$ . Our goal is to establish a radical further reduction, to an explicitlyidentified submatrix game of size at most only  $2 \times 2$ , whose solution is therefore given by standard formulas.

Next we provide a formula for a(s,t). The formula depends on the sign of s-t. As preparation, we define for integral  $s, t \in [2, N]$ ,

$$\begin{array}{rcl} (2)h(s,t) &=& (N-t)(N+1-t)+(N-1)(s+t-2),\\ (3)f(s,t) &=& h(s,t)-(s-1)(s-2)(s+3t-12)/3(N-2),\\ (4)g(s,t) &=& h(s,t)-(s-2)(s-3)(s+3t-4)/3(N-2)-(s-t)(s-t-1), \end{array}$$

and observe that f(s,t) = g(s,t) when s = t.

**Lemma 1.** For  $s \le t$ , 2a(s,t)/p = f(s,t).

*Proof.* There are three cases to consider in evaluating (1) for  $S = S_s$  and  $T = T_t$ . If  $X < s \leq t$  then Player 1 swaps, and wins iff X < Y and Z < Y. If  $s \leq X < t$  then Player 1 keeps X; since Player 2 wins if he keeps (i.e., if  $Y \geq t$ ), Player 1 wins iff Y < t and Z < X, the latter corresponding to X - 1 possibilities for Z if X < Y but to only X - 2 (the value Y is ruled out) if Y < X. Finally, if  $X \geq t$  then Player 1 wins iff either  $X > Y \geq t$  or  $Y < t \leq X$  and Z < X (the value Y is ruled out for Z). These cases yield three groups of terms in the evaluation of (1):

$$\begin{aligned} \frac{1}{p}a(s,t) &= \sum_{X < s} \sum_{Y > X} \frac{Y - 2}{N - 2} \\ &+ \sum_{s \le X < t} \sum_{X < Y < t} \frac{X - 1}{N - 2} + \sum_{s \le X < t} \sum_{Y < X} \frac{X - 2}{N - 2} \\ &+ \sum_{X \ge t} \sum_{t \le Y < X} 1 + \sum_{X \ge t} \sum_{Y < t} \frac{X - 2}{N - 2}. \end{aligned}$$

Heroic algebra, and the formula for the sum of the first s-1 perfect squares, yield the stated result.

**Lemma 2.** For  $s \ge t$ , 2a(s,t)/p = g(s,t).

*Proof.* Now there are two cases to consider. If X < s then Player 1 swaps, and wins iff X < Y and Z < Y. And if  $X \ge s \ge t$  then Player 1 keeps X, winning iff

either Y < t and Z < X, or  $X > Y \ge t$ . These cases yield two groups of terms in the evaluation of (1):

$$\begin{aligned} \frac{1}{p} a(s,t) &= \sum_{X < s} \sum_{Y > X} \frac{Y - 2}{N - 2} \\ &+ \sum_{X \ge s} \sum_{Y < t} \frac{X - 2}{N - 2} + \sum_{X \ge s} \sum_{X > Y \ge t} 1, \end{aligned}$$

from which algebraic manipulation leads to the stated result.

The payoff function a(s,t) has some desirable properties. By straightforward algebra, one can show [1] that the columns of the payoff matrix A are *discrete* concave and the rows of A are *discrete convex*. That is,

**Lemma 3.** For each  $2 \le t \le N$ , a(s+1,t) - a(s,t) is nonincreasing in  $s \ge 2$ .

**Lemma 4.** For each  $2 \le s \le N$ , a(s, t+1) - a(s, t) is nondecreasing in  $t \ge 2$ .

Howard [8] proves that in a game that satisfies the concavity condition of Lemma 3 Player 1 has an optimal mixed strategy that mixes at most two *consecutive* pure strategies. Analogous results apply for Player 2 when the convexity condition of Lemma 4 occurs. (An alternative treatment, whose preview in [1] was apparently the stimulus for [8], occurs in [2].) Since the only difference between consecutive strategies  $S_s$  and  $S_{s+1}$  is how they treat card s, then the above results give us:

**Theorem 1.** In our variant of N-card Le Her, Player 1 has a critical card s such that he will always swap cards below s, always keep cards above s and will keep or swap card s according to a mixed strategy. Likewise, Player 2 has a critical card t such that when Player 1 keeps his card, she will always swap cards below t, always keep cards above t and will keep or swap card t according to a mixed strategy.

To determine which consecutive strategies are optimal, suppose that a(s,t) can be interpolated by a function A(s,t) defined on the real domain  $[2, N] \times [2, N]$ , where for fixed t, A is a concave function of s. By [5], such a game has an optimal pure strategy  $s^*$ . The authors prove in [2] that in the discrete version of such a game, Player 1 has an optimal strategy which mixes at most the pure strategies  $\lfloor s^* \rfloor$  and  $\lceil s^* \rceil$ . Likewise, if A is a convex function of t, then the continuous game will have a pure optimal strategy  $t^*$ , and the original game will optimally mix on pure strategies  $\lfloor t^* \rfloor$  and  $\lceil t^* \rceil$ .

The right-hand sides of equations (2-4) yield extensions (H, F, G) of the respective functions (h, f, g) from integer to continuous variables  $(s, t) \in [2, N]$ , with F = G when s = t. By Lemmas 1 and 2, a "natural" extension A(s, t) of a(s, t) to a continuous-game payoff function is given by

(5) 
$$\frac{2}{p}A(s,t) = \begin{cases} F(s,t) & \text{for } s \le t, \\ G(s,t) & \text{for } s \ge t. \end{cases}$$

To solve the game as proposed in the previous paragraph, we need to verify that A(s,t) – or equivalently,  $\frac{2}{p}A(s,t)$  – is concave in s for fixed t. We first observe by straightforward differentiation that

$$\partial^2 G / \partial s^2 = -2(N+s+t-5)/(N-2)$$

which is non-positive (as desired) since  $s, t \in [2, N]$ , and that

$$\partial^2 F / \partial s^2 = -2(s+t-5)/(N-2),$$

which has the desired sign except in the upper left corner (defined by s + t < 5) of the square  $[2, N] \times [2, N]$ . In view of (5), it is also necessary for concavity (in s) to check that  $\partial F/\partial s \ge \partial G/\partial s$  when s = t. This condition reduces to the explicit form

(6) 
$$t \ge \Theta =_{\operatorname{def}} (N+2)/2,$$

leaving the subinterval  $[2, \Theta)$  to be dealt with. The next lemma shows that this initial subinterval of [2, N] can be eliminated by a suitable domination argument on the matrix game. In what follows, we use the floor and ceiling symbols  $\lfloor x \rfloor$  and  $\lceil x \rceil$  to denote the greatest integer less than or equal to x and the least integer greater than or equal to x, respectively.

**Lemma 5.** For integral  $s \in [2, N]$ ,  $a(s, t) \ge a(s, \lceil \Theta \rceil)$  holds for all integral  $t \in [2, \lceil \Theta \rceil]$ .

*Proof.* For continuous (s,t) with  $2 \le t \le s \le N$ , we have

(7) 
$$2p^{-1}\partial A/\partial t = \partial G/\partial t = -(N-s)(N-s+1)/(N-2) \le 0,$$

so that A(s,t) is nonincreasing in t. And if  $s \leq t$ , then

(8) 
$$2p^{-1}\partial A/\partial t = \partial F/\partial t = -\{(N+2-2t) + (s-1)(s-2)/(N-2)\},\$$

yielding the same conclusion if also  $t \leq \Theta$ . Thus a(s,t) is nonincreasing in t for  $t \leq \Theta$ , yielding the desired result when N is even so that  $\Theta$  is integral. And if N is odd, then a(s,t) is nonincreasing in t for  $t \leq \lfloor \Theta \rfloor = (N+1)/2$ ; the remaining desired conclusion  $a(s, \lfloor \Theta \rfloor) \geq a(s, \lceil \Theta \rceil)$  follows from (7) if  $\lceil \Theta \rceil \leq s$ , while if integral  $s < \lceil \Theta \rceil$  (i.e.,  $s \leq \lfloor \Theta \rfloor$ ) then integration over  $[\lfloor \Theta \rfloor, \lceil \Theta \rceil] = [\Theta - \frac{1}{2}, \Theta + \frac{1}{2}]$  of the expression in (8) implies the result via the conclusion

$$2p^{-1}[a(s, \lfloor \Theta \rfloor) - a(s, \lceil \Theta \rceil)] = -(s-1)(s-2)/(N-2) \le 0.$$

It follows from Lemma 5 that Player 2's pure strategies in the matrix game can be restricted by  $t \ge \lceil \Theta \rceil$ , so that the same can be done in the continuous extension. We may assume that  $N \ge 4$  (since if N = 3 the matrix game is already  $2 \times 2$ ), so that the last restriction implies  $t \ge 3$ , which in junction with  $s \ge 2$  rules out the troublesome corner s + t < 5. Thus the concavity-in-s property has been established. We note in passing the following intuitively plausible interpretation, in the matrix game, of the domination-enforced condition (6): If Player 1 has kept his card, then Player 2 should swap any card that is not above average.

We continue to assume  $N \geq 4$ , and now know that the continuous game with payoff function A(s,t) restricted to the rectangle  $[2, N] \times [\lceil \Theta \rceil, N]$  has some optimal pure strategy  $s^*$  for Player 1, and that in the matrix game Player 1 has an optimal strategy which mixes at most the consecutive rows  $\lfloor s^* \rfloor$  and  $\lceil s^* \rceil$ . To identify these rows, we proceed to determine  $s^*$ . By the "maximin" definition of an optimal strategy for Player 1,  $s^*$  is characterized by maximizing, over [2, N], the function

(9) 
$$\mu(s) = \min\{A(s,t) : \lceil \Theta \rceil \le t \le N\}$$

i.e.,  $\mu(s) = A(s, t^*(s))$  where  $t^*(s)$  minimizes A(s, t) over  $[[\Theta], N]$ . By (7), we have  $t^*(s) \ge s$  if s < N and can take  $t^*(s) \ge s$  if s = N, so that

(10) 
$$\mu(s) = F(s, t^*(s))$$

where  $t^*(s)$  minimizes F(s,t) over  $[\max(s, [\Theta]), N]$ .

To determine  $t^*(s)$ , we use (8) to equate  $\partial F/\partial t$  to 0, obtaining the t-value

$$\tau^*(s) = \Theta + (s-1)(s-2)/2(N-2).$$

It follows from (8) that  $t^*(s)$  is given by  $\tau^*(s)$  if the latter lies in the interval  $[\max(s, \lceil \Theta \rceil), N]$ . Analyzing the conditions for membership of  $\tau^*(s)$  in this interval, we find that  $\tau^*(s) \ge s$  is equivalent to  $(N-s)^2 + (s-2) \ge 0$ , which is true. Next,  $\tau^*(s) \le N$  is equivalent to  $(s-1)(s-2) \le (N-2)^2$ , which is true for  $s \le N-1$  but not for s = N. Finally, since  $s \ge 2$ ,  $\tau^*(s) \ge \lceil \Theta \rceil$  is true when N is even (so that  $\Theta$  is integer), but for odd N it is equivalent to

$$(s-1)(s-2) \ge N-2$$

which *fails* for sufficiently small s.

However, one can show (see [1]) that the "troublesome cases" mentioned above need never occur in an optimal solution. That is, without loss of optimality, Player 1 can restrict himself to

(11) 
$$s \le N - 1 \text{ and } (s - 1)(s - 2) \ge N - 2.$$

These conclusions follow (respectively) from the next two additional domination results about the matrix game, whose proofs (in [1]) are again omitted for brevity:

**Lemma 6.** For integral  $t \in [2, N]$ ,  $a(N, t) \le a(N - 1, t)$ .

**Lemma 7.** For integral  $t \in [[\Theta], N]$  and integral s with (s-1)(s-2) < N-2, a(s+1,t) > a(s,t).

We have now justified equating  $t^*(s)$  to  $\tau^*(s)$ , i.e.,

(12) 
$$t^*(s) = \Theta + (s-1)(s-2)/2(N-2)$$

Substitution of (12) into (10), and differentiation, yield for  $-6(N-2)^2 d\mu/ds$  the expression

$$(13) \ \phi(s) = 6s^3 + (6N - 39)s^2 + (6N^2 - 60N + 135)s - (6N^3 - 21N^2 - 28N + 110)s - (6N^3 - 28N + 110)s - (6N^$$

Its derivative is a quadratic function whose discriminant  $-36(8N^2 - 68N + 110)$ , is negative (hence  $\phi(s)$  is increasing) for  $N \ge 7$ , where it is easily verified that  $\phi(N-1) > 0 > \phi(\Theta)$ . Thus for  $N \ge 7$  the unique real root of  $d\mu/ds = 0$ , is interior to the interval  $[\Theta, N - 1]$ , hence satisfies (11), so that  $s^*$  can be calculated as the real root of  $\phi(s) = 0$ . As for the remaining small values of N, according to (11) Player 1's pure strategies can be confined to s = 3 if N = 4, to s = 4 if N = 5, and to the consecutive pair  $s \in \{4, 5\}$  if N = 6. In these three cases the restriction  $t \ge [\Theta]$  translates into  $t \in \{3, 4\}, t \in \{4, 5\}$  and  $t \in \{4, 5, 6\}$  respectively; in the last of these the third column of the  $2 \times 3$  submatrix coincides with the second, permitting reduction to a  $2 \times 2$  game. So for what follows, we can and will assume N > 7.

We have showed that the  $(N-1) \times (N-1)$  matrix game can be reduced to a subgame involving the last  $N - \lceil \Theta \rceil + 1$  columns and at most a consecutive pair  $(\lfloor s^* \rfloor, \lceil s^* \rceil)$  of rows, and a procedure for determining this pair has been given. As noted after Lemma 4, we are also assured that in principle this subgame can be reduced further to a sub-subgame of dimensions at most  $2 \times 2$  involving consecutive columns  $(\lfloor t^{**} \rfloor, \lceil t^{**} \rceil)$ . For given N it seems brute-force practical to proceed by successive solution of  $2 \times 2$  sub-subgames involving consecutive columns, retaining the solution with the smallest payoff value. However, it would be more elegant

to mirror the preceding analysis from Player 2's viewpoint, giving a "semi-closed" recipe for  $t^{**}$ .

Such an attempt would naturally begin by verifying that for fixed s, A(s,t) is convex in t. We find by straightforward differentiation that

(14) 
$$\partial^2 F/\partial t^2 = 2, \ \partial^2 G/\partial t^2 = 0$$

which by (5) assures convexity over the separate *t*-intervals (s, N] and [2, s). But in view of (5), it is also necessary to check that  $\partial F/\partial t \geq \partial G/\partial t$  when t = s. This condition reduces to the explicit form  $s \leq \Theta$ , whereas we showed above (second sentence after (13) that  $s^* > \Theta$ . So our mirror must be blurred by an additional line of argument.

**Theorem 2.** For  $N \ge 7$ , optimal mixed strategies for our variant of Le Her can be obtained by solving the 2 × 2 subgame involving only rows  $\lfloor s^* \rfloor$  and  $\lceil s^* \rceil$ , where,  $s^*$ is the real zero of the cubic  $\phi(s)$  defined by (13), and only columns  $\lfloor t^{**} \rfloor$  and  $\lceil t^{**} \rceil$ , where  $t^{**} = \max(t^*(s^*), \lceil s^* \rceil)$  as defined by (12) and (6).

*Proof.* It has already been proved that attention can be restricted to the rows  $\lfloor s^* \rfloor$  and  $\lceil s^* \rceil$ , and to columns  $t \geq \lceil \Theta \rceil$ . We first show that the latter restriction can be tightened to  $t \geq \max(\lceil \Theta \rceil, \lfloor s^* \rfloor)$ . (Since the material following (13) yields  $s^* > \Theta$ , this tightening might be a strict one.) For this purpose note that by (7), for integer  $t \leq \lfloor s^* \rfloor \leq \lceil s^* \rceil$ , we have

$$a(\lfloor s^* \rfloor, t) \ge a(\lfloor s^* \rfloor, \lfloor s^* \rfloor), \ a(\lceil s^* \rceil, t) \ge a(\lceil s^* \rceil, \lfloor s^* \rfloor),$$

so that in the 2-rowed matrix subgame column t is dominated by column  $\lfloor s^* \rfloor$  and can therefore be deleted if  $t < \lfloor s^* \rfloor$ .

We next show that if  $s^*$  is non-integer and the surviving matrix subgame still contains column  $\lfloor s^* \rfloor$ , then that column is dominated by column  $\lceil s^* \rceil$  and can therefore be deleted. For this we must demonstrate

$$a(\lfloor s^* \rfloor, \lfloor s^* \rfloor) \ge a(\lfloor s^* \rfloor, \lceil s^* \rceil), \ a(\lceil s^* \rceil, \lfloor s^* \rfloor) \ge a(\lceil s^* \rceil, \lceil s^* \rceil).$$

The second assertion with  $t \leq s$  on both sides, is a consequence of (7). The first assertion, since  $s \leq t$  on both sides, is by Lemma 1 an instance of the relation  $f(s,s) \geq f(s,s+1)$ . Using (2) and (3), we find this relation to take the explicit form

$$(N+1-2s) + (s-1)(s-2)/(N-2) \ge 0,$$

which is readily verified to hold for integral s, failing only in (N-1, N).

Now the matrix subgame is restricted to rows  $\lfloor s^* \rfloor$  and  $\lceil s^* \rceil$ , and to columns  $t \ge \max(\lceil \Theta \rceil, \lceil s^* \rceil) = \lceil s^* \rceil$ . Our continuous extension can therefore be restricted to the corresponding strip in the square  $[2, N] \times [2, N]$ , throughout which  $s \le t$ , so that  $A(s,t) = \frac{p}{2}F(s,t)$ . The first part of (14) now establishes strict convexity of A(s,t) in t for fixed s throughout the strip. Thus the restricted continuous game has a pure optimal strategy  $t^{**}$  for Player 2, and the remarks following Theorem 1 assure that the matrix game can be further limited to columns  $\lfloor t^{**} \rfloor$  and  $\lceil t^{**} \rceil$ . Since  $s^*$  remains optimal for Player 1 in the restricted continuous game,  $t^{**}$  can be identified as a minimizer of  $A(s^*,t) = \frac{p}{2}F(s^*,t)$  over  $[\lceil s^* \rceil, N]$ . Thus  $t^*$  coincides with  $t^*(s^*) = \tau^*(s^*)$  if the latter is  $\ge \lceil s^* \rceil$ ; if not, the convexity (in t) of  $A(s^*,t)$  identifies  $t^{**}$  as the nearest feasible point to the "relaxed minimizer"  $t^*(s^*)$ , i.e.,  $t^{**} = \lceil s^* \rceil$ .

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