## STICHTING

# MATHEMATISCH CENTRUM 

## 2e BOERHAAVESTRAAT 49

 AMSTERDAMAFDELING MATHEMATISCHE STATISTIEK

S 321
Ballot Problems
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Summary
In each of the sections 1 and 2 an extension is presented of a well－known result on Ballots，the CHUNG－FELLER theorem。

In section 3 two recurrence relations are obtained for the number of paths that do not overshoot a monotone but otherwise arbitrary boundary function．

0．Preliminaries to sections 1 and 2。
In a ballot with two candidates $A$ and $B$ ，let the total number of votes for $A$ be denoted by $a$ ，and the total for $B$ by $b$ ．It will always be assumed that each of the $\binom{a+b}{b}$ possible arrangements of the votes has probability $\binom{a+b}{b}^{-1}$ 。

Let $a_{m}$ be the number of votes for $A$ after $m$ votes have been count－ ed，and let $b_{m}=m-a_{m}$ ．

The counting process can be completely described by a path in a two－dimensional lattice of points（ $x, y$ ）where $x$ and $y$ are non－negative integers．To be explicit：the situation $a_{m}=x, b_{m}=y$ is represented by the point $(x, y)$ 。Consecutive points are joined by line segments，which will be termed sides of the path．

In section 1 and 2 we will consider，roughly speaking，the distrim bution of the number of steps above a given ine，which is either the line $x=y$ ，or the line $b x=a y$ 。 These lines will be denoted by $L$ and $D_{\text {，}}$ respectively。When $a=b, L$ coincides with $D$ ，and for this case FELLER and CHUNG［1］proved that the number of paths with exactly $2 j$ sides above $L$ is equal to

$$
\begin{equation*}
\frac{1}{a+1}\binom{2 a}{a} \quad(j=0, \ldots, a) \tag{1}
\end{equation*}
$$

independent of $j$ 。In section 1 ，the distribution of the number of sides above $L$ is derived for the case $a>b$ 。

When，instead of $L$ ，the line $D$ is considered，we have the difficul－ ty that a side of the path may be only partly above D．It will be shown in section 2 that，when $b \mid a$（and，of course，also when $a \mid b$ ），the length of the path above $D$ has a homogeneous distribution．

## 1．First extension

The problem of determining the distribution of the number of sides above $L$ is mentioned，in a slightly different formulation，in［2．］． It can be solved by a method，that has also been used by WHITWORTH $|3|$ for similar questions．

It can be assumed without restriction that $a>b$ 。Let $N_{j}(a, b)$ be the number of pathsthat have exactly $2 j$ sides above $L$ 。

Consider all paths for which（ $i, i$ ）is the last point in common with L．Then，from $(0,0)$ to $(i, i)$ there are $\frac{1}{i+1}\binom{2 i}{i}$ paths with exactly $2 j$ sides above $L$（provided $j \leq i$ ）。From（ $i, i$ ）to（ $a, b$ ）there are $\frac{a-b}{a+b-2 i}\binom{a+b-2 i}{b-i}$ paths that have no point in common with $L$ ，according to a classical ballot formula．Finally，the total number of paths that have exactly $2 j$ sides above $L$ is obtained by summing the product of the two above－mentioned expressions over all admissible values of $i$ ，that is：from $j$ to $b$ ，inclusive．Hence

$$
\begin{equation*}
N_{j}(a, b)=\sum_{i=j}^{b} \frac{1}{i+1}\binom{2 i}{i} \frac{a-b}{a+b-2 i}\binom{a+b-2 i}{b-i} \tag{2}
\end{equation*}
$$

Putting $j=0$ in（2），an alternative expression is obtained for the number $\frac{a+1-b}{a+1}\binom{a+b}{b}$ of paths with $a l l$ sides below $L$ ，and we have the identity

$$
\begin{equation*}
\sum_{i=0}^{b} \frac{1}{i+1}\binom{2 i}{i} \frac{a-b}{a+b-2 i}\binom{a+b-2 i}{b-i}=\frac{a+1-b}{a+1}\binom{a+b}{b} \tag{3}
\end{equation*}
$$

which will be of use in the next sub－section。

## 1．1 Asymptotic properties of $N(a, b)$

The probability $p_{j}(a, b)$ that a randomly chosen path has $2 j$ sides above $L$ is is given by

$$
\begin{equation*}
p_{j}(a, b)=N_{j}(a, b) \cdot\binom{a+b}{b}-1 \tag{4}
\end{equation*}
$$

We will let $a$ and $b$ tend to infinity in such $a$ way that $\frac{a}{b}$ tends to a constant value $\lambda>1$ 。 The corresponding limiting values of $p_{j}(a, b)$ will be denoted by $p_{j}(\lambda)$ 。

From（2）and（3）it follows that
$p_{j}(\lambda)=\lim \left\{\frac{a+1-b}{a+1}-\sum_{i=0}^{j-1} \frac{1}{i+1}\binom{2 i}{i} \frac{a-b}{a+b-2 i}\binom{a+b-2 i}{b-i}\binom{a+b}{b}-1\right\}=$
$=\frac{\lambda-1}{\lambda}-\frac{\lambda-1}{\lambda+1} \sum_{i=0}^{j=1} \frac{1}{i+1}\binom{2 i}{i} \lim \frac{a!}{(a-i)!} \frac{b!}{(b-i)!} \frac{(a+b-2 i)!}{(a+b)!}$,
whence
$p_{j}(\lambda)=\frac{\lambda-1}{\lambda}-\frac{\lambda-1}{\lambda+1} \sum_{i=0}^{j-1} \frac{1}{i+1}\binom{2 i}{i}\left\{\frac{\lambda}{(\lambda+1)^{2}}\right\} i$

A slightly different formula for $p_{j}(\lambda)$ may be obtained as follows． The series

$$
\sum_{0}^{\infty}\binom{2 i}{i} x^{i}=(1-4 x)^{-\frac{1}{2}}
$$

is uniformly convergent when $|x| \leqslant|\xi|<\frac{1}{4}$ ，so it may be integrated term by term：

$$
\begin{equation*}
\sum_{0}^{\infty} \frac{1}{i+1}\binom{2 i}{i} x^{i}=\frac{1-(1-4 x)^{\frac{1}{2}}}{2 x} \tag{6}
\end{equation*}
$$

If we substitute $x=\frac{\lambda}{(\lambda+1)^{2}}$ into（6），we see that ${ }^{1 \text { ）}}$

$$
\begin{equation*}
\sum_{0}^{\infty} \frac{1}{i+1}\binom{2 i}{i}\left\{\frac{\lambda}{(\lambda+1)^{2}}\right\}^{i}=\frac{\lambda+1}{\lambda}, \tag{7}
\end{equation*}
$$

1）Actually，the result is $\frac{(\lambda+1)^{2}-(\lambda+1) \sqrt{(\lambda-1)^{2}}}{2 \lambda}$ ，which is $\frac{\lambda+1}{\lambda}$ when $\lambda>1$ ，and $\lambda+1$ when $0<\lambda<1$ ．This explains the＂contradiction＂that， for $\lambda=0$ ，the left side of（ 7 ）is convergent，whereas the right hand side is infinite。
whence ${ }^{2}$

$$
\begin{equation*}
\left.p_{j}(\lambda)=\frac{\lambda-1}{\lambda+1} \sum_{i=j}^{\infty} \frac{1}{i+1}\binom{2 i}{i} \frac{\lambda}{(\lambda+1)^{2}}\right)^{i} \tag{8}
\end{equation*}
$$

In order to determine the generating function of $p_{j}(\lambda)$,

$$
\begin{equation*}
P(x, \lambda)=\sum_{j=0}^{\infty} p_{j}(\lambda) x^{j} \tag{9}
\end{equation*}
$$

first consider

$$
\begin{equation*}
\left.q_{i}(\lambda)=\frac{1}{i+1}\binom{2 i}{i} \frac{\lambda}{(\lambda+1)^{2}}\right\}^{i} \tag{10}
\end{equation*}
$$

The quickest way to find $Q(x, \lambda)=\sum q_{i}(\lambda) x^{i}$ is to replace $x$ in (6) by $\frac{\lambda x}{(\lambda+1)^{2}}:$

$$
\begin{equation*}
Q(x, \lambda)=\frac{(\lambda+1)^{2}-(\lambda+1) \sqrt{(\lambda+1)^{2}-4 \lambda x}}{2 \lambda x} \tag{11}
\end{equation*}
$$

Using (8) and a derivation similar to that in [4], p.249, it follows from (11) and the relation between $p_{j}(\lambda)$ and $q_{j}(\lambda)$ that

$$
\begin{equation*}
P(x, \lambda)=\frac{(\lambda-1) \sqrt{(\lambda+1)^{2}-4 \lambda x-(\lambda-1)^{2}}}{2 \lambda(1-x)} \tag{12}
\end{equation*}
$$

$P(x, \lambda)$ may be written as a power series in 1-x:
$P(x, \lambda)=1-\frac{\lambda(1-x)}{(\lambda-1)^{2}}+\frac{2 \lambda^{2}(1-x)^{2}}{(\lambda-1)^{4}}-00+(-1)^{i} \frac{1}{i+1}\binom{2 i}{i}\left\{\frac{\lambda(1-x)}{(\lambda-1)^{2}}\right\}^{i}+\ldots 0$

From (13) it follows that $P^{\prime}(1, \lambda)=\frac{\lambda}{(\lambda-1)^{2}}$,ioe. in the limiting
case, the average number of sides above $L$ is

$$
\begin{equation*}
M(\lambda)=\frac{2 \lambda}{(\lambda-1)^{2}} \tag{14}
\end{equation*}
$$

2) I am indebted to Mr 。W. van CWET who pointed out an error in an earlier version of the proof of (8), and suggested some ways of improving it.

## 1．2 Some numerical results

For finite $a$ and $b, a>b$ ，the average number of sides above $L$ is

$$
\begin{equation*}
M(a, b)=\sum_{1}^{b} i\binom{2 i}{i} \frac{a-b}{a+b-2 i}\binom{a+b-2 i}{b-i}\binom{a+b}{b}^{-1} \tag{15}
\end{equation*}
$$

as can be easily verified from（2）。
With the aid of（15），$M(2 b, b)$ has been computed for some values of $b$ 。The results are presented below。 For $b \geqslant 8$ ，the X1 computer has been used．It is seen that the convergence to the limiting value 4 is very slow。

| b | $M(2 b, b)$ | b | $M(2 b, b)$ |
| :---: | :---: | :---: | :---: |
| 1 | 0.6667 | 8 | 2.1680 |
| 2 | 1.0667 | 9 | 2.2681 |
| 3 | 1.3571 | 10 | 2.3568 |
| 4 | 1.5838 |  |  |
| 5 | 1.7682 | 17 | 2.7805 |
| 6 | 1.9224 | 25 | 3.0512 |
| 7 | 2.0534 | 40 | 3.3259 |

Table 1
$M(2 b, b)$ for some values of $b$

## 2．Second extension。

As stated before，is this section we will consider the distrib－ ution of $I$ ，the length of the part above $D$ of a randomly chosen path。 Let us first look into the values that can be taken on by 1 for arbitrary integers $a$ and $b$ ．It is easily shown that

$$
P[I=1]>0 \text { implies } I=\frac{k(a+b)}{\left[a_{\theta} b\right]}
$$

where $[a, b]$ is the $l_{0} c o m$ of $a$ and $b$ ，and $k$ is integer with $0 \leqslant k \leqslant[a, b]$ ．Consider fig。1。


Figure 1

The part above $D$ of any path may be divided in pieces that lie entirely above $D$ ，except for their endmpoints．The length of such a piece equals

$$
Q R+Q S=j-\frac{b i}{a}+\frac{a j}{b}-i=(a+b)\left(\frac{j}{b}-\frac{i}{a}\right),
$$

where $i$ and $j$ are the coordinates of $Q$ ．Multiplication of the second factor by $[a, b]$ yields an integer，hence $Q R+Q S$ can be written in the form $\frac{k(a+b)}{[a, b]}$ ，and the same is true for the sum of a number of these lengths。

It follows that in the special case $b \mid a$ the possible values for 1 are $0, \frac{a+b}{a}, 2, \frac{a+b}{a}, 000, a \frac{a+b}{a}$ ．In this cases for a randomly chosen path，each of these values has probability $\frac{1}{a+1}$ ．The proof，an outline of which will be given below，is along the same lines as that by HODGES［5］of the CHUNG $m$ FELLER theorem．Instead of 1 the variakle $k$ ， as defined above，will be used．

The basic idea is to prove the existence of a one－to－one mapping of paths with $k=k>0$ onto paths with $k=k=1$ 。Consider an arbitrary path with $k=k>0$ 。 Let $P$ be the first point（excluding the origin）on the path which either lies on $D$ ，or has the property that the side starting at $P$ has an intemior point in common with $D{ }^{1)}$ ．There are two cases to be considered：

I The path has points above $D$ between $P$ and $(a, b)$
II Between $P$ and（ $a, b$ ）the path is entirely below $D$ 。

1）From b／a it follows that $P$ is necessarily below $D$ in the latter case。

In case $I$ the mapping is as follows：between the origin and $P$ the path is left as it is；on the part between $P$ and（ $\mathrm{a}, \mathrm{b}$ ）the mapping is again applied 。This inductive definition may cause difficulties only when $P$ is strictly below $D_{8}$ as in fig 2．In a situation like this the mapping be applied as if $D$ had a pit near $P$ ，as indicated in fig 2。


Figure 2

In case II the first side of the path can only be vertical， and the side that has $P$ as its end－point must be horizontal。Also， $P$ lies on $D$ in this case。Hence，using a selfeexplanatory notation， the path is of the form $v W_{1} h W_{2}$ where $P$ separates $h$ and $W_{2}$ ．The mapping changes this into $\mathrm{hW}_{2} \mathrm{vW}_{9}$ 。 It remains to be shown that every path with $\mathrm{k}>0$ has a uniquely determined image，that the length is always diminished by 1 （in terms of $\underline{k}$ ），and that the inverse image exists and is unique．We will not enter into the details，except for noting that an additional complication，as compared to the case $\mathrm{a}=\mathrm{b}$ ，is to prove that when II applies，$W_{1}$ has no points below $D$ after being inter－ changed with $W_{2}$ 。

When neither of a and b divides the other，the distribution of $\underline{k}$ is no longer homogeneous（in general），and very little more can be said．It is to be expected from GROSSMAN＇s formula ${ }^{1)}$（cf［6］）for the number of paths that have no point above $D$ ，that the answer will be complicated．In the case：$a$ is odd，$b=2$ ，the distribution is a mixture of＂triangular＂distributions，as exemplified by fig 3．This can be

1）Proved by BIZLEY［7］．

shown by considering $k$ as a function of the places of the（two） vertical sides of the path．

## 3．Two recurrence relations

Let $f_{0}, f_{1}, 00$ be a non decreasing sequence of positive integers， and let $N_{r}$ be the number of paths from $(0,0)$ to（ $r_{,} f_{r}$ ）with the property that（ $r_{\Omega} f_{r}$ ）is the first point（ $i_{,} f_{i}$ ）on the path。 Such paths will be called permitted paths to（ $r, f_{r}$ ）。For $r+f_{r}$ the abbreviation $h_{r}$ is used。

Theorem 1．$N_{r}$ satisfies the recurrence

$$
\begin{equation*}
N_{r}=\binom{h_{r}}{r}=\sum_{i=0}^{r_{\infty}^{\infty}}\binom{h_{r}-h_{i}}{r-i} N_{i} \tag{16}
\end{equation*}
$$

Proof．The number of all paths to（ $r_{\nu} f_{r}$ ）is $\binom{h_{r}}{r}$ ．The non－ permitted paths may be distinguished by the first point（ $i_{\nu} f_{i}$ ）on it． The number of such paths is $N_{i}$ times $\binom{\mathrm{h}_{\mathrm{r}}=\mathrm{h}_{\mathrm{i}}}{\mathrm{r}=\mathrm{i}}$ ，and the theorem follows．

Perhaps less trivial is the following
Theorem 2．$N_{r}$ satisfies the recurrence

$$
\begin{equation*}
\sum_{i=0}^{r}(-1)^{i_{N}}\binom{f_{i}}{r-i}=0 \quad(r>0) \tag{17}
\end{equation*}
$$

Proof．Consider the right hand end points of the horizontal steps of a path．These points constitute a non－decreasing function $y_{i}$ defined on $\{1,000, r\} 。 y_{0}$ is defined as 0 。

For a function corresponding to a permitted path we have

$$
\begin{equation*}
y_{i}<f_{i=1}, \quad i=1,000, r \tag{18}
\end{equation*}
$$

We now define a more general type of functions，viz。functions that satisfying（18）and

$$
\begin{align*}
& y_{0} \leqslant y_{q} \leqslant 00 \leqslant y_{j}  \tag{19}\\
& y_{j}>y_{j+1}>\ldots \circ>y_{r} \tag{20}
\end{align*}
$$

for some value of $j$ 。These functions will be termed $j$－sequences． Let $A_{j}$ be the number of $j$－sequences（ $r$ is fixed）。As $y_{0}=0$ cannot exceed $y_{1}$ ，we have $A_{0}=0$ 。Also，$A_{r}=N_{r}$ 。

Now both the $j$－sequences and the $(j+1)$－sequences have properties （18），（19），and

$$
\begin{equation*}
y_{j+1}>y_{j+2}>\ldots 0>y_{r} \tag{21}
\end{equation*}
$$

Conversely，a function satisfying（18），（19）and（21）must be either a $j$－sequence or $a(j+1)$－sequence．The number of functions having properties（18），（19）and（21）is equal to $N_{j}\binom{f_{j}}{r-j}$ ，the second factor being the number of ways in which the $r=j$ values $y_{j+1}, 000, y_{r}$ can be chosen to satisfy（21）and $y_{j+1}<f_{j}$ 。Hence

$$
\begin{equation*}
N_{j}\binom{f_{j}}{r-j}=A_{j}+A_{j+1} \tag{22}
\end{equation*}
$$

From（22）it follows that

$$
\begin{equation*}
\sum_{j=0}^{r-1}(-1)^{j} N\binom{f_{j}}{r-j}=\sum_{j=0}^{r-1}(-1)^{j}\left(A_{j}+A_{j+1}\right)=(-1)^{r-1} A_{r}=(-1)^{r-1} N_{r} \tag{23}
\end{equation*}
$$

and theorem 2 is proved.

## Application:

The classical ballot problem of "weak sense lead throughout" is equivalent to the case $f_{i}=\min \left(i+1_{8} b+1\right)$ where $b$ is the number of votes obtained by the loser。 If both candidates obtain the same number of votes, $N_{i}=\frac{1}{i+1}\binom{2 i}{i}$, whence the identity

$$
\begin{equation*}
\sum_{i=0}^{r} \frac{(-1)^{i}}{i+1} \quad\binom{2 i}{i}\binom{i+1}{r-i}=0 \quad(r>0) \tag{24}
\end{equation*}
$$

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