H. Anis<br>(Senior Member, IEEE) Electrical Engineering Dapartment Cairo University<br>EGYPT

Abstract - The Monte Carlo method is applied to diverging field problems. The computational effort-expressed in this work by the number of steps in random walks-is related to the relative space potential, the prespecified walk termination distance and the degree of field nonuniformity in the gap. To obtain potential and field distributions in a given system, equations for these quantities are developed at neighbouring space points using Green's function. The accuracy of the algorithm is markedly enhanced by seeking the optimal spacing of those neighbouring points. The present technique is satisfactorily compared with the charge simulation method in a case study on hemispherically capped rod plane gap.

## I. INTRODUCTION

Calculations of potentials or fields are needed for many problems in electrical power engineering as well as in heat conduction and fluid dynamics. The mathematical techniques needed are well known but are often difficult to apply in the complicated threedimensional geometries that arise in practice. It is difficult to use finite element or finite difference methods to calculate electric potentials or fields near a high voltage transmission tower, or stress control fitting, because of the large number of mesh points or nodes needed to give an adequate representation of the geometry. The charge simulation method may likewise require the use of a large number of trial charges. The Monte Carlo method gives a convenient and flexible means of tackling these and similar problems in electrical power engineering $[1,2,3]$ Mathematically, the Monte Carlo method solves the Dirichlet's problem by finding the potential and gradient which satisfies Laplace's equation within a given region and takes specified values on its boundary.

Basically, if the potential at a given point in space is required, a series of random walks is constructed starting at that point and reaching for a boundary where the potential is known. The average of the potentials gathered by this series of walks is a statistical estimate of the unknown potential of the point.

## II. IMPLEMENTATION OF MONTE CARLO METHOD

The Monte Carlo method is implemented by Initiating a series of random walks from the point in space where potential is to be evaluated. Each walk i will end when it reaches a boundary of a known potential $\mathrm{V}_{r_{i}}$. Based on N random walks the estimated potential of the point is

$$
\begin{equation*}
v_{r}=\frac{1}{N} \sum_{i=1}^{N} v_{r_{i}} \tag{1}
\end{equation*}
$$

In the floating random walk the length of the step is equal to the distance between the point and the nearest boundary. Random number generators determine the direction of the step.

## M. ABDALLAH

Electrial Engineering Department Zagazig University Shoubra, Egypt

The floating random walk procedure is applied to a three dimensional geometry by assuming a homogeneous spherical region with center at $(x, y, z)$ and with radius $r$. The exact solution for the potential distribution $v(r, w, \phi)$ on the boundary based on the mean value theorem is as follows:

$$
\begin{array}{cc}
v(x, y, z)=\int_{0}^{1} \int_{0}^{1} v(r, w, \phi) d F d G  \tag{2}\\
\text { In which } \quad F=w / 2 \pi,^{2} \quad G=0.5(1-\cos \phi)
\end{array}
$$

where $w$ and $\phi$ are, respectively, the polar coordinate angle and the cone angle in a spherical coordinate system. The functions $F$ and $G$ are probability distribution corresponding to $w$ and $\phi$.

A probabilistic interpretation of eqns. (2) indicates that a random walk instantaneously at (xi,yi, ii), will step to a new position on the circumference of the surrounding sphere in accordance with the probabilities $F$ and G.As $N \rightarrow \infty$, the solution obtained from the floating random walk technique will approach the exact solution. A boundary is said to have been reached if the walk comes within a small distance $H$ from it [4].

The potential. $V_{p}$ of a point at a position $r_{p}$ is related to that of a point at $r_{0}$ by [4]

$$
\begin{equation*}
v_{p}=\frac{1}{N} \sum_{i=1}^{N} w\left(r_{p}, r_{o}, r_{i}^{\prime}\right) v_{r i} \tag{3}
\end{equation*}
$$

where, $r_{i}$ is the first step in the $i$ th walk; $V_{r_{i}}$ as in eq. (1) is the potential of the boundary reached by the ith walk; $w$ is a weight function derived from Green's function as [4]

$$
\begin{equation*}
w=\frac{a\left(a^{2}-f r_{p}-\left.r_{o}\right|^{2}\right)}{\left|r_{p}-r_{i}^{\prime}\right|^{3}} \tag{4}
\end{equation*}
$$

where $a$ is the distance between the initial point at $r_{0}$ and the nearest boundary.

Therefore, the electric field is derived from eq: (3) to be

$$
\begin{equation*}
E_{p}=-\nabla V_{p}=\frac{-1}{N} \sum_{i=1}^{N} \nabla w \cdot v_{r i} \tag{5}
\end{equation*}
$$

The present work shows that estimated potentials and fields at neighbouring points are sensitive to the distance between points $r_{0}$ and $r_{p}$ and optimal selection of that distance is, thus, called for.
III. SENSITIVITY ANALYSIS

The time and cost of computation using a monte carlo method depends directly on the product of the predetermined number of walks $N$ by the average number of steps per walk $S_{W}$. The latter, in turn, depends on: * (1) The relative potential itself at the Iocation in question.
(2) The degree of field nonuniformity.
(3) The walk termination distance H .

In order to investigate the effects of the above factors with certainty a standard analytically-solved configuration is chosen, namely, the case of coaxial cylinders.

The potential, at a point in a coaxial cylinder space is successively computed as the number of walks is increased. The rootmean square sampling error in the estimated potential $\mathrm{V}_{\boldsymbol{r}}$ decreases as the number of walks is increased according to [5]

$$
\begin{equation*}
S=\left[\frac{1}{N} \sum_{i=1}^{N}\left(v_{r_{i}}^{2}-v_{r}^{2}\right) /(N-1)\right]^{\frac{1}{2}} \tag{6}
\end{equation*}
$$

The effect of N is manifested in Fig. (1) plotted for a coaxial system of outer-to-inner radii ratio of $\psi \div 50$. The computed potentials are fluctuating about its known true value.


Fig. (1) Potential estimation by Monte Carlo
A. Relation of the Number of Steps Walk to Potential

The relation between the number of steps per walk Sw and the relative potential V is sought by applying the Monte Carlo algorithm at points of different relative potentials in the range 0 to 1.0 . The average number of steps per walk was seen to be maximum at $\mathrm{V}=0.5$ and decreases towards zero when V approaches the zero or 1.0 values. Based on the fact that the variance of a binomial distribution is $\theta(1-\theta)$ where $\theta$ is the probability of success [5], and bearing in mind that Sw reflects the "hesitation" in reaching a final boundary, the quantity $S w$ is assumed to be related to space potential by

$$
\begin{equation*}
S w=K v(1-v) \tag{7}
\end{equation*}
$$

where $v$ is the relative space potential, and $K$ is a constant. Several computer runs at $v=0.5$ for various cases were made and the average $S_{w}$ is used to compute K. The variation of Sw with space potential for different field nonuniformity $(\psi)$ and different termination distance $H$ are shown in Figs. (2) to (3).


Fig. (2) Effect of potential and $\psi$ on number of random steps


Fig. (3) Effect of potential and $H$ on number of random steps

## B. Relation of Sw to the Degree of Field Nonuniformity

The relation between the number of steps per walk Sw at a relative space potential of 0.5 (which is recognized as the maximum number of steps per walk Sw of a given case) and the ratio $\psi$ could be fitted to the semi-logarithmic relationship:

$$
\begin{equation*}
S \mathrm{w}=\mathrm{a} \log (\psi)+\mathrm{b} \tag{8}
\end{equation*}
$$

It is seen in Fig. (4) that a is appoximately constant for different termination distances, and thus the relation between $S w$ and $\log (\psi)$ for various values of termination distances appear as parallel straight lines.


Fig. (4) Variation of number steps with field nonuniformity
C. Relation of $S w$ to the Termination Distance $H$

The relation between the maximum number of steps per walk Sw (occurring at a relative space potential of 0.5 ) and the termination distance $H$ could also be fitted to the semi-logarithmic straight line equation.

$$
\begin{equation*}
S w=c \log (H)+d \tag{9}
\end{equation*}
$$

It is noticed in Fig. (5) that $c$ for different values of $\psi$ is approximately unchanged while the constant $d$ has a strong dependence on the degree of field non-uniformity $\psi$.
IV. OPTIMAL SELECTION OF NEIGHBOURING POINTS

The use of Green's function implies that if a series of random walks gives an estimate of a relative potential $v$ at a point $r$ it also contains information about the potentials at points in the neighbourhood of $r$, namely $r_{p}$ as explained earlier in eqn. (3).
As $r_{p}$ approaches the surface of the sphere of the first step in the walk the estimate $\mathrm{V}_{\mathrm{p}}$ becomes dominated by a few random walks with large weighting factors and its accuracy falls off [4]. At distances $r_{p}-r$ larger than half the radius of the first step the accuracy also diminishes markedly.


Fig. (5) Variation of number of steps with $H$.

In this work an attempt is made to detect the influence of the spacing between $r$ and $r_{p}$ on the accuracy of the potential estimation. This attempt will help determine the optimal choice of the sequence of points whenever the potential distribution along a particular line in space is required. Fig. (6) shows, for a case of known potential distribution, namely coaxial cylinders, the variation of the error in estimated relative space potential with the spacing $z=r_{p}-r$. It appears that for sufficiently low spacing $z$ the potential error is large and negative (i.e. the estimated potential is less than its true value). The error decreases in magnitude until it vanishes in the shown case at $z=15 \%$. Thereafter, the error becomes positive and continues to increase with $Z$. The value of $z$ at which the potential error is zero is recorded for many cases.

Fig. (7) shows that the relation between the optimum distance $Z_{v}$ and the relative space potential $v$ is nearly linear over the potential range of 0.7-1.0 which is considered to be of prime importance to high voltage technology. At potentials below 0.7 the relationship becomes slightly nonlinear.

The above analysis was by necessity performed on an analytically solvable case namely the case of coaxial cylinders. The applicability of the computed optimal distances between neighbouring points is sub-stantiated-towards the end of this paper-when a general non analytically solvable case is treated.

## V. OPTIMAL DISTANCES FOR FIELD COMPUTATION

The electric field at any point in space can be evaluated according to eq. (5) which is based on the choice of a point $r_{p}$ in the neighbourhood of the target point r. This choice is also found to influence the accuracy of the computed field significantly Fig. (8) illustrates-for a typical case-how the above choice of distance $z$ affects the error in the computed field.


## VI. STUDY CASE

It is meant to verify the ability of the Monte Carlo method, in general, and the presently developed improvements, in particular, to handle a typical high voltage problem. The rod-to-plane gap, one of the most basic arrangements in high voltage research, is chosen for this purpose. This non-uniform field configuration has been a suitable tool for experimental observation due to the local confinement of prebreakdown ionization around the stressed electrode. Field knowledge will certainly help explain many gaseous ionization phenomena and elucidate the processes of gas breakdown. The solution is compared to those given by the Charge simulation method and also the tank model experimental technique.

## A. Gap Arrangement

The rod-to-plane gap is seen in Fig. (10). The rod electrode is standardized as a cylindrical shaft with a hemispherical tip of equal diameter of 2 .


Fig. (10) rod-to-plane gap
Table $I$ The potential and field distributions on the critical field line for $G=200$

| Distance <br> from <br> plane | Charge simulation <br> ref.[6] | improved Monte Carlo method |  |  |
| :--- | :---: | :---: | :---: | :--- |
|  | $\mathrm{v}(\mathrm{p} . \mathrm{u})$ | Ep(p,u) | $\mathrm{v}(\mathrm{p} . \mathrm{u})$ | $\mathrm{Ep}(\mathrm{p} \cdot \mathrm{u})$ |
| 199.9 | 0.9463 | 0.4884 | 0.9467 | 0.4981 |
| 199.8 | 0.9015 | 0.4118 | 0.9343 | 0.4119 |
| 199.7 | 0.8634 | 0.3528 | 0.8657 | 0.3517 |
| 199.6 | 0.8305 | 0.3064 | 0.8514 | 0.3040 |
| 199.5 | 0.8018 | 0.2691 | 0.7946 | 0.2673 |
| 199.4 | 0.7765 | 0.2387 | 0.8019 | 0.2359 |
| 199.3 | 0.7539 | 0.2136 | 0.7612 | 0.2115 |
| 199.2 | 0.7336 | 0.1927 | 0.7437 | 0.1904 |
| 199.1 | 0.7157 | 0.1749 | 0.7287 | 0.1750 |
| 199.0 | 0.6985 | 0.1597 | 0.7101 | 0.1601 |

Table II Comparison of the potential calculated by three methods. For $\mathrm{G}=160$

| Distance <br> from <br> plane | Charge simulation ref. [6] | improved Monte Carlo method | Tank model |
| :---: | :---: | :---: | :---: |
| 159.9 | 0.9453 | 0.9567 | 0.933 |
| 159.8 | 0.8996 | 0.9133 | 0.897 |
| 159.7 | 0.8607 | 0.8567 | - |
| 159.6 | 0.8272 | 0.8567 | ----- |
| 159.5 | 0.7980 | 0.8033 | 0.824 |
| 159.4 | 0.7721 | 0.7667 | ----- |
| 159.3 | 0.7491 | 0.7700 | ----- |
| 159.2 | 0.7285 | 0.7267 | ----- |
| 159.1 | 0.7097 | 0.7200 | ----- |
| 159.0 | 0.6927 | 0.7167 | 0.725 |
| 158.0 | 0.5779 | 0.5733 | - |
| 157.0 | 0.5125 | 0.5233 | 0.556 |
| 156.0 | 0.4680 | 0.4967 | -- |
| 155.0 | 0.4349 | 0.4400 | 0.483 |

The Charge simulation method was applied to the study arrangement by Abou-Seada and Nasser [6]. They used one point charge located at the center of the hemispherical portion of the boundary and a nine semin infinite line charges located along the axis of the cylindrical portion. Also seven boundary points were selected.

Meanwhile, a computer program is written which applies the principles and recommendations reached in this paper to improve the Monte Carlo application. A floating random walk procedure was followed in which the optimal spacing among neighbouring points as determined above is put to use.

In Table I it is shown that the results of the Monte Carlo method are very close to those obtained by the Charge simulation method. The computing effort made during the present Monte Carlo application is relatively very small. Typically, the determination of the potential and field at any one point-near the rod tip-required a total of 100 walks equivalent to about 2 seconds on a VAX-11/780 computer.

In Table II a comparison is made among the results taken from the Charge simulation method, the present approach, and those measured experimentally using a tank model for a gap ratio of 160 [6]. It appears that the results obtained with the present technique are even closer to those of the tank model than the results of the Charge simulation method.

## VII. CONCLUSIONS

(1) The computational effort expressed primarily by the number of steps per walk is found to be strongly dependent on several factors, namely, the relative space potential at the location in question, the degree of field nonuniformity and walk termination distance.
(2) The maximum number of steps per walk is encountered at a relative space potential of 0.5 and decreases towards zero when the potential approaches zero or 1 values.
(3) The maximum number of steps per walk increases linearly with the logarithm of the field nonuniformity factor.
(4) The maximum number of steps per walk increases linearly with the logarithm of the termination distance.
(5) The use of Green's function gives direct estimates of fields and allows each random walk to contribute directly to estimates of the potential and field at more than one point.
(6) The error in the estimated potential and field of a neighbouring point is minimum at some optimal distance between the target point ro and that neighbouring point rp.
(7) The optimality results obtained with coaxial systems are found to be very well applicable in other, non-analytically solvable, three-dimensional systems such as a rod-plane gap.
(8) Excellent agreement is obtained when the results of the present technique are compared to those of the charge-simulation method as applied to a hemispherically capped rod-plane gap.
VIII. REFERENCES
[1] Herbert A. Meyer, Symposium on Monte Carlo method, Wiley,New York, 1963.
[2] Haji-Sheikh, Sparrow, "The solution of heat conduction problems by probability methods", Trans. Aseme.. ser. c, J. heat transfer., C-89, pp. 121-131, 1967.
[3] M.D.R. Beasly, et. al., "Comparative study of three methods for computing electric field", Proc. IEE; Vol. 126, pp. 126-134, January 1979.
[4] J.H. Pickles, "Monte Carlo field calculations", Proc. IEE, Vol. 124, pp. 1271-1276, December 1977.
[5] Sideny J. Yakowitz, Computational Probability and simulation, Addison-Wesley Publishing Company, London, 1977.
[6] M.S. Abou-Seada, E. Nasser, "Digital Computer Calculation of the electric potential and field of a rod-gap", IEEE Transactions On Power Apparatus and systems, Vol. 56, pp. 813-820, May 1968.

