

## SOLAR RADIATION ESTIMATION TECHNIQUES: THE REVIEW

**Amar Choudhary, Dr. Deependra Pandey**

<sup>1</sup>Ph.D. Scholar (2017-21), Department of E&CE, ASET, Amity University, Lucknow

<sup>2</sup>Asst Professor, Department of E&CE, ASET, Amity University, Lucknow

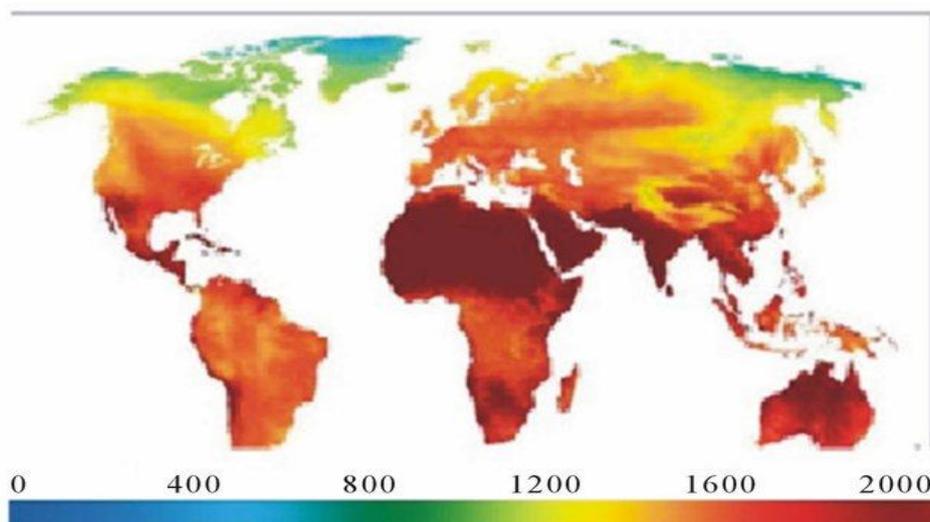
### ABSTRACT

*Efficient utilization of solar energy is a great challenge to the researchers. Practically measurement of solar radiation at various locations for long time using measuring devices is a costly and difficult assignment. This paper gives the brief idea behind modeling of global solar radiation. Also, challenges behind radiation modeling and statistical evaluation methodologies are addressed.*

**Keywords—MAPE, MBE, Pyrheliometer, Pyranometer, Radiometer, RMSE, Solarimeter, TS.**

### I. INTRODUCTION

Energy (Power) is always an integral part of human being. As time passes the dependency on power is increasing day by day. One can not imagine toady's life without power. Coal, Fossil fuels, Energy from petroleum products were the main source of energy up to 20<sup>th</sup> century. But due to their limited availability and environmental constraints, it became necessary to think of the use alternative/ renewable source of energy. Sun, Wind, Rain, Tides, Waves and Geothermal Heat are the main source of renewable energy. Because of abundance and non-pollutant, Solar Energy is considered to be most preferable. Energy demand of the world for a whole year may be met with a single hour of solar radiation which is approximately 1, 20,000 TW [1] [2].



**Fig. 1: World Solar Energy Potential (kW/m<sup>2</sup>/year)**



The National Aeronautics and Space Administration (NASA) releases map of World Solar Energy potential (fig 1), which significantly provides the ample potential of Solar Energy. So, in 21<sup>st</sup> century the maximization of Renewable Energy is going on. Solar radiation data provides the amount of Solar Energy that strikes the earth surface. Solar Energy have two parts: Global Solar Energy which is under the atmosphere and Extraterrestrial Solar Energy which is above the atmosphere. Global Solar Energy may have diffuse and direct beam Solar Energy. Direct beam solar radiation is measured by Pyrheliometer whereas diffuse Solar Energy is measured by Solarimeter, Pyranometer, Radiometers etc. [3]. These are the devices by which the Solar Radiation can be measured practically. Section II and III gives review of empirical models and soft computing based models respectively. Also, section IV and V provides brief information of challenges in modeling of solar radiation and methods of model evaluation is also elaborated.

## II. EMPIRICAL MODELING OF GLOBAL SOLAR RADIATION

There are several meteorological stations throughout the world which measures global solar radiation. Practically measured data is always most accurate but it is not easily available. Also, deployment of measuring devices and recording the data is a costly task. Considering this various models have been proposed and developed based on various meteorological parameters such as sunshine duration, cloud cover, ambient temperature, atmospheric pressure, wind speed, relative humidity etc. to predict global solar radiation well before. Some of them are empirical models which uses mathematical formulae. Some models are developed based on atmospheric characteristics and satellite data such as ozone absorption, Rayleigh scattering for estimation of solar radiation. In all the solar radiation estimation models, the meteorological parameters are the input and radiation data is the output. So, based on input, the models may be classified in following categories [4]:

1. Based on Sunshine.
2. Based on Cloud.
3. Based on Temperature.
4. Based on other Parameter.

### A. MODELS BASED ON SUNSHINE

For estimation of Global Solar Radiation, Sunshine duration is the most commonly used. Using this, several models have been developed. Some of them are reviewed as under:

#### Model 1: Angstrom-Prescott model

This is deemed as the first radiation solar estimation model, developed in 1924 by Angstrom [5]. The global solar radiation is related with clear sky index as:

$$(1)$$

$$(2)$$

As in equation (1) is not easily determinable so Prescott [6] has modified it as



**Model 2: Glower and Mc-Culloch model**

Considering the effect of effect of latitude of the site ( $\phi$ ) as additional input, the below equation has been given as[7]:

(3a)

(3b)

Nomenclature

daily global solar radiation on horizontal surface averaged monthly.

extraterrestrial radiation on horizontal surface averaged monthly.

daily bright sunshine duration averaged monthly.

maximum averaged monthly possible daily sunshine duration.

regression coefficients

latitude of location

solar zenith angle

mean max. min. daily temperature

cloud factor

number of days in each month

precipitable water vapor per unit volume of air

hourly beam & diffused beam

mean relative humidity

mean bias error

mean absolute percentage error

route mean square error

test statics

total number of observations

$i^{\text{th}}$  observed value of global radiation

$i^{\text{th}}$  calculated value of global radiation

**Model 3: Rietveld model**

This model claims to be applicable for calculation of global solar radiation across the globe is given as [8]:

(4)



#### Model 4: Page model

Page model also claims its applicability throughout the world. It provides coefficients of modified Angstrom model [9]:

$$(5)$$

Likewise, 35-45 (approximately) models are there based on sunshine duration [4]. To keep the paper condensed they are not explained here.

#### B. CLOUD BASED MODELS

Cloud plays most important role in restricting sun shine to reach the earth surface. Cloud causes reduction of solar radiation reaching the earth surface. Satellites, routinely records cloud data which is used to develop or design various solar radiation estimation models.

#### Model 1: Black model

Taking data from various part of world Black developed quadratic equation [10]:

$$(6)$$

C is the average of total cloud covered in day time hours.

#### Model 2: Paltridge and Proctor model

Taking solar zenith angle ( $\theta$ ), day length ( $S_0$ ) and cloud factor (CF) as input, Paltridge developed the new model as [11]:

$$H = (1 - CF) \int_{\text{sunrise}}^{\text{sunset}} I_b(\theta) d\theta \quad (7)$$

$$I_b = 3.422 \quad (7a)$$

$$I_d = 0.00913$$

(7b)

$$CF = \frac{(n_1) + 4.5(n_2) + 7.5(n_3)}{8(n_1 + n_2 + n_3)}$$

#### Model 3: Badescu model

The correlations given by Badescu is given by [12]:

$$(8a)$$

$$(8b)$$

$$(8c)$$

Later on Daneshyar model and Paltridge model was modified by Sabziparvar [13].

#### C. TEMPERATURE BASED MODELS

Daily maximum and minimum temperature is more easily available comparative to sunshine duration and cloud data. Considering this 16-20 models has been developed [4]. Some of them are listed below.



**Model 1: Hargreaves and Samanimodel**

Hargreaves gives simple equation to estimate solar radiation considering maximum and minimum temperature [14]:

$$(9)$$

For coastal regions  $a = 0.19$  and for interior region  $a = 0.16$

**Model 2: Hunt et al. model**

This is the modified Hargreaves model by adding an additional coefficient (b) [15]:

$$(10)$$

**Model 3: Mahmood and Hubbard model**

Based on maximum and minimum air temperature following model was proposed [16]:

$$(11)$$

Model 4: Chen et al. model

Following model [17] was proposed by Chen et al.:

$$(12a)$$

$$(12b)$$

**D. OTHER PARAMETER BASED MODELS**

Accurate prediction of global solar radiation needs long term average meteorological data. Various researchers used different parameters to develop the models. 20-30 such models are there [4].

**Model 1: Garg&Garg model**

Garg proposed double linear relation [18] for obtaining monthly mean global solar radiation:

$$(13)$$

$c_w$  is the atmospheric precipitable water vapor per unit volume of air.

Model 2: Ojosu&Komolafe model

Following equation was proposed [19]:

$$\frac{H}{H_0} = \quad (14)$$



### III. SOFT COMPUTING BASED MODELING OF SOLAR RADIATION

In the 20<sup>th</sup> and 21<sup>st</sup> century the application of computer has increased. Gradually, empirical models becomes obsolete and in place of that machine learning techniques, artificial intelligence techniques (artificial neural networks, support vector machine, genetic programming, fuzzy logic etc.) based models are being developed. In all these models computers are not explicitly programmed rather they are used. Some of them are reviewed as under.

#### A. ARTIFICIAL NEURAL NETWORK BASED MODELING

ANN is the efficient way to provide nonlinear relation between number of inputs and one or more output of global solar radiation estimation models. In reference [20], M. Benghanem, A. Mellit, S. N. Alamri developed an ANN based model for estimating daily global solar radiation using global irradiation , diffuse irradiation , air temperature  $T$ , & relative humidity . Six ANN models were proposed by them for different combination of input. They observed that the model with input as sunshine duration and air temperature gives considerably better result as correlation coefficient is 97.65 %. In reference [21], J. Mubiru, E.J.K.B. Banda explored the possibility of developing prediction model using ANN on weather station data such as sunshine duration, maximum temperature, cloud cover and location parameters such as latitude, longitude & altitude. A correlation coefficient of 0.974 was obtained with MBE of 0.59 MJ/m<sup>2</sup> and RMSE of 0.385 MJ/m<sup>2</sup>. Reference [22], M. Rijwan, MajidJamil, D. P. Kothari details the generalized ANN approach for global solar energy estimation in India. They proposed the GNN based model which overcomes the problem of ANN such as large number of neurons and layers for complex function approximation. They found the relative error of 4% which is lower than that of fuzzy logic of 6%. Reference [23], Soteris A. Kalogirou gives the importance of ANN in solar radiation prediction. ANN is useful in system modeling such as complex mapping and system identification. He presented various applications of neural network mainly in renewable energy.

#### B. FUZZY SYSTEM BASED MODELING

Fuzzy logic is a form of multivalued logic which deals with reality. It deals with grammarian values rather than fresh values. Logic lies between completely true and completely false (0-1). Likewise probability, fuzzy logic is also a technic of expressing uncertainty. Fuzzy logic deals with the membership functions such as 'II' trapezoidal, 'T' function, 'A' triangular and Gaussian fuzzy set. Reference [24] L. Suganthi, S. Iniyan, Anand A. Samuel gives classification of fuzzy logic based models along with their applications. They indicated that the fuzzy based models provide realistic estimates. Reference [25], M. Rijwan, MajidJamil, D. P. Kothari performed modeling using fuzzy logic as mean duration sunshine, temperature, latitude, longitude, altitude and moths of a year as input parameters. The MPE, using fuzzy logic for New Delhi, Jodhpur, Kolkata and Shillong are 5.11%, 5.17%, 5.53% and 5.67% respectively where as it is 4.87%, 4.89%, 4.81% and 5.97% respectively using ANN. Reference [26], SaurabhBhardwaj, Vikrant Sharma, SmritiSrivastava, O. S. Sastry et al. used Hidden Markov Model (HMM) with Pearson R model for extraction of shape based clusters from the input meteorological parameters and it is then processed by Generalized Fuzzy Model (GFM). They used meteorological data of three years (2009-2011). 750 days data used for training of model and 165 days for validating the model. The RMSE, MAPE and R-value of prosed model have been found as 7.9124, 3.0083 and 0.9921 respectively. Reference



[27], R. IQDOUR, A. ZEROUAL presented a newer method based on Takagi-Sugeno (TS) fuzzy system. TS models defined by If-Then rules and it is a non-linear technic. They compared the model on high order statistics and different procedure and found the fuzzy model provides better results.

#### IV. CHALLENGES BEFORE MODELING OF SOLAR RADIATION

There are various issues which are faced during modeling of solar energy. Some of them are briefed below:

- a) Model Input- maximum of models takes input as sunshine duration, ambient temperature, maximum and minimum day time temperature etc. but authors do not consider the probability of sunshine duration, ambient temperature etc.
- b) Architecture of ANN model- calculation of hidden neurons in ANN is too difficult because they work on trial and error approach. Still then ANN is supposed to be the best technology of global solar radiation modeling.
- c) Prediction Accuracy- accuracy is probably the most important thing in modeling. It is proved that the heuristic approach is more accurate than any other techniques.
- d) Data Availability- for proper analysis long term data is required but it is not readily available due to the high cost of measuring devices and difficulties related to measuring sites.
- e) Model Simplicity- non linear models are assumed to be more accurate and simple than the linear one. But calculation of linear model coefficient is simpler. MATLAB/ PYTHON provides various fitting tools for model coefficients.

#### V. MODEL EVALUATION

The solar energy estimation models may generally be evaluated based on various statistical error tests such as:

- a) Mean Bias Error (MBE):

$$a) MBE = \frac{1}{K} \sum (G_{estimated}^i - G_{me}^i) \quad (15)$$

MBE provides information on long term performance of the model. Negative MBE denotes the average amount of under estimation in the predicted values but positive MBE gives average amount of over estimation in the predicted values.

- b) Mean Absolute Percentage Error (MAPE):

$$a) MAPE = \frac{100}{K} \sum \left| \frac{G_{estimated}^i - G_{me}^i}{G_{measure}^i} \right| \quad (16)$$

MAPE is always positive. It avoids error cancellation. Since this gives absolute value of error so it does not differentiate the models properly.

- c) Root Mean Square Error (RMSE):

$$a) RMSE = \left( \frac{1}{K} \sum (G_{estimated}^i - G_{measure}^i)^2 \right)^{1/2} \quad (17)$$

This allows comparison of actual deviation term by term between the calculated value and measured value. This is always positive and provides short term performance of the models.

- d) Test Statistics (TS):



TS = (18)

This was proposed by stone (1993). This determines the significance of particular confidence level.

## VI. CONCLUSION

In this paper global solar radiation techniques are discussed starting from the empirical modeling to the soft computing techniques such artificial intelligence, soft computing, fuzzy logic etc. Also, challenges before modeling and method of evaluation of models are presented. From deep literature review it has been found that artificial intelligence technique based models gives less errors with best possible results.

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