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Comparison of infiltration models in NIT Kurukshetra campus

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Abstract

The aim of the present investigation is to evaluate the performance of infiltration models used to calculate the infiltration rate of the soils. Ten different locations were chosen to measure the infiltration rate in NIT Kurukshetra. The instrument used for the experimentation was double ring infiltrometer. Some of the popular infiltration models like Horton's, Philip's, Modified Philip's and Green–Ampt were fitted with infiltration test data and performance of the models was determined using Nash–Sutcliffe efficiency (NSE), coefficient of correlation (C.C) and Root mean square error (RMSE) criteria. The result suggests that Modified Philip's model is the most accurate model where values of C.C, NSE and RMSE vary from 0.9947–0.9999, 0.9877–0.9998 to 0.1402–0.6913 (mm/h), respectively. Thus, this model can be used to synthetically produce infiltration data in the absence of infiltration data under the same conditions.

Keywords Infiltration rate \cdot Double ring infiltrometer \cdot Coefficient of correlation \cdot Nash–Sutcliffe efficiency \cdot Root mean square error

Introduction

Infiltration of water through soils is a natural process. It is a key component of the hydrological cycle. Infiltration is the process of entering water through top surface of the soil. The actual amount of water percolating into the soil at any time is known as the infiltration rate (Haghighi et al. 2010). Infiltration is related to groundwater recharge and surface runoff (Uloma et al. 2014). It also helps in designing of irrigation, drainage and water supply systems, flood control measures, landslides and many other natural and man-made processes (Igbadun and Idris 2007). Various models (Philip's, Kostia-kov, US-Soil Conservation Service (SCS), Horton, Holton etc.) have been developed to evaluate the infiltration.

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² Civil Engineering Department, NIT Kurukshetra, Thanesar 136119, India Many infiltration models have been evolved to evaluate hydrologic process from about 1911 (Green and Ampt 1911; Williams et al. 1998). These models were presented and summarized systematically and extensively by Williams et al. (1998). Several researchers were able to successfully compare and evaluate those available soil-infiltration models in different frameworks under field conditions (Mbagwu 1995; Mishra and Singh 1999; Shukla et al. 2003; Chahinian et al. 2005; Dashtaki et al. 2009).

Mirzaee et al. (2013) thought about the capacity of eight diverse infiltration models (i.e. Green and Ampt, Philip, Horton, Kostiakov, Modified Kostiakov, Swartzendruber, Revised Modified Kostiakov models and SCS (US-Soil Conservation Service)) which were assessed by least squares fitting to measured soil infiltration. Sihag et al. (2017a) have compared the various infiltration models (Kostiakov, SCS, Novel model and Modified Kostiakov) for the NIT Kurukshetra campus. Novel model was most suited as compared to others with field infiltration data.

Sihag et al. (2017b, c) and Singh et al. (2017) utilized the various soft computing techniques to predict the infiltration rate of the soil. The objective of the present investigation is to determine the model parameters and find out the best suitable model for the soil of below mentioned study area.



Study area

NIT Kurukshetra is one of the reputed institutes of India situated in Kurukshetra. Geographic coordinates of the institute is 29.9655°N, 76.7106°E which comes under Upper - Ghaggar Basin. Generally, the major soil type in Kurukshetra is clayey loam and sandy loam. The details of the ten locations, which were selected to find out the infiltration rate, are described in Fig. 1.

Methodology

The instrument used for find out the infiltration rates was Double ring infiltrometer (ASTM 2009). As shown in Fig. 2, the double ring infiltrometer has two parts: one was outer ring whose diameter was 450 mm, and second was inner ring whose diameter is 300 mm. The rings of infiltrometer were driven 100 mm depth into the soil. The hammer should strike uniformly on steel plate which is placed on the top of the ring without disturbing the top soil surface. The water



Fig. 2 Double ring Infiltrometer

was filled at the same level of both rings. The profundity of water in the infiltrometer was recorded at regular interims until the steady infiltration rate was achieved. The soil sample (about 100–150 g) for calculating moisture content was collected from a site nearest to the location chosen for experimentation.



Fig. 1 Location map of study area

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Fig. 3 Comparison of the field infiltration rate with various models estimated infiltration rate for the study area (site no. 1-10)



50 100 150 200 Time (min.)

0

0



Fig. 3 (continued)





Table 1 Detail of initial, finalinfiltration rates and moisturecontents of ten locations

Test no.	1	2	3	4	5	6	7	8	9	10
Initial infiltration rate (mm/h)	48	60	48	96	84	48	60	60	48	48
Final infiltration rate (mm/h)	15	15	10	5	4	9	8	8	11	11
Moisture content (%)	3.44	2.65	1.93	7.98	7.65	3.51	3.40	4.20	5.27	3.83

Infiltration models and parameters

In this study, four popular infiltration models were selected and model parameters are driven by using the data obtained from field measurement.

Philip's model

Philip's (1957) model expressed as follows:

$$m = \frac{1}{2}St^{-0.5} + A,\tag{1}$$

where *m* is the infiltration rate (LT^{-1}) ; *S* is the $(LT^{-0.5})$; *A* is the soil parameter related to the transmission of water through the soil or gravity force (LT^{-1}) , and *t* is time (T).

Modified Philip's model

The modified model of Philip (Su 2010) is defined as

$$m = \frac{1}{2}St^{-\frac{\beta}{2}} + A,$$
 (2)

where β is an empirical constant.

Horton's model

 Table 2
 Parameters of the selected infiltration model

The Horton's infiltration model (Horton 1941) is expressed as follows:

$m = (m_0 - m_c)e^{-kt} + m_c,$	(3)

where m_c is the steady infiltration rate (LT⁻¹); m_0 is the initial infiltration rate (LT⁻¹), and *t* is time (T). *k* is the infiltration decay factor.

Green–Ampt's model

There are many equations derived from applying Darcy's law to the wetted zone in the soil, using the fact that a distinct wetting front exists. Green and Ampt (1911) were the first with this approach, and their equation is in the form of

$$m = K_s + (K_s \cdot (\cdot s)/M, \tag{4}$$

where s is the capillary suction at the wetting front; K_s is saturated hydraulic conductivity, and M is the cumulative infiltration (L). The equation may be written as follows:

$$m = b + c/M,$$
(5)
where $b = K$ and $c = K_{c}(s)$

where $b = K_s$ and $c = K_s \cdot (\cdot s)$.

Estimation and inter-comparison of models parameters

Comparison of difference between the predicted infiltration rate values and measured values was done to evaluate the infiltration rate. Those model performances are addressed below:

Test no.	Equation parameters										
	Philip's model		Hortron's model	Green–Ampt Model		Modified Philip's model					
	S	Α	k	b	с	S	β	Α			
1	176.96	8.08	0.048	13.20	138.75	2.547	- 1.452	0.046			
2	357.91	2.62	0.027	19.15	233.98	7.186	- 1.178	- 5.063			
3	167.85	4.21	0.038	8.47	174.92	3.830	- 1.229	- 0.449			
4	42.91	3.35	0.078	0.34	410.75	6.027	- 0.833	3.805			
5	85.83	0.70	0.052	1.62	483.61	230.227	- 0.106	- 117.905			
6	79.31	6.20	0.060	2.73	164.51	2.297	- 1.329	1.030			
7	96.05	5.06	0.060	3.082	243.88	2.945	- 1.235	2.113			
8	196.89	0.11	0.052	0.22	289.88	8.256	- 0.910	- 4.103			
9	180.66	4.12	0.042	9.08	162.12	4.110	- 1.221	- 1.564			
10	180.66	4.12	0.042	9.08	162.12	4.110	- 1.221	- 1.564			

S sorptivity (mm min^{-0.5}), A transmissivity (mm min⁻¹), b and c equation parameters, k infiltration decay factor



 Table 3
 Performance evaluation
 parameters of infiltration models

Sr. no.	Test no.	Philip's model	Horton's model	Green–Ampt model	Modified Philip's model				
(i) Coeffici	ient of correlation	(C.C)							
1	1	0.975	0.967	0.931	0.9997				
2	2	0.978	0.969	0.952	0.9997				
3	3	0.936	0.942	0.942	0.9997				
4	4	0.983	0.974	0.941	0.9947				
5	5	0.964	0.938	0.948	0.9995				
6	6	0.971	0.953	0.983	0.9996				
7	7	0.984	0.947	0.967	0.9994				
8	8	0.985	0.952	0.993	0.9997				
9	9	0.985	0.952	0.980	0.9999				
10	10	0.985	0.952	0.980	0.9999				
Average		0.975	0.955	0.964	0.9992				
(ii) Nash-S	Sutcliffe efficiency	y (NSE)							
11	1	0.924	0.842	0.947	0.9995				
12	2	0.621	0.933	0.866	0.9994				
13	3	0.887	0.931	0.782	0.9993				
14	4	-0.096	0.853	0.548	0.9876				
15	5	-0.044	0.924	0.771	0.9989				
16	6	0.464	0.872	0.942	0.9992				
17	7	0.406	0.893	0.917	0.9978				
18	8	0.872	0.892	0.981	0.9994				
19	9	0.961	0.902	0.959	0.9998				
20	10	0.961	0.902	0.959	0.9998				
Average		0.596	0.895	0.867	0.9981				
(iii) Root mean square error (RMSE) (mm/h)									
21	1	2.609	3.767	2.166	0.3217				
22	2	3.989	3.119	3.600	0.4496				
23	3	27.084	9.897	8.703	0.3151				
24	4	25.427	6.855	17.38	0.6913				
25	5	7.941	3.870	11.89	0.2450				
26	6	11.418	4.846	2.692	0.2583				
27	7	5.188	4.763	4.254	0.3671				
28	8	2.104	3.331	0.315	0.2537				
29	9	2.104	3.331	2.139	0.1402				
30	10	2.104	3.331	2.139	0.1402				
Average		8.997	4.711	5.528	0.3182				

Coefficient of correlation

Coefficient of correlation is a measure of the linear regression between the predicted values and the targets of models. The coefficient of correlation (C.C) is computed as

$$C.C = \frac{z \sum ab - (\sum a)(\sum b)}{\sqrt{z(\sum a^2) - (\sum a)^2} \sqrt{z(\sum b^2) - (\sum b)^2}}.$$
 (6)

Nash-Sutcliffe efficiency

The Nash-Sutcliffe efficiency (NSE) (Nash and Sutcliffe 1970) has value between $-\infty$ and 1. Its value is defined by

NSE = 1 -
$$\frac{\sum_{i=1}^{z} (a_i - b_i)^2}{\sum_{i=1}^{z} (a_i - \bar{a})^2}$$
. (7)





Fig. 4 Observed infiltration rate and predicted infiltration rate of various models

Root mean square error (RMSE)

This method exaggerates the prediction error—the difference between prediction value and actual value. The root mean squared error (RMSE) is evaluated by

RMSE =
$$\sqrt{\frac{1}{z} \left(\sum_{i=1}^{z} (a_i - b_i)^2\right)}$$
, (8)

where a is the calculated and b is observed values of infiltration rate and z is the number of observations.

Result and discussion

Infiltration tests were carried out within the field in order to deal with the spatial variability of infiltration rate. Based on the field tests at 10 different locations in NIT Kurukshetra area, results were analysed and individual infiltration curves have been developed in Fig. 3. Table 1 shows the values of initial infiltration rate, final infiltration rate and moisture content of soil sample of various locations. The initial infiltration rate, final infiltration rate and moisture contents fluctuate from 96–48 mm/h, 15–11 mm/h to 7.98–1.93%, respectively, for the study area.

A number of infiltration models are projected to find out field infiltration rates. The projected models Philip's, Horton's, Green–Ampt and Modified Philip's were chosen for evaluation in the study. To study these models, actual field infiltration data have been used. Attempt was made to evaluate these infiltration equations on the basis of experimental data of the study area and to obtain numerical values for the parameters of the models (Table 2). For the analysis of infiltration data and find out the parameters of the above model using least square techniques, XLSTAT software has been used. Page 7 of 8

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Infiltration models were evaluated using C.C, NSE and RMSE methods. The most suitable model was selected on the basis of maximum values of C.C and NSE and RMSE criteria. Findings are summarized in Table 3.

The computed average values of C.C values were 0.975 0.955, 0.964 and 0.9992, NSE were 0.596, 0.895, 0.868 and 0.998, and those RMSE values were 8.997, 4.711, 5.528, and 0.3182 mm/h for Philip's, Horton's, Green–Ampt and Modified Philip's model, respectively.

Figure 4 provides the information about observed infiltration rate and predicted values of infiltration rate of the above-mentioned models and suggests that all the values of Modified Philip's model are lying inside the $\pm 10\%$ error band from the line of perfect agreement than the other infiltration models (Horton's model, Green–Ampt model and Philip's model). Similarly, comparison of the C.C, NSE, RMSE suggests a better performance by Modified Philip's model in comparison to Philip's, Horton's and Green–Ampt model. Thus, Modified Philip's model performs best amid all models mentioned above for the study area, and hence, this model was used to assess the infiltration rate of this study area.

Conclusion

Infiltration is an important parameter in the hydrological cycle and one of the thrust areas in hydrology. Infiltration rate data for different soils are essential for understanding of the rainfall-runoff process and for planning and design of water resource systems. While comparing infiltration models with field data, it is observed that infiltration rate versus time plots for field data and modelled data do not accurately match; but the Modified Philip's model is much closer to observed field data having C.C, NSE and RMSE values of 0.9992, 0.9981 and 0.3182 (mm/h), respectively. It can thus be used to synthetically generate infiltration data in the absence of observed infiltration data for NIT Kurukshetra, Haryana (India).

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References

ASTM (2009) Standard test method for infiltration rate of soils in field using double-ring infiltrometer. D3385-09, West Conshohocken, PA



- Chahinian N, Moussa R, Andrieux P, Voltz M (2005) Comparison of infiltration models to simulate flood events at the field scale. J Hydrol 306(1):191–214
- Dashtaki SG, Homaee M, Mahdian MH, Kouchakzadeh M (2009) Sitedependence performance of infiltration models. Water Resour Manag 23(13):2777–2790
- Green WH, Ampt GA (1911) Studies in soil physics. J Agric Sci 4:1-24
- Haghighi F, Gorji M, Shorafa M, Sarmadian F, Mohammadi MH (2010) Evaluation of some infiltration models and hydraulic parameters. Span J Agric Res 8(1):210–217
- Horton RE (1941) An approach toward a physical interpretation of infiltration-capacity. Soil Sci Soc Am J 5(C):399–417
- Igbadun HE, Idris UD (2007) Performance evaluation of infiltration models in a hydromorphic soil. Niger J Soil Environ Res 7(1):53–59
- Mbagwu JSC (1995) Testing the goodness of fit of infiltration models for highly permeable soils under different tropical soil management systems. Soil Tillage Res 34(3):199–205
- Mirzaee S, Zolfaghari AA, Gorji M, Dyck M, Ghorbani Dashtaki S (2013) Evaluation of infiltration models with different numbers of fitting in different soil texture classes. Arch Agron Soil Sci 2013:1–13
- Mishra SK, Singh VP (1999) Another look at SCS-CN method. J Hydrol Eng 4(3):257–264
- Nash JE, Sutcliffe JV (1970) River flow forecasting through conceptual models part I—a discussion of principles. J Hydrol 10(3):282–290
- Philip JR (1957) The theory of infiltration: 1. The infiltration equation and its solution. Soil Sci 83(5):345–358
- Shukla MK, Lal R, Unkefer P (2003) Experimental evaluation of infiltration models for different land use and soil management systems. Soil Sci 168(3):178–191

- Sihag P, Tiwari NK, Ranjan S (2017a) Estimation and inter-comparison of infiltration models. Water Sci 31(1):34–43
- Sihag P, Tiwari NK, Ranjan S (2017b) Modelling of infiltration of sandy soil using gaussian process regression. Model Earth Syst Environ 3(3):1091–1100
- Sihag P, Tiwari NK, Ranjan S (2017c) Prediction of unsaturated hydraulic conductivity using adaptive neuro-fuzzy inference system (ANFIS). ISH J Hydraul Eng. https://doi.org/10.1080/09715 010.2017.1381861
- Singh B, Sihag P, Singh K (2017) Modelling of impact of water quality on infiltration rate of soil by random forest regression. Model Earth Syst Environ 3(3):999–1004
- Su N (2010) Theory of infiltration: infiltration into swelling soils in a material coordinate. J Hydrol 395(1):103–108
- Uloma AR, Samuel AC, Kingsley IK (2014) Estimation of Kostiakov's infiltration model parameters of some sandy loam soils of Ikwuano-Umuahia, Nigeria. Open Trans Geosci 1(1):34–38
- Williams JR, Ying O, Chen JS, Ravi V (1998) Estimation of infiltration rate in the vadose zone: application of selected mathematical models, vol 2 (No. PB–98-147317/XAB). ManTech Environmental Technology, Inc., Research Triangle Park, NC (United States); Dynamac Corp., Ada, OK (United States); National Risk Management Research Lab., Subsurface Protection and Remediation Div., Ada, OK (United States)

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