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Statistical Evaluation of CPT and CPTu Based Methods for Prediction of Axial Bearing Capacity of Piles

Parisa Heidari · Mahmoud Ghazavi

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Abstract Piles are structural members made of steel, concrete, or wood installed into the ground to transfer superstructure loads to the soil. Nowadays, many structures are built on poor lands, and therefore piles have crucial roles in such structures. Performing insitu tests such as cone penetration (CPT) and piezocone penetration tests (CPTu) have always been of great importance in designing piles. These tests have a brilliant consistency with reality, and as a result, the outcome data can be used in order to achieve reliable pile designing models and reduce uncertainty in this regard. In this paper, the capability of various CPT and CPTu based methods developed from 1961 to 2016 has been investigated using four statistical methods. Such CPT and CPTu based methods are adopted for direct prediction of axial bearing capacity of piles using CPT and CPTu field data. For this purpose, 61 sets of field data prepared from CPT and CPTu have been collected. The data sets were utilized in order to calculate the axial bearing capacity of piles (Q_E) through 25 different methods. In addition, the measured axial pile capacities (Q_M) have been collected, recorded and prepared from field static load tests, respectively. Then, four different statistical

P. Heidari · M. Ghazavi (⊠) Faculty of Civil Engineering, K N Toosi University of Technology, Tehran, Iran e-mail: ghazavi_ma@kntu.ac.ir

P. Heidari e-mail: Parisa.heidari27@gmail.com approaches have been applied to assess the accuracy of these methods. Finally, the most reliable and accurate methods are presented.

Keywords Cone penetration tests (CPT) - Piezocone penetration tests (CPTu) - Axial bearing capacity of piles - Static load tests - Statistical methods

1 Introduction

Determination of accurate ultimate bearing capacity of piles has always been a challenge for geotechnical engineers in order to have a safe design. In this regard, estimating the axial bearing capacity of piles can be achieved via static analysis, in-situ testing methods, full-scale loading tests, and presumed values recommended by codes and handbooks (Obeta et al. [2018](#page-27-0)). The in situ tests which have been used for the estimation of the axial bearing capacity of piles are mostly CPT (and CPTu), SPT, and more recently DMT (Vukićević et al. [2018\)](#page-27-0). The cone penetration test (CPT) is considered one of the most practical insitu tests for the prediction of the ultimate bearing capacity of piles for the similarity between pile and cone (Amirmojahedi and Abu-Farsakh [2019](#page-26-0)). Furthermore, CPT is a powerful, fundamental, quick, dependable, and inexpensive test, and can provide continuous soundings of the subsurface soil (Eslami and Fellenius [1997\)](#page-26-0). Site variability assessment, soil stratigraphy and liquefaction assessment are the other applications of CPT. The CPT measurements are comprised of the cone tip resistance (q_c) and sleeve friction (f_s) . Soil identification, classification, and evaluation of soil properties such as strength and deformation characteristics can be carried out effectively by these measurements (Lunne et al. [2002](#page-27-0)). Piezocone penetration test (CPTu) is a more advanced CPT test for its additional capability of measuring pore water pressure. One of the most efficient applications of CPT data is the determination of pile capacity, due to the similarity between the cone and the pile. One of the major advantages of using CPT or CPTu data for pile designing is the attainment of undisturbed sampling and less need for subsequent standard laboratory testing (Eslami and Fellenius [1997\)](#page-26-0). In the literature, there are some empirical and semi-empirical approaches for estimating the ultimate bearing capacity of piles directly based on CPT and CPTu data. These approaches have been developed to overcome the uncertainties in geotechnical engineering predictions. Empirical and semi-empirical methods are based on simplifying assumptions including soil stratigraphy, soil-pile interaction, and distribution of soil resistance along the pile. Therefore, they cannot be reliable in order to be directly useful for the foundation design (Eslami et al. [2014\)](#page-26-0). In this research, 25 available CPT and CPTu-based direct methods are considered to determine the estimated axial pile capacity (Q_F) . In Appendix, Table [5](#page-21-0) presents these methods in details.

The pile capacities predicted from CPT or CPTu data by 25 methods have been compared with measured values through static load tests. To compare Q_E values with Q_M , four statistical criteria have been employed. These are the best-fitted line for Q_E versus Q_M , the geometric average and standard deviation of the ratio Q_E/Q_M , the cumulative probability for the ratio of Q_E/Q_M , and the accuracy of 20 percent of the histogram and the lognormal distribution curve (Eslami et al. [2011\)](#page-26-0). These comparisons will be presented below.

2 Collected Database from CPTu and Static Load Tests

A series of data has been collected, containing the results of 61 static loading tests of piles and CPT, and CPTu soundings performed close to the pile locations. For measuring the axial bearing capacity of piles, the static compression pile load tests have been performed which have acceptable accuracies. The main application of CPT and CPTu is to determine the soil classifications (Begemann [1963](#page-26-0), [1965,](#page-26-0) [1969;](#page-26-0) Douglas [1981;](#page-26-0) Robertson et al. [1986;](#page-27-0) Robertson [1990;](#page-27-0) Jefferies and Davies [1991](#page-27-0); Olsen [1995;](#page-27-0) Eslami and Fellenius [1997;](#page-26-0) Zhang and Tumay [1999](#page-28-0); Hegazy and Mayne [2002\)](#page-27-0). In these series of data, soils consist of clay, sand, and mixture of soils called mixed soil. For instance, a typical piezocone profile is shown in Fig. [1](#page-2-0) and the soil profile is determined using the approach of Eslami and Fellenius [\(1997](#page-26-0)) by calculating corrected cone resistance (q_E) and sleeve friction.

Most piles have been installed by driving. These tests are collected from 26 various sites in 16 countries, the majority of which have been performed in the U.S.A. For most databases, the pore water pressure measurements are available. The piles are made of concrete or steel with circular, rectangular or H-shape cross sections, the majority of them is square concrete. Embedment lengths of the piles range from 8.2 m to 67 m, and 61% of embedment lengths are in the range of 10 m $\lt L \lt 20$ m. The pile diameters range from 235 to 1372 mm, and about 79% of the pile diameters are less than 450 mm. The axial ultimate bearing capacities of piles that have been determined from pile load tests are 290–7500 kN. Eighty percent of total capacities are calculated on the basis of Hansen (1970) criteria. In cases where the load obtained from this criterion exceeds the applied load in pile load test, the maximum load in the test was used. Figure [2](#page-4-0) shows different percentages of pile shape and material, pile diameter, embedment length, soil type, and site location in 61 databases.

Table [1](#page-4-0) summarizes the main case recorded data, including pile specifications, pile loading test results, and soil profiles. These 61 databases are divided into three categories based on soil type as sand, clay and mixed soil.

3 Statistical Analysis

Briaud ([1988\)](#page-26-0), Eslami and Fellenius ([1997\)](#page-26-0), Long and Wysockey [\(1999](#page-27-0)), Abu-Farsakh and Titi ([2004](#page-26-0)), Schneider et al. ([2008](#page-27-0)), and Eslami et al. ([2011\)](#page-26-0) evaluated the accuracy of some of the CPT and CPTu-

Fig. 1 A typical piezocone profile with soil classification from the chart given by Eslami and Fellenius ([1997\)](#page-26-0) and Yen et al. ([1989](#page-28-0))

based methods in estimating the pile axial bearing capacity when both measured data on piles from real field tests and predicted data from empirical and semiempirical methods were accessible. However, it is felt that it is necessary to perform a comprehensive investigation to rank different approaches according to their prediction accuracy and resulting in much more economic design. In this paper, an extensive range of CPT and CPTu-based methods from 1961 to 2016 have been investigated by four statistical methods. The aim is to carry out statistical analyses to rank CPT and CPTu-based methods comprehensively.

3.1 Equations of the Best-Fitted Line for Q_E versus Q_M

The values of Q_F from the CPT and CPTu-based methods are plotted against the Q_M from pile loading test results in different soil types. The soil profiles reported are divided into sand, clay, and mixed soil. In order to compare the estimated and measured pile capacities for all piles in three soil types, three terms of "most," "medium," and "least" resembling "the most accurate," "medium accurate," and "the least accurate'' are used, and the results are shown in Figs. [3](#page-6-0), [4,](#page-7-0) and [5](#page-8-0). The line with the angle of 45^{\degree} which is named diagonal line, in each diagram, indicates a perfect consistency between estimated and measured pile capacities. For each CPT and CPTu-based methods, a regression analysis is conducted on 61 databases to obtain the best fitting line for Q_E/Q_M . The relationship between Q_E and Q_M , and corresponding coefficient (R^2) are determined for each CPT and CPTu data in 25 CPT and CPTu-based methods. As can be seen in Figs. [3](#page-6-0), [4](#page-7-0), and [5](#page-8-0), the method of the Niazi and Mayne [\(2016](#page-27-0)) method in sand, the SEU method (Cai et al. [2011,](#page-26-0) [2012\)](#page-26-0) in clay and the Niazi and Mayne [\(2016](#page-27-0)) method in mixed soil have the best-fitted equation. Therefore, the method of Niazi and Mayne [\(2016](#page-27-0)) and the SEU method (Cai et al. [2011,](#page-26-0) [2012\)](#page-26-0) in the sand, mixed soil and in clay are ranked first according to this criterion with $R_1 = 1$, while R_1 is the ranking based on this criterion.

Figures [3](#page-6-0), [4,](#page-7-0) and [5](#page-8-0) represent the most accurate methods for sand, clay, and mixed soil, respectively. As shown in Figs. [6](#page-9-0), [7,](#page-9-0) and [8,](#page-10-0) the UniCone (Eslami

PILE SHAPE AND MATERIAL

SOIL TYPE

(c) (d)

SITE LOCATION

b Fig. 2 Percentages of: (a). embedment length; (b) pile diameter; (c) pile shape and material, (d) soil type; (e) site location in 61 databases

and Fellenius [1997;](#page-26-0) Fellenius [2002](#page-26-0)), Cambridge (White and Bolton [2005\)](#page-27-0), Lee and Salgado ([1999](#page-27-0)), Tumay and Fakhroo ([1981\)](#page-27-0), Bogdanovic ([1961](#page-26-0)), Eslami and Fellenius [\(1997](#page-26-0)) in the sand, Eslami and

Table 1 continued

(* P = pipe; Sq = square; HP = H-section; Rd = round; C = concrete; S = steel)

Fig. 3 Values of Q_E versus Q_M for piles in sand

Fellenius [\(1997](#page-26-0)) in clay and UniCone (Eslami and Fellenius [1997;](#page-26-0) Fellenius [2002](#page-26-0)), Eslami and Fellenius [\(1997](#page-26-0)) in mixed soil with $R^2 \ge 0.9$ have good agreement with the results of a real situation.

3.2 Geometric Mean (μ) and Standard Deviation (σ) for Q_E/Q_M

The geometric mean (μ) and standard deviation (σ) of Q_E/Q_M for each method are calculated and used as a

Fig. 4 Values of Q_E versus Q_M for piles in clay

second evaluation criterion. According to μ and σ values, various approaches have been ranked as summarized in column 7 of Tables [2](#page-11-0), [3](#page-12-0), and [4](#page-13-0). The smaller the standard deviation, the better agreement can be determined between Q_E and Q_M . Consequently, the Eslami and Fellenius Method (Eslami and Fellenius [1997\)](#page-26-0) ranks number one in sand, clay, and mixed soil. In this criterion, R_2 is the rank number based on the geometric mean (μ) and standard deviation (σ) of Q_E/Q_M values.

3.3 Cumulative Probability for $Q_{\rm E}/Q_{\rm M}$

Alsamman ([1995\)](#page-26-0) and Long and Wysockey ([1999\)](#page-27-0) suggest that the cumulative probability is a statistical criterion for evaluating the CPT and CPTu-based

Fig. 5 Values of Q_E versus Q_M for piles in mixed soil

methods for estimating the ultimate bearing capacity of piles. For obtaining the cumulative probability, the following procedure should be taken into account:

- 1. Arrangement of Q_E/Q_M values for each method in ascending order $(1, 2, 3, \ldots, i, \ldots, n)$.
- 2. Estimation of cumulative probability (P) from Eq. 1. (Long and Wysockey [1999\)](#page-27-0):

$$
p = i/(n+1) \tag{1}
$$

where i denotes the order number given for the considered ratio and n is the pile number.

Fifty and ninety percent cumulative probabilities $(P_{50}$ and $P_{90})$ should be calculated and utilized to quantify the accuracy of various approaches estimating the ultimate pile capacity. For example, the P_{50} value is used as a measure of the tendency of the

Fig. 7 Comparison of methods based on the best-fitted line criteria in clay

method to over-predict or under-predict the measured pile capacity. The determination of over-prediction and under-prediction depends on the intended type of distribution. If the Q_E/Q_M values are close to 1, the estimated ultimate bearing capacity is almost equal to the measured value and the method has a precise

Fig. 8 Comparison of methods based on the best-fitted line criteria in mixed soils

prediction. The cumulative probability for Q_E/Q_M values is shown in Fig. [9](#page-14-0) for sand, clay, and mixed soil, respectively.

As shown in Fig. [9](#page-14-0), according to the cumulative probability criterion, the method of Niazi and Mayne [\(2016](#page-27-0)) with P_{50} =1.007, 1.012 and P_{90} =1.080, 1.196 ranks number one in sand and mixed soil, respectively, and the Eslami and Fellenius Method (Eslami and Fellenius [1997](#page-26-0)) with P_{50} =1.009 and P_{90} =1.45 ranks number one in clay.

3.4 Twenty Percent accuracy from the Histogram and Lognormal Distribution for Q_F/Q_M

The range of Q_E/Q_M value is from 0 to an unlimited upper value with an optimum value of unity. These result in a non-symmetric distribution of Q_E/Q_M values around the average value, not giving a uniform weight of under-prediction and over-prediction (Briaud [1988\)](#page-26-0). In this respect, Briaud and Tucker (Briaud [1988\)](#page-26-0) state that in order to assess the performance of the methods predicting the ultimate bearing capacity of piles, a log-normal distribution of Q_E/Q_M should be used. With this criterion, it is possible to determine the under-prediction and over-prediction of CPT and CPTu-based methods. The CPT and CPTu-based method under-predicts the measured capacity when Q_E/Q_M < 1 and over-predicts the measured capacity when $Q_E/Q_M > 1$. The lognormal distribution is defined as the distribution with the following density:

$$
f(x) = \frac{1}{\sqrt{2\pi} \sigma_{\ln} x} \exp\left[-1\right/2\left(\frac{\ln(x) - \mu_{\ln}}{\sigma_{\ln}}\right)^2\right] \quad (2)
$$

where $x = Q_E/Q_M$, μ_{ln} = mean of ln(Q_E/Q_M), and σ_{ln} = standard deviation of $ln(Q_E/Q_M)$.

In statistical analysis, the mean value (μ) and standard deviation value (σ) of Q_E/Q_M are essential indicators of the accuracy and precision of the predicting method.

Due to the lack of information and accucy of tests, upper and lower limits are considered for Q_E/Q_M values. The upper and lower limits mean that when more accumulation of data exists between upper and lower limits, lower distribution of the results obtained from the method exists, and thus, this method is better (Long and Wysockey [1999](#page-27-0)). For this purpose, the accuracy rate in this study is chosen 20%. Then, histograms and standard probability distribution graphs are drawn for Q_E/Q_M values. When the area of two graphs is calculated as $0.8 \leq Q_E/Q_M \leq 1.2$,

Sand														
Method of calculating bearing capacity of piles based on CPT	Best-fitted line for Q_E-Q_M			Geometric mean (μ) and standard deviation (σ) for Q_F/Q_M			Cumulative probability of Q_F / Q_M			20% accuracy from the histogram and lognormal distribution for QE/QM			Final prioritize	
	OE/ QM	R^2	R ₁	σ	μ	R ₂	P50	P90	R ₃	Lognormal	Histogram	R4	RI	Final rank
Niazi and Mayne (2016)	0.99	0.99	-1	0.09	1.01	$\mathbf{1}$	1.007	1.08	1	67.02	97.06	$\mathfrak{2}$	5	1
Eslami and Fellenius (1997)	0.99	0.97	2	0.11	1.05	2	1.08	1.18	2	84.96	93.33	1	7	\overline{c}
Cambridge-05 Method (2005)	1.05	0.97	3	0.19	1.05	2	1.05	1.28	$\overline{2}$	32.35	84.21	9	16	3
UniCone (1997, 2002)	1.04	0.96	2	0.16	1.10	8	1.10	1.33	3	56.70	63.89	3	16	3
Nottingham (1975), Schmertmann (1978)	1.11	0.94	$\overline{4}$	0.28	1.09	5	1.08	1.54	-5	41.29	66.67	$\overline{4}$	18	$\overline{4}$
Lee and Salgado (1999)	0.84	0.94	5	0.14	0.88	9	0.93	1.07	$\overline{4}$	61.39	71.78	\overline{c}	20	5
Philipponant (1980)	0.95	0.64	8	0.39	1.05	4	1.03	1.74	6	30.22	54.05	6	24	6
French Method (1982, 1997)	0.78	0.34	14	0.54	1.01	3	0.97	1.81	7	25.01	51.43	7	31	7
Aoki and Velloso (1975)	0.81	0.45	13	0.46	0.92	6	0.93	1.78	8	34.29	27.03	8	35	8
Begemann (1963, 1965, 1969)	0.99	0.49	6	0.68	1.26	13	1.15	2.26	10	20.55	51.61	10	39	9
European Method (1979)	0.97	0.09	9	0.69	1.19	11	1.15	2.24	9	18.99	34.29	13	42	10
German Method (2010)	0.97	0.50	$\overline{7}$	0.63	1.29	14	1.28	2.22	11	21.50	41.94	13	45	11
Meyerhof (1956, 1976, 1993)	0.75	0.63	11	0.47	0.82	10	0.84	1.78	13	28.51	36.96	12	46	12
Tumay and Fakhroo (1981)	1.24	0.77	12	0.59	1.36	16	1.25	2.22	15	41.04	64.71	5	48	13
UWA-05 Method (2005)	0.68	0.39	15	0.59	0.92	7	0.85	1.85	12	17.81	30.43	15	49	14
NGI-05 Method (2005)	1.21	0.79	10	0.51	1.22	12	1.22	2.13	14	21.58	23.81	16	52	15
Fugro-05 Method (2005)	0.48	0.34	19	0.26	0.59	17	0.58	1.07	18	49.28	19.35	11	65	15
Bogdanovic (1961)	0.53	0.69	18	0.29	0.64	15	0.62	1.11	16	2.45	7.69	19	68	16
Penpile Method (1978)	0.40	0.38	20	0.32	0.54	18	0.54	0.99	19	17.39	34.21	14	71	17
UWA-99 Method (1999)	0.55	0.88	17	0.29	0.50	19	0.52	0.83	17	7.02	11.11	18	71	17
KTRI (1998)	1.31	0.23	16	0.82	1.59	20	1.45	3.21	20	9.92	25	17	73	18

Table 2 Summary results of the evaluation of bearing capacity of piles in sand

with approximation of data under the graph to 100%, the method will be more accurate. Figures [10](#page-16-0), [11,](#page-17-0) and [12](#page-18-0) show these criteria in sand, clay, and mixed soils for methods with the most, medium, and minimum accuracy. For other methods, such analyses are illustrated by bar charts in three types of soils in Figs. [13,](#page-19-0) [14,](#page-19-0) and [15](#page-20-0).

The amounts of Log-Normal and Histogram for different methods have been illustrated in columns 11 and 12 of Tables 2, [3](#page-12-0), and [4](#page-13-0) in the sand, clay, and mixed soil, respectively. In the sand, clay, and mixed soil the Eslami and Fellenius Method (Eslami and Fellenius [1997](#page-26-0)), the UniCone method (Eslami and Fellenius [1997;](#page-26-0) Fellenius [2002](#page-26-0)), and the Niazi and Mayne ([2016\)](#page-27-0) method are the most accurate methods based on this criterion, respectively.

Figures [13](#page-19-0), [14](#page-19-0) and [15](#page-20-0) show that the method presented by Niazi and Mayne ([2016\)](#page-27-0) in the sand and clay and the UniCone method (Eslami and Fellenius [1997;](#page-26-0) Fellenius [2002](#page-26-0)) in mixed soil also have a good agreement with measured capacity in a real situation.

4 Results of Statistical Analysis for Various Experimental Methods

In this study, four evaluation criteria based on statistical approaches have been taken into account \sim

Table 3 Summary results of the evaluation of the bearing capacity of piles in clay

Ciay														
Method of calculating bearing capacity of piles based on CPT	Best-fitted line for Q_{E} - Q_{M}			Geometric mean (μ) and standard deviation (σ) for Q_E/Q_M			Cumulative probability of $Q_{\rm E}/Q_{\rm M}$			20% accuracy from the histogram and lognormal distribution for Q_F/Q_M			Final prioritize	
	OE/ QM	R^2	R1	σ	μ	R ₂	P50	P90	R ₃	Lognormal Histogram		R4	RI	FINAL rank
Eslami and Fellenius (1997)	0.95	0.94	2	0.21	1.02	$\overline{1}$	1.01	1.37	$\overline{1}$	34.84	66.67	\overline{c}	6	1
UniCone Method (1997, 2002)	0.89	0.90	7	0.19	0.97	$\overline{2}$	0.98	1.28	2	53.59	76.92	1	12	$\overline{2}$
KTRI (1998)	1.03	0.89	3	0.21	0.89	7	0.94	1.23	5	40.16	53.85	5	20	3
Philipponant (1980)	1.08	0.88	6	0.35	1.02	$\overline{4}$	0.96	1.71	$\overline{4}$	32.31	64.29	7	21	$\overline{4}$
European Method (1979)	1.02	0.87	$\overline{4}$	0.32	0.97	-5	0.89	1.64	7	30.95	69.23	6	22	-5
SEU-Method (2011, 2012)	0.99	0.97	1	0.32	1.06	-6	0.98	1.60	3	8.07	1.03	13	23	-6
Niazi and Mayne (2016)	0.90	0.75	8	0.32	1.02	3	0.07	0.35	14	90.66	46.15	4	29	-7
Nottingham (1975), Schmertmann (1978)	0.85	0.79	9	0.19	0.78	10	0.79	1.02	8	35.42	75	3	30 8	
Aoki and Velloso Method (1975)	1.24	0.82	10	0.31	1.11	8	1.16	1.64	-6	34.49	38.46	8	32	9
$V-K$ Method (2011)	0.99	0.84	5	0.32	0.85	9	0.86	1.34	9	21.95	47.06	9	32	9
Price and Wardle (1982)	0.67	0.75	11	0.25	0.54	12	0.58	0.89	11	17.36	5.88	11	45	10
NGI-BRE Method (1988, 1996, 2001)	1.34	0.69	13	0.80	1.37	13	1.27	2.54	10	1.96	31.25	10	46	11
French (1982, 1997)	0.65	0.78	12	0.31	0.63	11	0.57	1.32	13	19.12	7.69	12	48	12
Penpile Method (1978)	0.49	0.85	14	0.13	0.43	14	0.45	0.62	12	Ω	0	14	54	13

for ranking the performance of a wide variety of CPT and CPTu-based methods for predicting the ultimate bearing capacity of piles. The overall performance of CPT and CPTu-based methods are then evaluated using the four different criteria via RI. For example, RI for the Eslami and Fellenius Method in the sand is determined from RI = R_1 + R_2 + R_3 + $R_4=1 + 1 + 1 + 1 = 4$ in which R_1 , R_2 , R_3 , and R_4 are rank numbers for the regression, geometric average and standard deviation, cumulative probability, accuracy of 20 percent of the histogram and the lognormal distribution, respectively. The RI values for all methods in sand, clay, and mixed soil are presented in column 14 of Tables [2](#page-11-0), 3, and [4](#page-13-0), respectively. The final overall rank for each CPT or CPTu method obtained based on RI values in sand, clay, and mixed soil has been presented in column 15 of Tables [2,](#page-11-0) 3, and [4.](#page-13-0)

According to the results of the current research, the Niazi and Mayne method (Niazi and Mayne [2016](#page-27-0)) in sand and mixed soil, and the Eslami and Fellenius Method (Eslami and Fellenius [1997](#page-26-0)) in clay rank first. These CPTu-based methods (Niazi and Mayne and Eslami and Fellenius Method) show the best efficiency according to the four evaluation criteria. The KTRI method (Takesue et al. [1998](#page-27-0)) in sand and mixed soil and the Penpile method (Clisby et al. [1978\)](#page-26-0) in clay show the lowest performance amongst all methods. Therefore, the rank of the KTRI (Takesue et al. [1998\)](#page-27-0) method is number 18 and 10 corresponding to sand and mixed soil. The rank of the Penpile method (Clisby et al. [1978](#page-26-0)) is 13 in clay. Generally, the CPTbased methods exhibit more dispersion than CPTubased methods. The results of this investigation help to consider methods in terms of their accuracy for designing purposes. In addition, the results help to quantify the most accurate methods to have much better agreement with the real situation.

Mixed soil

The method of calculating bearing capacity of piles based on CPT	The best-fitted line for QE-QM			The geometric mean (μ) and standard deviation (σ) for QE/QM			The cumulative probability of the ratio OE/ QM			20% accuracy from the histogram and lognormal distribution for the ratio QE/ QM			Final prioritize	
	QE/ QM	R^2	R1	σ	μ	R ₂	P50	P90	R ₃	Lognormal	Histogram	R4	RI	Final rank
Niazi and Mayne (2016)	0.99	0.95	-1	0.16	1.02	1	1.01	1.19		99.26	85.19		4	1
Eslami and Fellenius (1997)	0.97	0.96	2	0.17	1.02	1	1.03	1.21	2	65.81	76.56	2	7	2
UniCone Method (1997, 2002)	0.96	0.95	$\mathbf{3}$	0.19	1.03	\overline{c}	1.03	1.22	\mathcal{F}	63.43	77.94	3	11	\mathcal{E}
Nottingham (1975; Schmertmann 1978)	0.94	0.89	4	0.28	0.92	3	0.96	1.37	5	46.74	57.14	4	16	$\overline{4}$
Aoki and Velloso (1975)	1.05	0.76	6	0.42	0.96	$\overline{4}$	$\mathbf{1}$	1.62	$\overline{4}$	36.39	46.15	5.	19	5
Philipponant (1980)	0.96	0.79	5	0.48	0.95	5	0.92	1.87	7	38.77	41.27	6	23	6
European Method (1979)	0.97	0.68	7	0.75	1.10	6	1.01	2.38	9	20.73	47.62	7	29	7
French Method (1982, 1997)	0.72	0.69	9	0.42	0.77	8	0.74	1.55	-8	30.13	59.42	5	30	-8
PenPile Method (1978)	0.51	0.70	10	0.26	0.50	9	0.49	0.91	6	13.21	28.13	9	34	9
KTRI Method (1998)	1.14	0.66	8	0.72	1.19	7	1.10	2.40	10	21.01	11.11	10	35	10

Table 4 Summary results of the evaluation of the bearing capacity of piles in mixed soil

5 Summary and Conclusions

In spite of doing comprehensive research by numerous researchers, for example Abu-Farsakh (1999, 2004), Eslami et al. [\(2011](#page-26-0)), the topic is still very interesting and needs further research. Much research has been conducted in this area. For example, Abu-Farsakh et al. (1999) evaluated 8 CPT-based methods with 35 databases in all types of soils and square precast prestressed concrete piles (PPC) using four statistical evaluation criteria and the prediction of pile capacity was performed on 60 piles. Abu-Farsakh and Titi [\(2004](#page-26-0)) evaluated 8 CPT-based methods with 35 databases in all types of soil and square precast prestressed concrete piles (PPC) utilizing 4 statistical methods. In addition, Eslami et al. [\(2011](#page-26-0)) evaluated 5 CPT-based methods with 13 databases and with 5 statistical approaches.

To the best of our knowledge, no research has been carried out to cover 25 empirical correlations predicting axial pile capacity at the same time in three different soil types. Each of these criteria reveals the accuracy of these methods by comparing their results with the real results obtained from in-situ tests.

This paper evaluates the accuracy of CPT and CPTu- based methods predicting the ultimate capacity of driven piles in sand, clay, and mixed soil. Each CPT or CPTu test is performed near the location of piles tested in the same field. The measured and estimated ultimate axial capacities of piles are obtained from static load test and CPT and CPTu data, respectively. Four statistical analyses have been operated to rank CPT and CPTu-based methods in terms of their accuracy for estimating the axial bearing capacity of piles. Four methods are the best-fitted line for Q_E versus Q_m , the geometric average and standard deviation for Q_F/Q_m ratio, the cumulative probability for Q_F/Q_m ratio and the accuracy of 20 percent of the histogram and the lognormal distribution curve for Q_E/Q_m ratio. Each of these criteria reveals the accuracy of these methods by comparing their results with the real results obtained from in-situ tests.

For each CPT and CPTu-based method, finally, the final rank of each criterion (RI) has been calculated. The main concluding remarks can be cited as:

Statistical methods show that CPT and CPTu based methods have their drawbacks in predicting the axial pile capacity.

- Based on the assessment of 25 CPT and CPTu based methods with 61 databases, amongst 25 methods, the one proposed by Eslami and Fellenius ([1997\)](#page-26-0) is the most accurate in estimating the ultimate bearing capacity of piles driven into clay and Niazi and Mayne method (Niazi and Mayne [2016](#page-27-0)) has the most accurate prediction in sand and mixed soil.
- Three relative reliability values amongst the 25 presented methods belong respectively to Niazi and Mayne ([2016\)](#page-27-0), Eslami and Fellenius ([1997](#page-26-0)), and Cambridge-05 method (White and Bolton [2005\)](#page-27-0) with ranks 1, 2 and 3 in the sand.
- In clay, Eslami and Fellenius method (Eslami and Fellenius [1997](#page-26-0)) with rank number 1 has the most relative reliability. The UniCone (Eslami and Fellenius [1997](#page-26-0); Fellenius [2002](#page-26-0)) and KTRI

(Takesue et al. [1998\)](#page-27-0) methods have the second and third relative reliability values, respectively.

• In mixed soil, Niazi and Mayne (Niazi and Mayne [2016](#page-27-0)) presented a method ranking one. Eslami and Fellenius method (Eslami and Fellenius [1997\)](#page-26-0) and the UniCone method (Eslami and Fellenius [1997](#page-26-0); Fellenius [2002](#page-26-0)) with rank number 2 and 3 have higher accuracy.

There are a number of reasons why some methods perform well in prediction of pile capacities while others do not. A chief reason is that some researchers have introduced methods ignoring the soil type, pile installation methods or pile material types in which approximation becomes a brilliant factor in such methods. If they had classified their methods in more details for pile installation, soil type and pile material, there would have been much more accurate methods. Unfortunately, some of the methods did not do these classifications. For instance, they presented their methods in all soil types or in all pile types and it is obvious that they did not consider some facts. For example, for pile-soil friction along the pile shaft, the soil type, pile material, and interaction features are of great importance, or steel and concrete piles have different α values in conventional α -method. These are because of the fact that these researchers seek simplicity in order not to confuse practicing engineers. However, nowadays for economical consideration in the pile design, it may be preferable to consider all contributing parameters in methods predicting the axial capacity of piles.

Moreover, these CPT-based methods are empirical fitting; sometimes their databases might not have any variations resulting in the accuracy reduction of the methods. The variations of databases have significant effect on all the empirical methods. In conclusion, the performance of CPT-based methods depends on classifying soil and pile types and the ranges of databases.

It is recommended that the results of this investigation be considered in practice which can assist geotechnical engineers to have more precise designs through the best methods in each soil type. Moreover, it is necessary to develop more CPT and CPTu based methods and qualify existing methods for better prediction of pile capacity. Both are beyond the scope of this paper and need further investigation.

Fig. 10 Twenty percent accuracy from the histogram and lognormal distribution for Q_E/Q_M in sand

Fig. 11 Twenty percent accuracy from the histogram and lognormal distribution for Q_E/Q_M in clay

Fig. 12 Twenty percent accuracy from the histogram and lognormal distribution for Q_E/Q_M in mixed soil

of Q_E/Q_M in sand

 Q_E/Q_M in clay

 Q_E/Q_M in mixed soils

Appendix: Direct CPT and CPTu Methods

For more details about these 25 methods refer to ''Cone Penetration Test-Based Direct Methods for Evaluating Static Axial Capacity of Single Piles: A State-of-the-Art Review'' (Niazi and Mayne [2013\)](#page-27-0) (Table [5\)](#page-21-0).

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Table 5 continued

References

- Abu-Farsakh MY, Titi HH (2004) Assessment of direct cone penetration test methods for predicting the ultimate capacity of friction driven piles. J Geotechn Geoenviron Eng 130:935–944
- Albiero J, Sacilotto A, Mantilla J, Teixeira C, Carvalho D (1995) Sucessive load tests on bored piles. In: Proceedings, 1995.
- Almeida MS, Danziger FA, Lunne T (1996) Use of the piezocone test to predict the axial capacity of driven and jacked piles in clay. Can Geotech J 33:23–41
- Alsamman OM (1995) The use of CPT for calculating axial capacity of drilled shafts. University of Illinois at Urbana-Champaign
- Altaee A, Evgin E, Fellenius BH (1992a) Axial load transfer for piles in sand. II Numerical analysis. Can Geotech J 29:21–30
- Altaee A, Fellenius BH, Evgin E (1992b) Axial load transfer for piles in sand. I Tests on an instrumented precast pile. Can Geotech J 29:11–20
- Amirmojahedi M, Abu-Farsakh M (2019) Evaluation of direct pile-CPT methods for estimating the ultimate capacity of driven piles. In: Geo-Congress 2019: Foundations, 2019. American Society of Civil Engineers Reston, VA, pp 167–177
- Aoki N, Velloso DdA (1975) An approximate method to estimate the bearing capacity of piles. In: Proceedings of 5th Pan-American Conference of Soil Mechanics and Foundation Engineering. International Society of Soil Mechanics and Geotechnical Engineering Buenos …, pp 367–376
- Attar IH, Fakharian K (2013) Influence of soil setup on shaft resistance variations of driven piles: case study. Int J Civ Eng Trans B: Geotech Eng 11:4–5
- Avasarala S, Davidson J, McVay A (1994) An evaluation of predicted capacity of single piles from SPILE and UNI-PILE programs. In: Proceedings of the FHWA International Conference on Design and Construction of Deep Foundations, Orlando, Fla, 1994. pp 712–723
- Axelsson G (1998) Long-term increase in shaft capacity of driven piles in sand. International Conference on Case Histories in Geotechnical Engineering, University of Missouri—Rolla-57
- Begemann HP (1963) The use of the static soil penetrometer in Holland. NZ Eng 18:41
- Begemann H (1965) The maximum pulling force on a single tension pile calculated on the basis of results of the adhesion jacket cone. In: Proceedings of the 6th International Conference on Soil Mechanics and Foundation Engineering, Montreal, pp 229–233
- Begemann H (1969) The dutch static penetration test with the adhesion jacket cone. Chapter III Tension Piles.. LGM Mededelingen, Delft
- Bogdanovic L (1961) The use of penetration tests for determining the bearing capacity of piles. In: Proceedings of the 5th International Conference on Soil Mechanics and Foundation Engineering, Paris
- Briaud J (1988) Evaluation of cone penetration test methods using 98 pile load tests. In: Proceedings of the 1st International Symposium on Penetration Testing, pp 687–697
- Briaud J-L, Moore BH, Mitchell GB (1989) Analysis of pile load tests at Lock and Dam 26. In: Foundation engineering: Current Principles and Practices. ASCE, pp 925–942
- Bustamante M, Frank R (1997) Design of axially loaded piles in France: National Report. International Seminar Design of Axially loaded piles: European Practice, Brussels, Belgium
- Bustamante M, Gianeselli L (1982) Pile bearing capacity prediction by means of static penetrometer CPT. In: Proceedings of the 2-nd European Symposium on Penetration Testing, pp 493–500
- Cai G, Liu S, Puppala AJ (2011) Evaluation of pile bearing capacity from piezocone penetration test data in soft Jiangsu Quaternary clay deposits. Marter Georesour Geotechnol 29:177–201
- Cai G, Liu S, Puppala AJ (2012) Reliability assessment of CPTU-based pile capacity predictions in soft clay deposits. Eng Geol 141:84–91
- Campanella R, Robertson P, Davies M, Sy A (1989) Use of in situ tests in pile design. In: Congrès International de Mècanique Des Sols Et Des Travaux de Fondations, vol 12, pp 199–203
- Clausen C, Aas P, Karlsrud K (2005) Bearing capacity of driven piles in sand, the NGI approach. In: Proceedings of International Symposium. on Frontiers in Offshore Geotechnics, Perth, pp 574–580
- Clisby M, Scholtes R, Corey M, Cole H, Teng P, Webb J (1978) An evaluation of pile bearing capacities, vol I. Final Report, Mississippi State Highway Department
- De Ruiter J, Beringen F (1979) Pile foundations for large North Sea structures. Marter Georesour Geotechnol 3:267–314
- Douglas B (1981) Soil classificaion using electric cone penetrometer. In: Symposium on Cone Penetration Testing and Experience, Geotech. Engrg. Div. ASCE, pp 209–227
- Eslami A, Fellenius BH (1997) Pile capacity by direct CPT and CPTu methods applied to 102 case histories. Can Geotech J 34:886–904
- Eslami A, Aflaki E, Hosseini B (2011) Evaluating CPT and CPTu based pile bearing capacity estimation methods using Urmiyeh Lake Causeway piling records. Scientia Iranica 18:1009–1019
- Eslami A, Tajvidi I, Karimpour-Fard M (2014) Efficiency of methods for determining pile axial capacity-applied to 70 cases histories in Persian Gulf northern shore. Int J Civ Eng 12:45–54
- Fellenius B (2002) Excerpt from Chapter 6 of the Red Book: Direct methods for estimating pile capacity vol 22. Background to UniCone.[https://fellenius.net](http://fellenius.net). Accessed May.
- Finno R (1989) Subsurface conditions and pile installation data. American Society of Civil Engineers. In: Proceedings of Symposium on Predicted and Observed Behavior of Piles, Evanston, pp 1–74
- Gambini F (1985) Experience in Italy with centricast concrete piles. In: Proceedings of International Symposium on Penetrability and Drivability of Piles, pp 97–100
- Haustorfer I, Plesiotis S Instrumented dynamic and static pile load testing at two bridge sites. In: Fifth Australia-New Zealand conference on geomechanics: prediction versus performance; preprints of Papers, 1988. Institution of Engineers, Australia, p 514
- Hegazy YA, Mayne PW (2002) Objective site characterization using clustering of piezocone data. J Geotech Geoenviron Eng 128:986–996
- Horvitz G, Stettler D, Crowser J (1981) Comparison of predicted and observed pile capacity. In: Cone Penetration Testing and Experience. ASCE, pp 413–433
- Huichang W (1991) A method for predicting load–settlement relationship and bearing capacity of single piles by means of CPT. In: DFI, Beijing, 1991.
- Jefferies M, Davies M (1991) Soil classification by the cone penetration test: discussion. Can Geotech J 28:173–176
- Kempfert H-G, Becker P (2010) Axial pile resistance of different pile types based on empirical values. In: Deep Foundations and Geotechnical In Situ Testing, pp 149–154
- Kolk H, Baaijens A, Senders M (2005) Design criteria for pipe piles in silica sands. In: Design criteria for pipe piles in silica sands. CRC Press/Balkema, pp 711–716
- Lee J, Salgado R (1999) Determination of pile base resistance in sands. J Geotech Geoenviron Eng 125:673–683
- Lehane B, Schneider J, Xu X (2005) The UWA-05 method for prediction of axial capacity of driven piles in sand. In: Frontiers in Offshore Geotechnics: ISFOG, 2005. pp 683–689
- Long JH, Wysockey MH (1999) Accuracy of methods for predicting axial capacity of deep foundations. In: Analysis, Design, Construction, and Testing of Deep Foundations. ASCE, pp 180–195
- Lunne T, Powell JJ, Robertson PK (2002) Cone penetration testing in geotechnical practice. CRC Press
- Matsumoto T, Michi Y, Hirano T (1995) Performance of axially loaded steel pipe piles driven in soft rock. J Geotech Eng 121:305–315
- Mayerhof G (1976) Bearing capacity and settlemtn of pile foundations J Geotech Geoenviron Eng 102
- Mayne P (1993) Axial load-displacement behavior of drilled shaft foundations in Piedmont Residuum. US Federal Highway Administration. Research Report FHWA-41–30– 2175,
- Meyerhof G (1956) Penetration tests and bearing capacity of cohesionless soils. J Soil Mech Found Div 82:1–19
- Meyerhof GG (1983) Scale effects of ultimate pile capacity. J Geotech Eng 109:797–806
- Nevels JB, Snethen DR (1994) Comparison of settlement predictions for single piles in sand based on penetration test results. In: Vertical and Horizontal Deformations of Foundations and Embankments. ASCE, pp 1028–1038
- Niazi FS, Mayne PW (2013) Cone penetration test based direct methods for evaluating static axial capacity of single piles. Geotech Geol Eng 31:979–1009
- Niazi FS, Mayne PW (2016) CPTu-based enhanced UniCone method for pile capacity. Eng Geol 212:21–34
- Nicola AD, Randolph M (1999) Centrifuge modelling of pipe piles in sand under axial loads. Géotechnique 49:295–318
- Nottingham LC (1975) Use of quasi-static friction cone penetrometer data: To predict load capacity of displacement piles. University of Florida
- Obeta I, Onyia M, Obiekwe D (2018) Comparative analysis of methods of pile-bearing capacity evaluation using CPT logs from tropical soils. J South Afr Instit Civ Eng 60:44–55
- Olsen R (1995) CPT stress normalization and prediction of soil classification. In: Proceedings of the International Symposium on Cone Penetration Testing, CPT'95, pp 257–262
- O'Neil M (1988) Pile group prediction symposium-summary of prediction results.
- O'Neill M, Hawkins R, Mahar L (1981) Field study of pile group action. US Federal Highway Administration. FHWA Report RD-81/002,
- Philipponnat G (1980) Méthode pratique de calcul d'un pieu isolé, à l'aide du pénétromètre statique Revue Francaise de Geotechnique, pp 55–64
- Powell J, Quarterman R (1988) The interpretation of cone penetration tests in clays, with particular reference to rate effects vol 2.
- Powell J, Lunne T, Frank R (2001) Semi empirical design procedures for axial pile capacity in clays. In: 15th International Conference on Soils Mechanics and Geotechnical Engineering, 2001. pp 991–994
- Price G, Wardle I (1982) A comparison between cone penetration test results and the performance of small diameter instrumented piles in stiff clay. In: Proceedings, the 2nd European Symposium on Penetration Testing, pp 775–780
- Rauser JG (2008) In-situ and nondestructive test methods applied to the design and construction of pile foundation projects in coastal Louisiana. Master Thesis,
- Reese J, O'Neill M, Wang S (1988) Drilled shaft tests, interchange of west belt roll road and US290 highway
- Robertson P (1990) Soil classification using the cone penetration test. Can Geotech J 27:151–158
- Robertson PK, Campanella R, Gillespie D, Greig J (1986) Use of piezometer cone data. In: Use of In Situ Tests in Geotechnical Engineering. ASCE, pp 1263–1280
- Schmertmann JH (1978) Guidelines for cone penetration test: performance and design. New York, Federal Highway Administration
- Schneider JA, Xu X, Lehane BM (2008) Database assessment of CPT-based design methods for axial capacity of driven piles in siliceous sands. J Geotechn Geoenviron Eng 134:1227–1244
- Takesue K, Sasao H, Matsumoto T (1998) Correlation between ultimate pile skin friction and CPT data. Geotech Site Charact 2:1177–1182
- Tumay MT, Fakhroo M (1981) Pile capacity in soft clays using electric QCPT data. In: Cone Penetration Testing and Experience. ASCE, pp 434–455
- Urkkada Technology Ltd (1996) Dynamic testing of piles and analysis. Puerto Rico, Final Report, Urkkada Technology Ltd. Project 9509DH17
- Viergever MA (1982) Relation between cone penetration and static loading of piles in locally strongly varying sand layers. In: Proceedings of the 2nd European Symposium on Penetration Testing, ESOPT-2, Amsterdam, pp 927–932
- Vukićević M, Marjanović M, Pujević V, Obradović N (2018) Evaluation of methods for predicting axial capacity of jacked-in and driven piles in cohesive soils. Gradevinar 70:685–693
- Weber L (1987) Efficiency improvement of steel H-bearing piles vol 7210.
- White DJ, Bolton MD (2005) Comparing CPT and pile base resistance in sand. In: Proceedings of the Institution of Civil Engineers-Geotechnical Engineering. vol 1. pp 3–14
- Wilkinson PB, Chambers JE, Meldrum PI, Ogilvy RD, Caunt S (2006a) Optimization of array configurations and panel combinations for the detection and imaging of abandoned mineshafts using 3D cross-hole electrical resistivity tomography. J Environ Eng Geophys 11:213–221
- Wilkinson PB, Meldrum PI, Chambers JE, Kuras O, Ogilvy RD (2006b) Improved strategies for the automatic selection of optimized sets of electrical resistivity tomography measurement configurations. Geophys J Int 167:1119–1126
- Yen T-L, Lin H, Chin C-T, Wang R (1989) Interpretation of instrumented driven steel pipe piles. In: Proceedings

Foundation Engineering Congress: Current Principle and Practices, GSP No, 1989. pp 1293–1308

Zhang Z, Tumay MT (1999) Statistical to fuzzy approach toward CPT soil classification. J Geotech Geoenviron Eng 125:179–186

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