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# Characterization of Model Uncertainty in Predicting Axial Resistance of Piles Driven into Clay

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**Abstract:** This paper summarizes 239 static load tests to evaluate the performance of four static design methods for axial resistance of driven piles in clay. The methods are ISO 19901-4:2016, SHANSEP, ICP-05, and NGI-05. The database is categorized into four groups depending on the load type (compression or uplift) and pile tip condition (open or closed end). The model uncertainty in resistance prediction is quantified as a ratio between measured and calculated resistance, which is called a model factor. The measured resistance is interpreted as a load producing a settlement level of 10% pile diameter. Database studies show that four methods present a similar accuracy, where the mean and coefficient of variation (COV) of the model factor are around 1 and 0.3 respectively. The COV values are smaller than those for driven piles in sand available in literature. The model statistics determined from the database are also applicable to a simplified or full probabilistic form of reliability-based design (RBD) of driven piles in clay. As an illustration, the resistance factors in load and resistance factor design (LRFD, a simplified format of RBD) are calibrated by Monte Carlo simulations.

Keywords: Model uncertainty, Axial resistance, Driven piles, Clay, Load and resistance factor design

## Introduction

### Background

Numerous studies have been implemented to deliver a better understanding of the behaviour of driven piles in clay (Seed and Reese 1955; Peck 1958; Randolph et al. 1979; Blanchet et al. 1980; Morrison 1984; Jardine 1985; Azzouz and Lutz 1986; Chin 1986; Coop 1987; Bond 1989; Poulos 1989; Lehane 1992; Miller 1994; Chow 1997; McCabe 2002; Doherty 2010; Karlsrud 2012; Chen et al. 2014; Karlsrud et al. 2014; Haque et al. 2017). Factors that have an impact on driven pile behaviour were identified. Based on the experimental observations, various semi-empirical approaches were proposed to predict the

axial pile resistance according to Eq. (1), which is calculated as the sum of the tip  $R_t$  and the shaft resistances  $R_s$  (Salgado 2008)

$$R_{uc} = R_s + R_t = \pi \cdot B \cdot \int \tau_f dz + r_t \cdot A_t \quad (1)$$

where  $R_{uc}$  is the calculated ultimate pile resistance,  $\tau_f$  is the local ultimate shaft resistance,  $z$  is the depth to the ground surface,  $B$  is the pile diameter or width,  $r_t$  is the ultimate unit tip resistance over the pile tip area, and  $A_t$  is the pile tip area.

Eq. (1) assumes that the pile tip and shaft are moved sufficiently with respect to the adjacent soil to simultaneously develop the shaft and tip resistances. Although the displacement needed to mobilize the shaft resistance is generally smaller than that required to mobilize the tip resistance, this assumption was widely used for piles with diameter or width smaller than 914 mm (36 inches) (Hannigan et al. 2016). Open-end piles with diameter of 914 mm or greater are not considered in the present work. This pile type presents a unique challenge for practical engineers owing to the combination of several factors (Brown and Thompson 2015): (i) soil plug during pile installation is highly uncertain which has a significant effect on pile behavior; (ii) installation difficulty and potential damage during driving; (iii) difficulty in estimation of axial resistance from internal friction; and (iv) difficulty in verifying large nominal axial resistance with conventional load testing.

## Review of design methods

To derive an analytically tractable model, physical and geometrical assumptions and simplifications are inevitably made. For instance, the unit tip resistance  $r_t$  is frequently taken from plasticity solutions (Hannigan et al. 2016)

$$r_t = N_c \cdot s_u \quad (2)$$

where  $N_c$  is the dimensionless bearing capacity factor, which is usually selected as 9 and  $s_u$  is the undrained shear strength.

Many studies were previously performed to predict the ultimate shaft resistance. The proposed methods can be grouped into four broad categories (Karlsrud 2014):

1.  $\alpha$ -methods (Tomlinson 1957; Dennis and Olson 1983; Semple and Rigden 1984; Randolph and Murphy 1985; Kolk and van der Velde 1996; Karlsrud et al. 2005; Van Dijk and Kolk 2010; Karlsrud 2014), in which the ultimate shaft resistance is directly related to the undrained shear strength

$$\tau_f = \alpha \cdot s_u \quad (3)$$

where  $\alpha$  is the adhesion factor which could be a function of  $s_u$  or  $s_u/\sigma_{v0}'$ , in which  $\sigma_{v0}'$  is the effective vertical stress; pile length  $D$ ; and/or other parameters.

2.  $\beta$ -methods (Burland 1973; Jardine et al. 2005; Karlsrud 2014), in which the ultimate shaft resistance is correlated to the effective vertical stress  $\sigma_{v0}'$

$$\tau_f = \beta \cdot \sigma_{v0}' \quad (4)$$

where  $\beta$  is a coefficient equal to the ultimate shaft resistance normalized to the effective vertical stress, which could also depend on soil properties and pile geometries.

3.  $\lambda$ -method (Vijayvergiya and Focht 1972), a combination of  $\alpha$  and  $\beta$  methods, which depends on the undrained shear strength and effective vertical stress

$$\tau_f = \lambda \cdot (a \cdot \sigma_{v0}' + b \cdot s_u) \quad (5)$$

where  $\lambda$  is a coefficient equal to the ultimate shaft resistance normalized to the combination of the undrained shear strength and effective stress,  $a$  and  $b$  are constants.

4. In situ test-based methods which directly relate the ultimate shaft resistance to the in situ test results, such as standard penetration test (SPT) (Meyerhof 1976) or cone penetration test (CPT) (Lehane et al. 2013). They eliminate the intermediate estimation of soil engineering parameters.

Detailed summaries of the methods for resistance calculation can be found in Doherty and Gavin (2011) and Niazi (2014). It is clearly observed some empirical coefficients (e.g.  $\alpha$ ,  $\beta$ , and  $\lambda$ ) are involved within these methods, which were usually calibrated against pile load test (typically limited). The deviation of the predicted from the measured resistance would be expected, because of the simplifications, assumptions, and approximations made in the respective design model. This deviation is expressed as

model uncertainty (Lacasse and Nadim 1996; Lacasse et al. 2013a, b; Phoon et al. 2016; Lesny 2017), which is of epistemic nature (Nadim 2015).

### **Objective of this study**

The fourth edition of ISO 2394 (General Principles on Reliability for Structures) (International Organization for Standardization 2015) now contains a new informative Annex D on “Reliability of Geotechnical Structures”. ISO 2394:2015 is meant to be used as a basis for national/international code committees to draft design codes where the principles of risk and reliability are utilized (Phoon 2016). The model uncertainty was identified as one of critical elements of geotechnical reliability-based design (RBD) process in Annex D (Phoon et al. 2016).

Accordingly, the primary objective of this paper is to characterize the model uncertainty in calculating the axial resistance of driven piles in clay by (i)  $\alpha$ -methods in ISO 19901-4:2016 (ISO 2016) and Karlsrud et al. (2005), (ii)  $\beta$ -method in Jardine et al. (2005), and (iii) the stress history and normalized soil engineering parameter (SHANSEP) concept in Saye et al. (2013). To this end, an integrated database of 239 field static load tests which are compiled from literature is developed. The quantified model uncertainty are then applied to calibrate the resistance factors in load and resistance factor design (LRFD) of driven piles in clay using Monte Carlo simulations with the load statistics in AASHTO LRFD specification (AASHTO 2014).

### **Representation of model uncertainty**

Following the Annex D of ISO 2394:2015, the model uncertainty is simply represented as the ratio of the measured resistance to the calculated resistance:

$$M_u = \frac{R_{um}}{R_{uc}} \quad (6)$$

where  $M_u$  is the resistance model factor and  $R_{um}$  is the measured resistance. This approach is practical, but realistically grounded on the load test database. On the other hand, Lesny (2017) commented that the model factor approach could reach its limits where obvious deficiencies exist in the design model such as offshore pile foundation under combined loading (e.g. vertical structural load and lateral wave force).

Evaluation of the resistance model factor consists of the computation of mean and coefficient of variation (COV) and identification of probability distribution. A model factor with an excessively large COV may indicate that the respective design model does not capture the key features of the problem. Resistance model statistics and application in LRFD of driven piles can be found in Paikowsky et al. (2004), Su (2005), Abu-Farsakh et al. (2009), Yang and Liang (2006, 2009), Kwak et al. (2010), Dithinde et al. (2011), AbdelSalam et al. (2012), Vu (2013), Machairas et al. (2018), and Tang and Phoon (2018a-c). For each type of pile tip (open or closed end) under compression or uplift, dataset used in the previous studies remain surprisingly small (Lacasse and Nadim 1996; Paikowsky et al. 2004; Lacasse et al. 2013a, b; Lehane et al. 2013; Saye et al. 2013; Karlsrud 2014).

It should be noted that the main problem of using database to characterize the model uncertainty is the limited number of tests from different sources with each covering only a limited range of possible design situations (Lesny 2017).

## **Estimation Methods for Pile Shaft Resistance**

### **ISO 19901-4:2016**

The absolute value of the undrained shear strength was adopted early to evaluate the adhesion factor  $\alpha$  such as the method of Tomlinson (1957). In contrast, Semple and Ridgen (1994) first introduced the normalized strength as a basis for the  $\alpha$ -value. Subsequently, this concept was widely employed. In Chapter 8 “Pile foundation design” of ISO 19901-4:2016 (ISO 2016), the adhesion factor  $\alpha$  varies based on effective stress and is computed as

$$\begin{aligned} \alpha &= 0.5 \cdot \Psi^{-0.5} & \Psi \leq 1 \\ \alpha &= 0.5 \cdot \Psi^{-0.25} & \Psi > 1 \end{aligned} \quad (7)$$

with  $\alpha \leq 1$ , where  $\Psi = s_u / \sigma_{v0}'$ . Kolk and van der Velde (1996) proposed a similar format to Eq. (7), but includes a length factor. Unconsolidated-undrained (UU) triaxial compression tests on high quality sample are recommended for establishing the undrained shear strength because of their consistency and repeatability.

### NGI-05 method

Over the past 30 years, the Norwegian Geotechnical Institute (NGI) carried out a number of field load tests on driven piles. It was recognized that the plasticity index could have a large influence on the shaft resistance. In this context, a new calculation method, called NGI-05, was presented in Karlsrud et al. (2005), where the  $\alpha$ -value is given below

$$\alpha = 0.32(I_p - 10)^{0.3} \quad (8)$$

for normally consolidated (NC) clay with  $0.2 < \alpha < 1$  and  $\Psi < 0.25$  and

$$\alpha = 0.5 \cdot \Psi^{-0.3} \cdot F_t \quad (9)$$

for overconsolidated (OC) clay with  $\Psi > 1$ , where  $I_p$  is the plasticity index and  $F_t$  is the correction factor=1 for open-end pile and  $0.8 + 0.2 \cdot \Psi^{0.5}$  for closed-end pile. For clay with  $0.25 < \Psi < 1$ ,  $\alpha$  is estimated by an interpolation between  $\Psi=0.25$  and 1 from a semi-log plot in Karlsrud et al. (2005). The reference strength within the NGI-05 method is the UU triaxial strength.

Karlsrud (2012) argued that the undrained shear strength from direct simple shear (DSS) test is a more appropriate representation of the strength characteristics, as this mode of shearing is most comparable to that of a soil element along the axially loaded pile shaft (Karlsrud 2014). A modified version of the NGI-05 method was developed in Karlsrud (2014), where the DSS undrained shear strength was utilized to determine the  $\alpha$ -coefficient for different values of the plasticity index.

### SHANSEP-based approach

Saye et al. (2013) presented a method to estimate the shaft resistance of driven pipe pile in clay using the SHANSEP concept. In this approach, the shaft resistance  $\tau_f$  is treated as an adhesion, which is normalized with respect to  $\sigma'_{v0}$ . The normalized adhesion is then related to the soil overconsolidation ratio (OCR) in the same format as the concept for normalized undrained shear strength given by Ladd and Foott (1974), which is given below

$$\frac{\tau_f}{\sigma'_{v0}} = \left( \frac{\tau_f}{\sigma'_{v0}} \right)_{NC} \cdot \text{OCR}^m \quad (10)$$

which separates the NC from the OC behavior, where  $\tau_f/\sigma_{v0}'$  is the normalized side adhesion,  $[\tau_f/\sigma_{v0}']_{NC}$  is the normalized side adhesion of NC clay=0.19,  $m=0.7$  for an exponent representing the increasing in with OCR, and OCR is evaluated as

$$OCR = \left( \frac{\Psi}{0.32} \right)^{1.25} \quad (11)$$

where the undrained shear strength is determined from UU triaxial compression test or unconfined compression (UC) test.

As discussed in Saye et al. (2013), the SHANSEP-based approach provides the means to address many of the limitations of conventional empirical correlations of axial resistance with undrained shear strength. Saye et al. (2016) examined the effect of sample disturbance on laboratory undrained shear strength tests used in the SHANSEP-based approach to predict the ultimate shaft resistance of driven closed-end pipe piles. For cohesive soils with  $OCR < 2$ , sample disturbance was identified as a significant factor affecting the ultimate shaft resistance. With removing the case histories from the database in Saye et al. (2013) that were likely affected by sample disturbance, an equivalent  $\alpha$ -method was produced by Saye et al. (2016), where  $\alpha = 0.51 \cdot \Psi^{-0.12}$ .

It has been stated above that the UU undrained shear strength is preferable in the methods of ISO 19901-4:2016, NGI-05, and SHANSEP. Another type of shear strength such as consolidated-isotropically undrained triaxial compression (CIUC) and UC test can be converted into the UU type using the relations in Chen and Kulhawy (1993).

### ICP-05 method

The  $\beta$ -methods in Eq. (4) are effective stress analyses based on the theory of lateral earth pressure, expressed as

$$\tau_f = K_\delta \cdot \tan \delta_f \cdot \sigma_{v0}' \quad (12)$$

where  $K_\delta$  is the coefficient of lateral earth pressure,  $\delta_f$  is the friction angle of the soil-pile interface, and the coefficient  $\beta$  is a product of  $K_\delta$  and  $\tan \delta_f$ . Burland (1973) suggested a typical range of  $\beta = 0.25-0.4$  for



soft clays and  $K_\delta$  was assumed to be the coefficient of lateral earth pressure at rest for stiff clays, but without a clear recommendation for  $\tan\delta_f$ . A double-log design chart for the  $\beta$ -coefficient was presented in Karlsrud (2014) for different values of plasticity index and OCR.

Randolph (2003) mentioned that a scientific approach to determine the shaft resistance of a driven pile should consider the complex stress-strain history. The mechanisms governing the pile behaviour can be categorized into the following phases (Doherty and Gavin 2011): (i) prior to installation, stresses within soil correspond to in situ state; (ii) stresses within soil increase during pile installation; (iii) stresses will change due to the dissipation of pore-water pressure, residual loads and age-related effects, resulting in an equalized radial stress prior to loading; and (iv) applied load may induce additional increases in radial stress on the shaft due to interface dilation, eventually reaching failure at peak radial stresses.

Based on the enhanced understanding of pile behaviour, Jardine et al. (2005) proposed a new effective stress analysis method, called ICP-05, where ICP is an abbreviation of Imperial College Pile. The ICP-05 method made an attempt to account for the actual radial effective stress acting on the pile shaft surface and the  $K_\delta$  and  $\delta_f$  values are separately evaluated in a rational way:

$$\begin{aligned}\tau_f &= \sigma'_{rf} \cdot \tan \delta_f, \quad \sigma'_{rf} = 0.8 \cdot \sigma'_{rc}, \quad \sigma'_{rc} = K_c \cdot \sigma'_{v0} \\ K_c &= (2.2 + 0.016 \cdot \text{OCR} - 0.87 \cdot \log_{10} S_t) \cdot \text{OCR}^{0.42} \cdot F_L\end{aligned}\quad (13)$$

where  $\sigma'_{rf}$  is the radial effective stress against the pile shaft at failure,  $\sigma'_{rc}$  is the radial effective stress against the pile shaft after full consolidation,  $K_c$  is the coefficient of radial effective earth pressure after full setup,  $S_t$  is the sensitivity which is defined as the ratio of intact and remoulded undrained shear strength, and  $F_L = [\max(z/R^*, 8)]^{-0.2}$ ,  $R^* = R_0 = \text{outer radius for closed-end pile}$  and  $R = (R_0^2 - R_i^2)^{0.5}$  for open-end pile,  $R_i$  is the inner radius. The effects of pile length, diameter and tip condition (open- or closed-end) are considered in Eq. (13) with the geometric term  $F_L$ .

The basic assumption of Eq. (13) is that the ultimate shaft resistance is primarily controlled by the interface friction angle of reconstituted clay as determined by ring shear tests and the radial effective stress. If the measurement of OCR and  $S_t$  are unavailable, they can be determined from the known shear strength  $s_u$  and effective vertical stress  $\sigma'_{v0}$  via the relations in Augustesen (2006). For the friction angle  $\delta_f$

along the pile shaft-soil interface, there is no universal and reliable link to the plasticity index  $I_p$ , which it could be estimated from the best fit  $\delta_r-I_p$  line in Jardine et al. (2005).

### **Database of Pile Load Tests**

A database with well-documented field and laboratory test data plays a key role in piling industry, first and foremost in deriving more accurate and reliable design methods (Kolk and van der Velde 1996; Jardine et al. 2005; Karlsrud et al. 2005; Van Dijk and Kolk 2010; Lehane et al. 2013; Karlsrud 2014) and second in the calibration of current design methods or the characterization of model uncertainty in pile design which has been discussed earlier in this paper. Studies on the development of pile load test database were conducted by Olson and Dennis (1982), Briaud and Tucker (1988), Eslami and Fellenius (1997), Augustesen (2006), Roling et al. (2011), Niazi (2014), AbdelSalam et al. (2015), Abu-Hejleh et al. (2015), Yang et al. (2015), Lehane et al. (2017), Adhikari et al. (2018), Moshfeghi and Eslami (2018), and Tang and Phoon (2018a).

Lambe (1973) discussed that the quality of geotechnical prediction does not necessarily increase with the level of sophistication in the model. He opined that reasonable calculations can be obtained using simple models as long as there are sufficient data to calibrate these models empirically. Such an observation emphasizes the importance of data in geotechnical engineering. The full value of a database is arguably best realized within a direct probability-based design method (Wang et al. 2016). Recent development in the gradual adoption of RBD is more sensitive to information. The latest edition of the *Canadian highway bridge design code* (Canadian Standards Association 2014) introduces the concept of a resistance factor that depends on the “degree of understanding” (low, typical, high). Fenton et al. (2016) noticed that “there is a real desire amongst the geotechnical community to have their designs reflect the degree of their site and model understanding”. Site understanding is associated with how well the ground providing the geotechnical resistance is known and model understanding refers to the degree of confidence that a designer has in the model used to predict the geotechnical resistance.

For the purpose of this work, a global database is developed in Tables A1-A2 in Appendix A1. The measured resistances, pile geometries, and key soil engineering parameters are reported. The load test data are compiled from

1. Saldivar and Jardine (2005) reported 27 compression tests on concrete piles in Mexico City clay. Pre-boring was used in 26 static load tests to ease pile-driving difficulties. Little research was conducted on the possible effects of pre-boring, which are often ignored. All 27 tests are given in Table A1.
2. Augustesen (2006) collated a filtered database with 268 static load tests on concrete, steel and timber piles, which were collected from literature, Norwegian and Danish companies. The criteria to choose the data can be found in Augustesen (2006). 189 load tests on concrete and steel piles are adopted in Tables A1-A2.
3. Lehane et al. (2013) summarized 53 tests in Chow (1997) and 22 tests in literature, with complete CPT profile. Because 62 load tests have been considered by Augustesen (2006), the other 15 tests are integrated into Tables A1-A2.
4. Karlsrud (2014) presented 60 instrumented and 12 non-instrumented pile tests from previous studies. As 64 tests have been contained within the filtered database of Augustesen (2006), the other 8 uplift tests on steel open-end piles are included within Table A2.

The ranges of pile diameter, slenderness ratio and the normalized soil engineering parameters are given in Table 1. The load test regions cover Belgium, Canada, China, Denmark, Germany, Indonesia, Iran, Ireland, Italy, Mexico, Norway, Singapore, Sweden, Turkey, Thailand, United Kingdom, and United States. The clay parameters cover a wide range of plasticity index  $I_p$  (10-160), sensitivity  $S_t$  (1-17), and overconsolidation ratio OCR (1-43). The pile diameter or width ranges between 0.1 and 0.81. The collected 239 static load tests on driven piles in clay is divided into four groups: (i) 115 compression tests on closed-end pile (65 for concrete and 55 for steel), (ii) 60 compression tests on open-end steel pipe pile, (iii) 32 uplift tests on closed-end pile (7 for concrete and 25 for steel), and (iv) 32 uplift tests on open-end steel pipe pile.

It is very common in practice that many pile load tests are not carried out to failure, where the corresponding load-settlement curves do not show a clear peak. Therefore, the measured resistance in Eq. (6) usually refers to an interpreted value from the measured load-settlement data with a certain criterion. Marcos et al. (2013) evaluated the bias in resistance interpretation criteria for driven precast concrete piles in compression for drained and undrained condition. Studies associated with the effect of bias in failure criteria on the model statistics and reliability analysis were performed by Phoon and Kulhawy (2005) and Zhang et al. (2005). In this article, the measured resistance is defined as the load corresponding to a pile head settlement of 10% of the pile diameter  $B$ . It is very easy to apply in practice and allows both the tip and shaft resistances to be fully mobilized as possible.

## **Probabilistic Evaluation of Resistance Model Factor**

### **Uncertainty in resistance calculation**

For driven pile in clay, the calculated resistances using the ISO 19901-4:2016, NGI-05 (Karlsrud et al. 2005), ICP-05 (Jardine et al. 2005), and SHANSEP-based methods (Saye et al. 2013) are summarized in Tables A1-A2 in Appendix A1. They are plotted against the measured resistances in Fig. 1. It can be seen that the mean trend lines are quite close to the equality line. Fig. 2 shows that the resistance model factor  $M_u$  takes a range of values. Uncertainty in resistance prediction could be attributed to the following factors:

1. Theoretical imperfections of the  $\alpha$ -methods (Doherty and Gavin 2011) are that (i) soil behavior governed by effective stress and the change in the stress-strain relation arising from the pile installation cannot be completely described by the initial undrained strength profile and (ii) the effect of the friction along the soil-shaft interface on the location of failure surface on which the shear resistance develops is not considered.
2. Idealization of the soil profile as homogeneous clay for each site when clay exists along more than 70% of the profile (AbdelSalam et al. 2012). In reality, spatial variability is an intrinsic feature of a site profile.

3. Measurement errors in pile load test and test to determine soil engineering parameters (e.g.  $s_u$ , OCR, and  $S_t$ ) and transformation errors within the models used to estimate soil properties and the interface friction angle  $\delta_f$ , when accurate measurement is unavailable. Selection of soil parameters is subjective and different pile resistances can be obtained even for the same design model (Karlsrud 2014).
4. Empiricisms involved within these methods, in which the  $\alpha$ - and  $\beta$ -coefficients or lateral earth pressure coefficient  $K_c$  were calibrated against few load test data. When the design scenario (e.g. pile geometries and/or soil properties) is outside the domain of the calibration database, additional uncertainty will be introduced.
5. Uncertainty associated with the procedure and measurement technique used in load tests. Tomlinson (1995) stated that the rate of load application in a load test is different than that of a building under construction.
6. Bias in the definition and interpretation of the measured resistance from a load test.

In short, the model factor in Eq. (6) is a lumped variable covering many sources of uncertainties (i.e. spatial variability, measurement and transformation errors, and bias in the interpretation of load test data) (Lesny 2017).

### Verification of randomness

As discussed in Phoon et al. (2016), the model factors may not be random in the sense that it is systematically affected by input parameters such as problem geometry. In this situation, it may not be appropriate to treat the model factor as a random variable directly. Examples can be found in Zhang et al. (2015), Tang and Phoon (2017) and Tang et al. (2017a, b). Therefore, the randomness should be verified, prior to compute the mean and COV values and identify the probability distribution.

The observed values for the resistance model factor  $M_u$  are plotted against pile diameter  $B$  in Fig. 3, slenderness ratio  $D/B$  in Fig. 4, normalized shear strength  $\Psi=s_u/\sigma_{v0}'$  in Fig. 5, overconsolidation ratio OCR in Fig. 6, plasticity index  $I_p$  in Fig. 7, and sensitivity  $S_t$  in Fig. 8. Except for  $M_u$  of ISO 19901-4:2016 and

NGI-05 with respect to  $D/B$ , visual inspection suggests no major dependence exists between  $M_u$  and the input parameters.

The randomness is further verified with the presence or absence of correlation between the model factors and input parameters. The correlation is assessed using the Matlab function “corr”. The returning results are the  $r$ -value (i.e. correlation) and the  $p$ -value (i.e. probability). If the  $p$ -value is less than 0.05, the correlation  $r$  is significantly different from zero. The results from the Spearman rank correlation analyses are summarized in Table A3 in Appendix A2. Some  $p$ -values are lower than 0.05, suggesting the model factor may depend on the underlying parameter. For example of driven open-end pile in axial compression, the model factor for ISO 19901-4:2016 appears to decrease as slenderness ratio  $D/B$  increases, as shown in Fig. 4a. This implies that the  $\alpha$ -coefficient could be affected by  $D/B$ . Several previous studies attempted to express the  $\alpha$ -coefficient as a function of  $D/B$  to consider the potential length effect (Dennis and Olson 1983; Semple and Rigden 1984; Kolk and van der Velde 1996). Nevertheless, the most associated  $r$ -values vary between 0 and 0.4, indicating no or negligible to a moderate degree of correlation. For simplicity, the model factors of four design methods are still assumed to be random variables.

### **Discussion and comparison of model statistics**

The model statistics are given in Table 2. For driven piles in clay, the ranges of mean and COV are 1.05-1.08 and 0.31-0.34 (closed-end piles in compression), 0.92-1.11 and 0.26-0.29 (closed-end piles in uplift), 0.97-1.16 and 0.24-0.3 (open-end piles in compression), 0.85-1.01 and 0.27-0.39 (open-end piles in uplift). For each pile type, differences in the statistics of the resistance model factor  $M_u$  for four methods are not very significant. The results imply that these methods present a consistent accuracy. Similar observation was reported in Lehane et al. (2013, 2017). For steel pipe piles, the mean and COV of the NGI-05 method for the UU shear strength are 1.05 and 0.26. They are close the values of 1.04 and 0.2 for the revised NGI-05 method with the DSS shear strength (Karlsrud 2014). Augustesen (2006) also found that the model statistics with  $s_u$  conversion were comparable to those without  $s_u$  conversion. The results suggest that these methods might be statistically insensitive to errors in interpreted  $s_u$ .

According to Saye et al. (2016), the sample disturbance for clay with  $OCR < 2$  is considerably influential to measure  $s_u$  or preconsolidation stress  $\sigma_p'$  and therefore affects the calculation of shaft resistance. It is interesting to compare the performance of four design models for clay with  $OCR < 2$  and  $OCR > 2$ . In this regard, the observed resistance model factors for  $OCR < 2$  and  $OCR > 2$  are plotted against the measured resistances in Fig. 2, which does not differentiate the pile type (closed or open end) and load direction (compression or uplift). The difference within the observed model factors is not discernible. This can be further verified with the statistics. For  $OCR < 2$  (74 cases), the mean and COV values of  $M_u$  are 0.93 and 0.38 for ISO 19901-4:2016, 0.96 and 0.25 for NGI-05, 1.09 and 0.31 for SHANSEP, and 1.09 and 0.3 for ICP-05. The results are comparable to those for  $OCR > 2$  (164 cases), with 1.03 and 0.31 for ISO 19901-4:2016, 1.06 and 0.29 for NGI-05, 1.08 and 0.29 for SHANSEP, and 1.02 and 0.32 for ICP-05. On this basis, there is no need to derive the model statistics respectively for  $OCR < 2$  and  $OCR > 2$ .

For comparison purposes, the model statistics available in literature are also given in Table 2. Different model statistics are obtained even for the same design method, which is closely related to the calibration database. The model uncertainty in predicting axial resistance of driven piles in sand is generally higher than that of driven piles in clay, because of the extreme levels of soil distortion during pile installation (Randolph 2003).

### **Identification of probability distribution**

The probability distribution functions of the observed model factors are determined from the Kolmogorov-Smirnov goodness-of-fit test. It measures the compatibility of a sample with a theoretical probability distribution function. The observed values for the resistance model factor  $M_u$  for driven piles under axial compression are presented in Fig. 9 which follows a lognormal distribution. The model factors for driven piles under axial uplift are given in Fig. 10, which may follow a lognormal or weibull distribution. It is noteworthy that the number of uplift load tests for each type of pile tip is much smaller than that of compression load tests.

### **Application of Model Statistics in LRFD calibration**

#### **Limit state equation**

The Federal Highway Administration (FHWA) mandated the use of LRFD for all new bridges initiated after September 2007. LRFD may be the most popular simplified RBD format in North America. In the United States, the nationwide survey of AbdelSalam et al. (2012) indicated that the resistance factors were mainly derived by fitting to the factor of safety based on the experience. Recently, more state Department of Transportation in the United States calibrated the region-specific resistance factors by reliability theory such as California (Caltrans 2014), Indiana (Salgado et al. 2011), Iowa (AbdelSalam et al. 2012), Louisiana (Abu-Farsakh et al. 2009), Illinois (Long and Anderson 2014), Missouri (Luna 2014), Minnesota (Paikowsky et al. 2014), Texas (Seo et al. 2015), and Wyoming (Adhikari et al. 2018).

The limit state equation in foundation design can be defined in terms of resistance and applied load. The foundation will fail if the resistance is less than the applied load and otherwise, the foundation performs satisfactorily. These situations can be concisely described as follows

$$g(R, Q) = R - Q \quad (14)$$

where  $R$  is the resistance and  $Q$  is the applied load. The basic objective of RBD is that the probability of failure does not exceed an acceptable level:

$$p_f = \Pr(R - Q \leq 0) \leq p_{fT} \quad (15)$$

where  $p_f$  is probability of failure,  $\Pr$  is the symbol for probability, and  $p_{fT}$  is target probability of failure.

The reliability index  $\beta_r$  is estimated from  $p_f$  as follows

$$\beta_r = -\Phi^{-1}(p_f) \quad (16)$$

where  $\Phi^{-1}$  = inverse standard normal cumulative function.

The basic design equation for LRFD is given by (AASHTO 2014)

$$\psi_R R_n \geq \sum \gamma_i Q_{ni} \quad (17)$$

where  $R_n$  is the calculated nominal resistance,  $\psi_R$  is the resistance factor applicable to  $R_n$ ,  $Q_{ni}$  is the specific nominal load, and  $\gamma_i$  is the load factor applicable to  $Q_{ni}$ . By considering the AASHTO Strength Limit I (i.e. the combination of dead load  $Q_{DL}$  and live load  $Q_{LL}$ ), the applied load is then written as



$$Q = \lambda_{DL} Q_{DL} + \lambda_{LL} Q_{LL} \quad (18)$$

where  $\lambda_{DL}$  is the bias of  $Q_{DL}$  and  $\lambda_{LL}$  is the bias of  $Q_{LL}$ . In AASHTO (2014), the load bias factors  $\lambda_{DL}$  and  $\lambda_{LL}$  are assumed to be lognormally distributed. The mean and COV of  $\lambda_{DL}$  are 1.05 and 0.1, while the mean and COV of  $\lambda_{LL}$  are 1.15 and 0.2.

### Calibration of resistance factor

Setup refers to the increase in axial resistance of driven piles after end of driving, which has been studied by many researchers (Bullock et al. 2005; Augustesen 2006; Ng et al. 2013a; Chen et al. 2014; Karlsrud et al. 2014; Haque et al. 2017; Haque and Abu-Farsakh 2018). It is attributed to three main mechanisms: (i) dissipation of excess pore water pressure (consolidation effect), (ii) regaining of soil strength with time (thixotropic effect), and (iii) increasing soil strength with time (aging effect). The widely used setup estimation model expresses the ratio of resistances at time  $t$  after pile driving and at time  $t_0$  of end of driving as a logarithmic function of  $t/t_0$  (Skov and Denver 1988; Karlsrud et al. 2005; Ng et al. 2013b; Haque and Abu-Farsakh 2018). Incorporating setup into design might result in cost saving by means of reducing the number of piles, shortening the pile length, reducing the pile cross-sectional area, or reducing the size of pile driving equipment (Haque and Abu-Farsakh 2018). Integration of setup in LRFD can be found in Yang and Liang (2006, 2009), Ng and Sritharan (2016), and Haque and Abu-Farsakh (2018).

Because the time of pile driving and test for most case histories in Appendix A1 is not reported, setup is not considered in this work. The performance function in Eq. (14) is further expressed as the following simple format (Abu-Farsakh et al. 2009)

$$g = \left( \frac{\gamma_{DL} + \gamma_{LL}/\eta}{\psi_R} \right) M_u - (\lambda_{DL} + \lambda_{LL}/\eta) \quad (19)$$

where  $\gamma_{DL}$  is the dead load factor=1.25,  $\gamma_{LL}$  is the live load factor=1.75, and  $\eta$  is the ratio of dead to live load= $Q_{DL}/Q_{LL}$ . Three steps are implemented to calibrate the resistance factor  $\psi_R$  (Abu-Farsakh et al. 2009):

1. Select a trial resistance factor and generate random numbers for three random variables (i.e.  $M_u$ ,  $\lambda_{DL}$ , and  $\lambda_{LL}$ ) in Eq. (19);
2. Find the number  $N_f$  of cases where the performance function in Eq. (19) is not greater than zero and  $p_f = N_f/N_s$  ( $N_s$ =total number of Monte Carlo simulations=1,000,000 here).
3. Repeat step Nos. 1 and 2 until  $|\beta_r - \beta_T| < \text{tolerance} = 0.01$ , where  $\beta_T$ =the target reliability index=2.33 for redundant piles and 3 for non-redundant piles (Paikowsky et al. 2004).

The above reliability calibration is similar to that proposed by Phoon et al. (2003). As an illustration, variation of  $\psi_R$  with load ratio  $\eta = Q_{DL}/Q_{LL} = 1 \sim 10$  for ICP-05 method is shown in Fig. 11 for  $\beta_T = 2.33$  and 3. It presents  $\psi_R$  decreases nonlinear with an increasing  $\eta$ . After  $\eta \geq 3$ ,  $\psi_R$  almost becomes constant for all cases. This has also been observed by Paikowsky et al. (2004), AbdelSalam et al. (2012), Abu-Farsakh et al. (2009) and Tang and Phoon (2018a-c). The resistance factors for  $\eta = 3$  with  $\beta_T = 2.33$  and 3 are summarized in Table 3. It is observed that  $\beta_T$  has a more pronounced influence than  $\eta$  on  $\psi_R$ . For example of closed-end piles under compression,  $\psi_R$  reduces from 0.53 to 0.41 (23% reduction) for ISO 19901-4:2016 when  $\beta_T$  increases from 2.33 up to 3. In addition, Paikowsky et al. (2004) mentioned that the efficiency factor  $\psi_R/\mu$ , where  $\mu$  is the mean model factor, represents the effectiveness of the respective design model. The efficiency factors are also given in Table 3.

## Summary and Conclusions

This paper collated an integrated database with 115 and 60 compression tests on closed and open-end piles and 32 and 32 uplift tests on closed and open-end piles. The database was utilized to characterize the model uncertainty in calculating the axial resistance of driven piles in clay by the  $\alpha$ -methods (ISO 19901-4:2016 and NGI-05),  $\beta$ -method (ICP-05), and the SHANSEP-based approach. Statistical analyses were implemented to determine the mean, COV and probability distribution of the model factor. From a statistical viewpoint, four methods presented similar performance where the mean and COV of the model factor are equal to 1 and 0.3 approximately. The COV values are found to be smaller than those driven piles in sand.

The model statistics were then utilized to calibrate the resistance factors in LRFD of driven piles in clay. It should be noted that the model statistics are also applicable to a full probabilistic form of RBD. One needs to keep in mind that the application of the derived model statistics beyond the database boundaries should be verified (ideally by more high-quality load test results) (Lesny 2017). Low (2017) and Phoon (2017) explained in detail that RBD can play a complementary role to LRFD within the prevailing norms of geotechnical practice. For instance, RBD is very useful to deal with complex real-world information (multivariate correlated soil data) and information imperfections (scarcity of information or incomplete information). It is also very useful to handle spatial variability of a site profile that cannot be easily treated in deterministic means.

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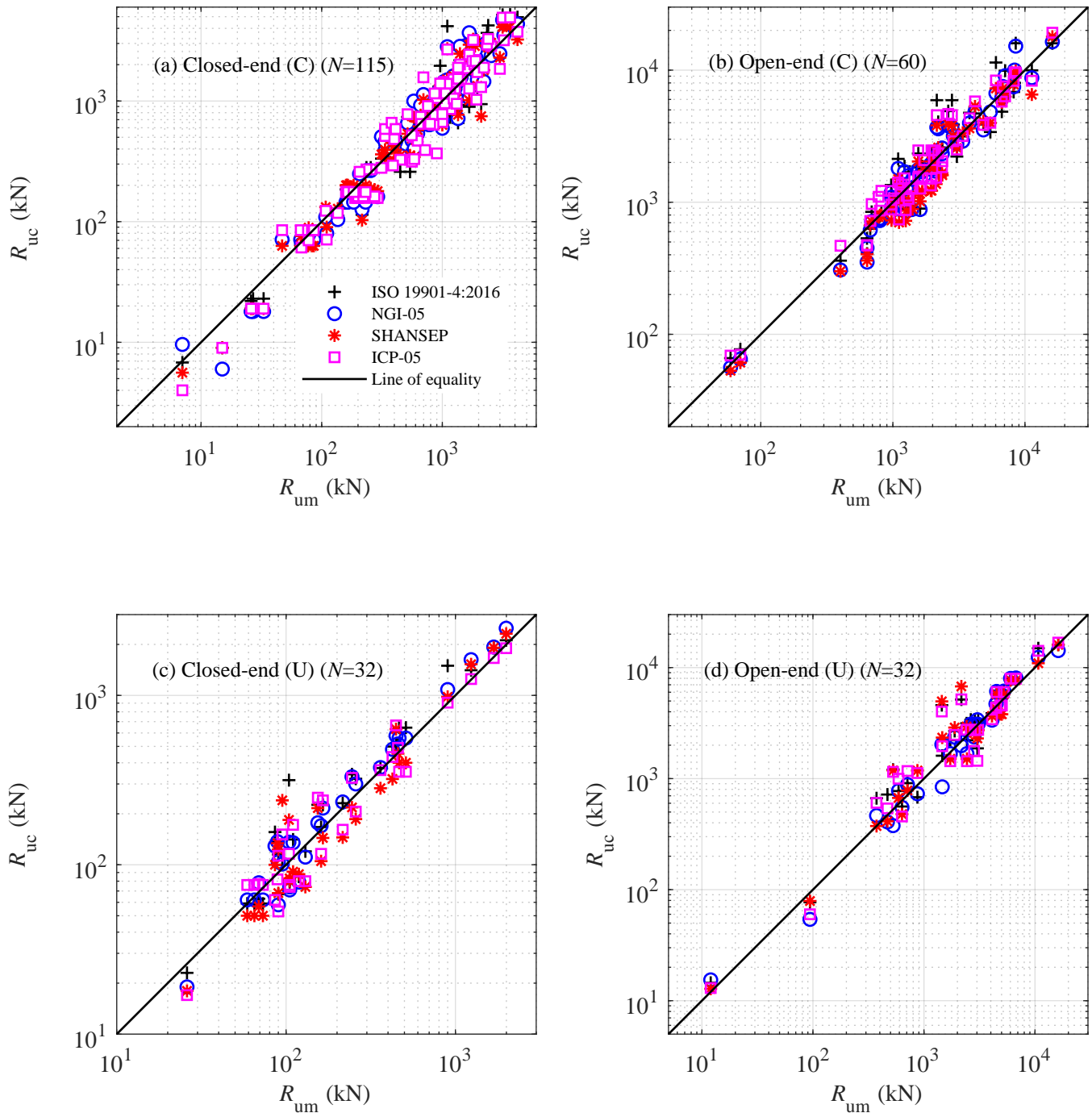


Fig. 1. Comparison of measured and calculated resistances for driven piles in clay



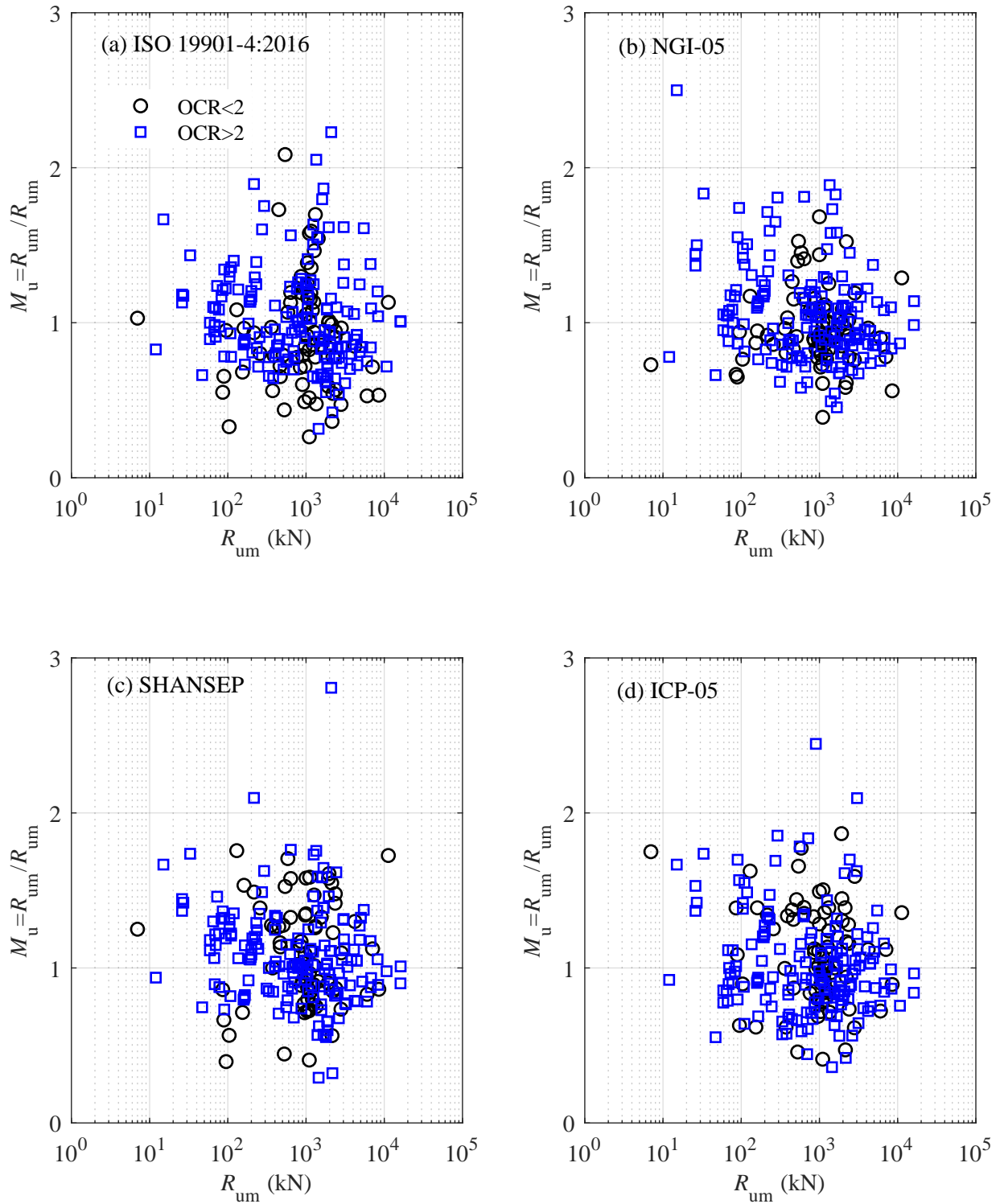


Fig. 2. Scatter plots of resistance model factor versus measured resistance for OCR < 2 and OCR > 2

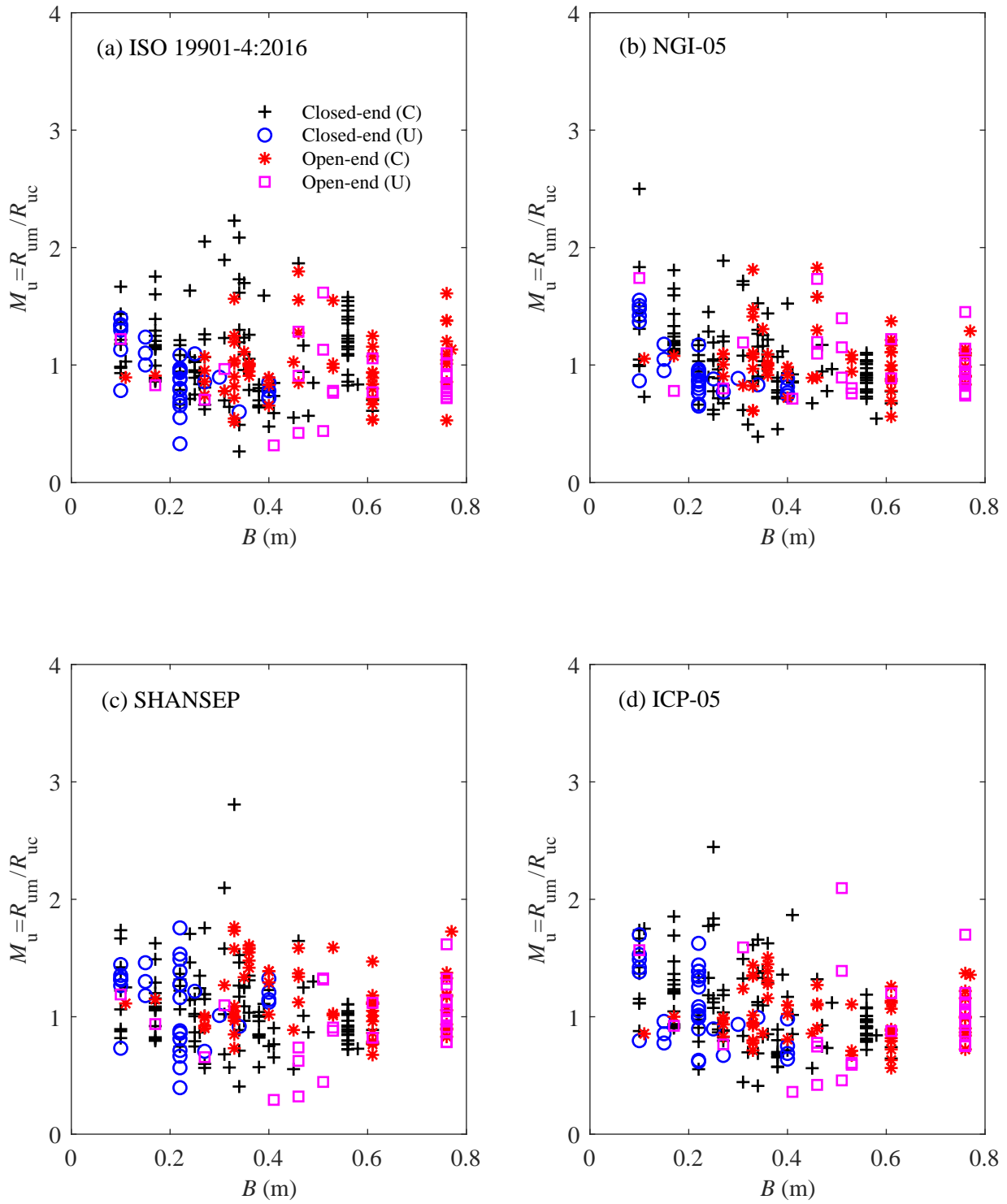


Fig. 3. Distributions of resistance model factor against pile diameter

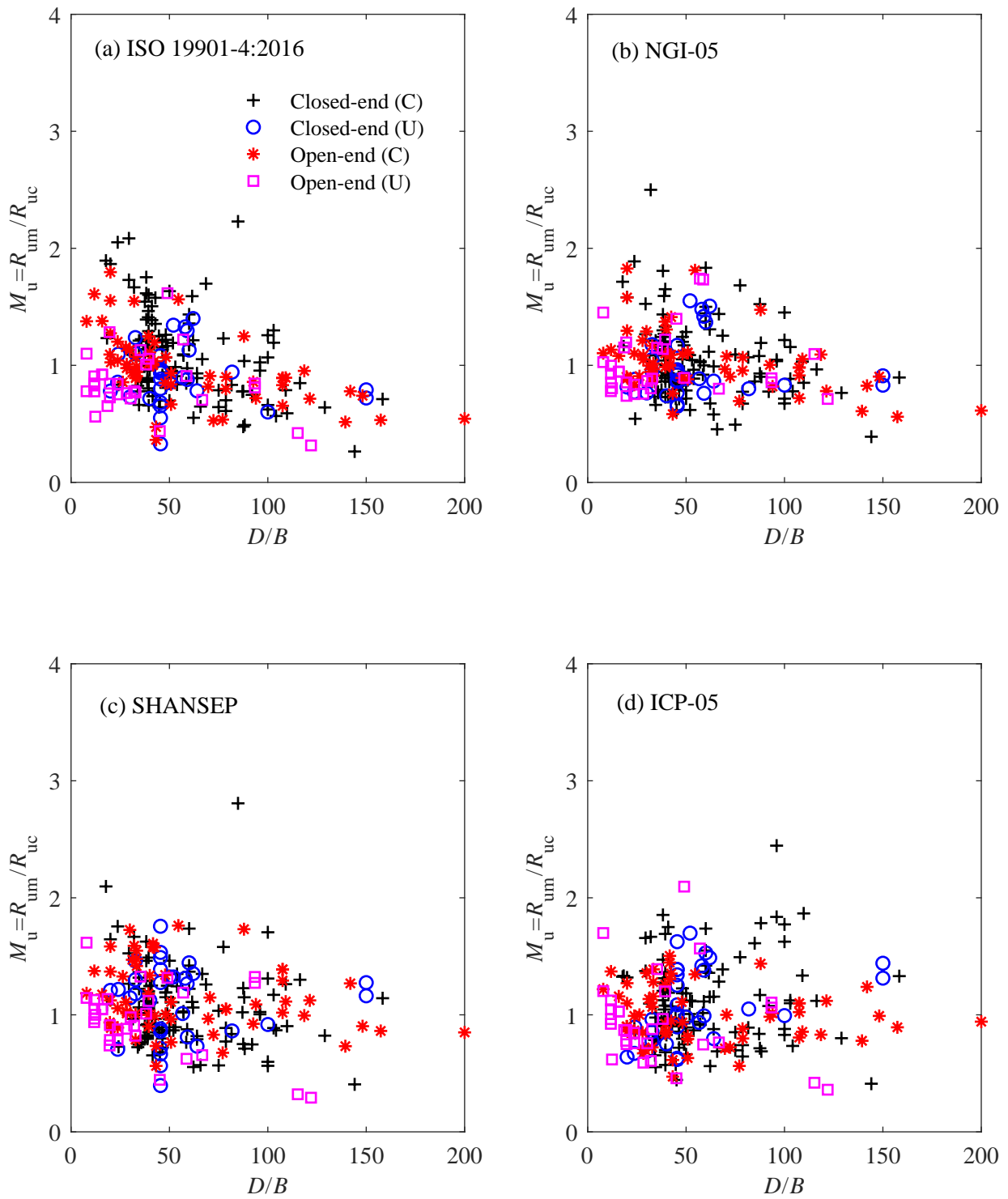


Fig. 4. Distributions of resistance model factor against pile slenderness ratio

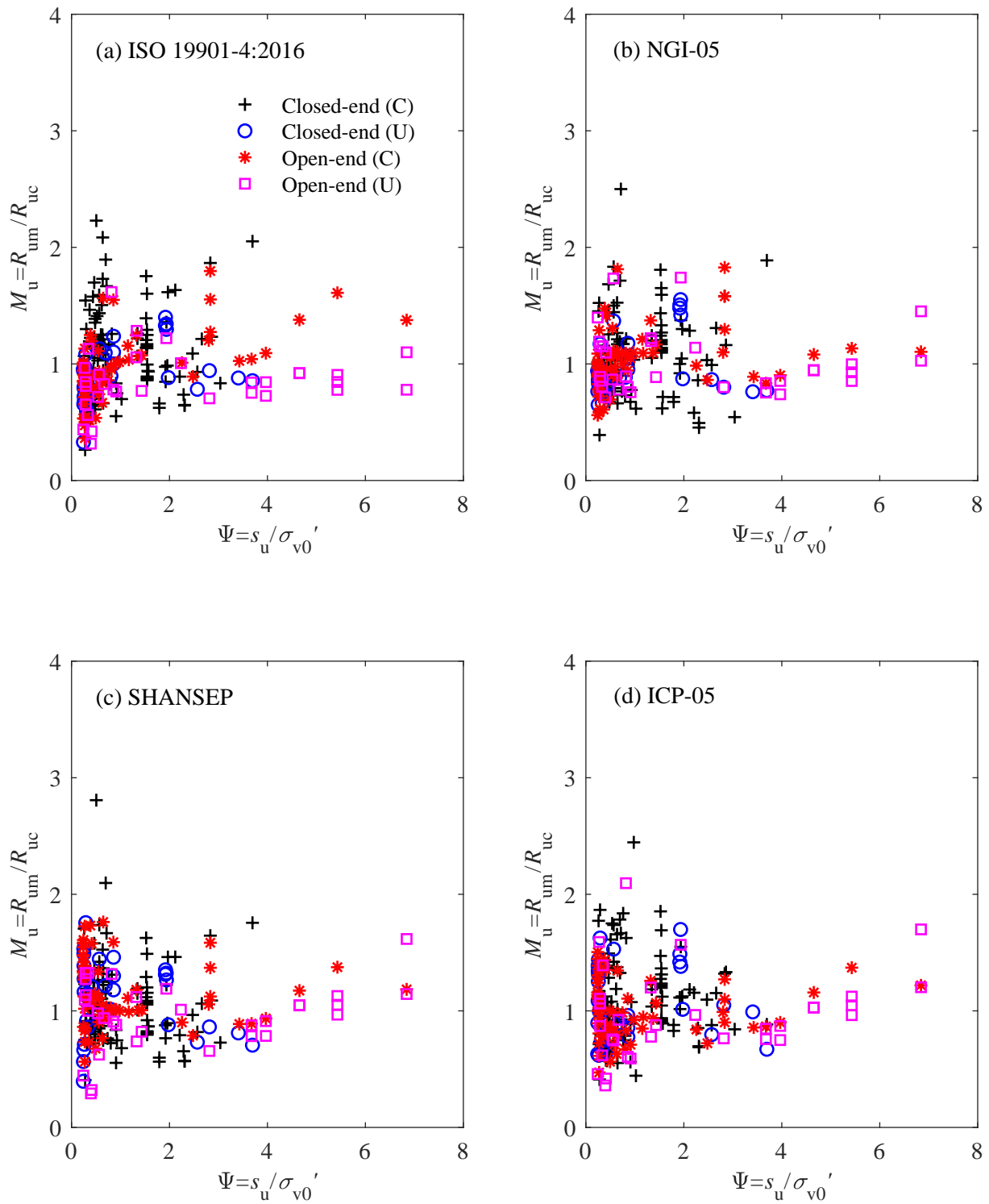


Fig. 5. Distributions of resistance model factor against undrained shear strength normalized by effective vertical stress

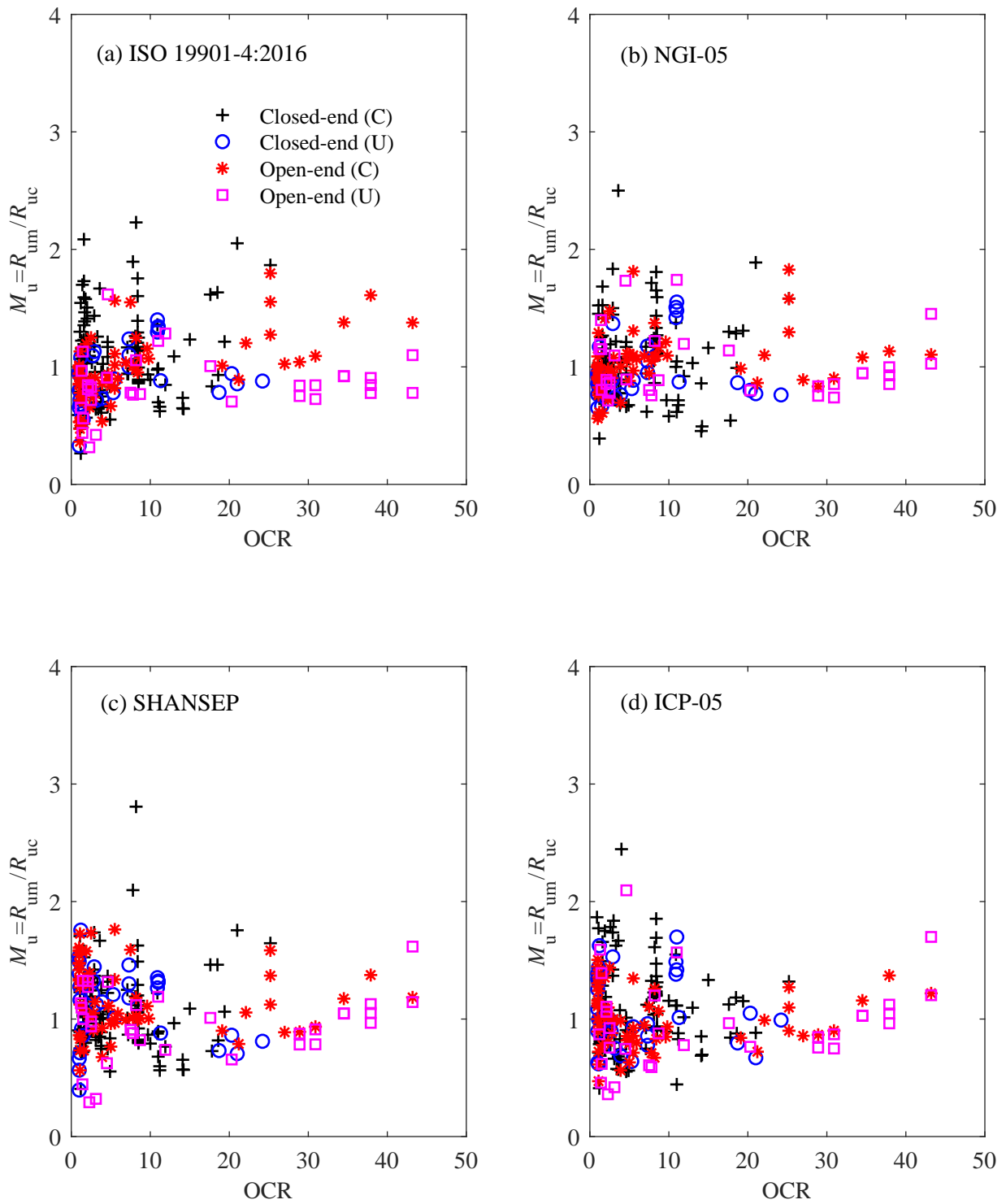


Fig. 6. Distributions of resistance model factor against overconsolidation ratio

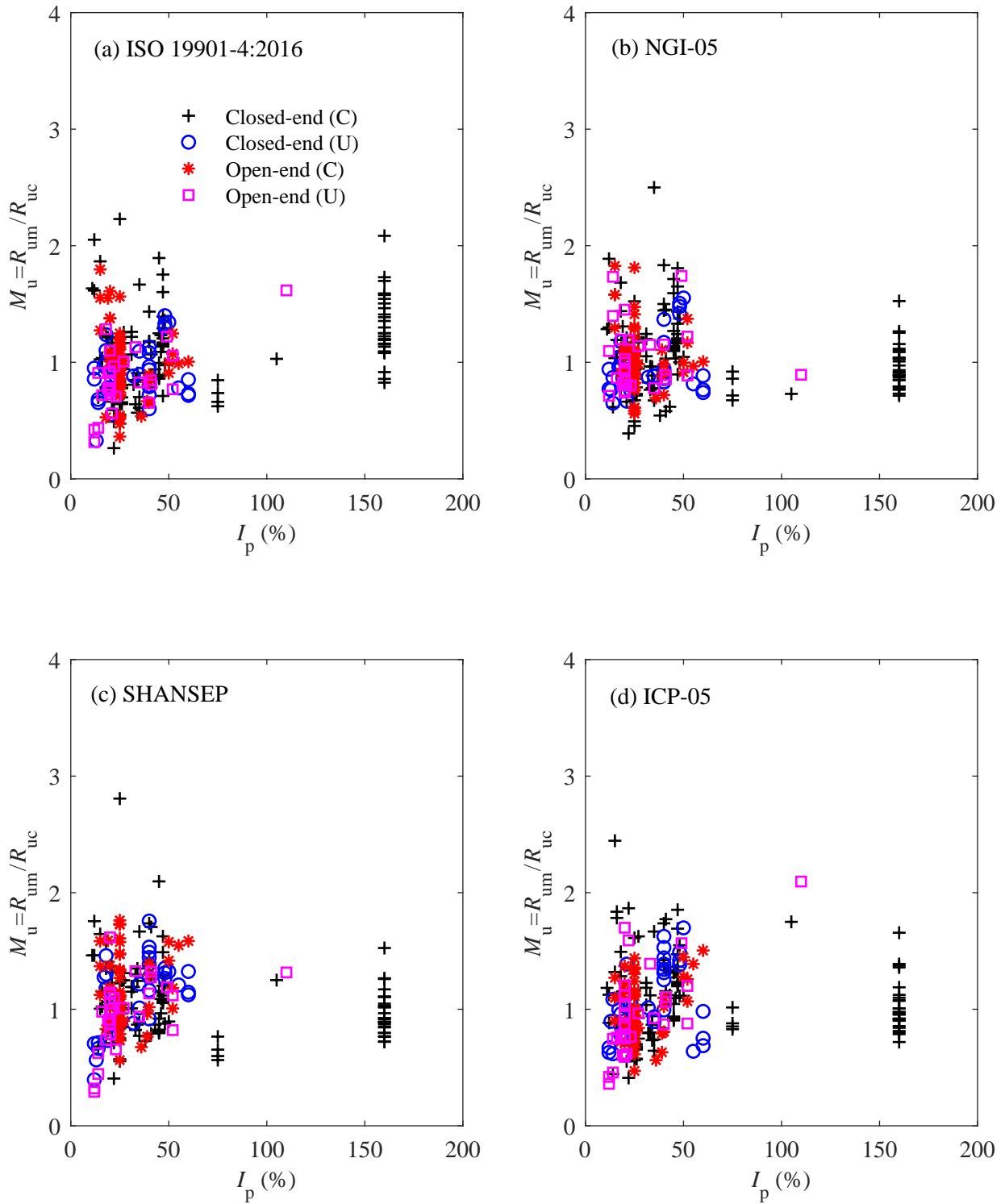


Fig. 7. Distributions of resistance model factor against plasticity index

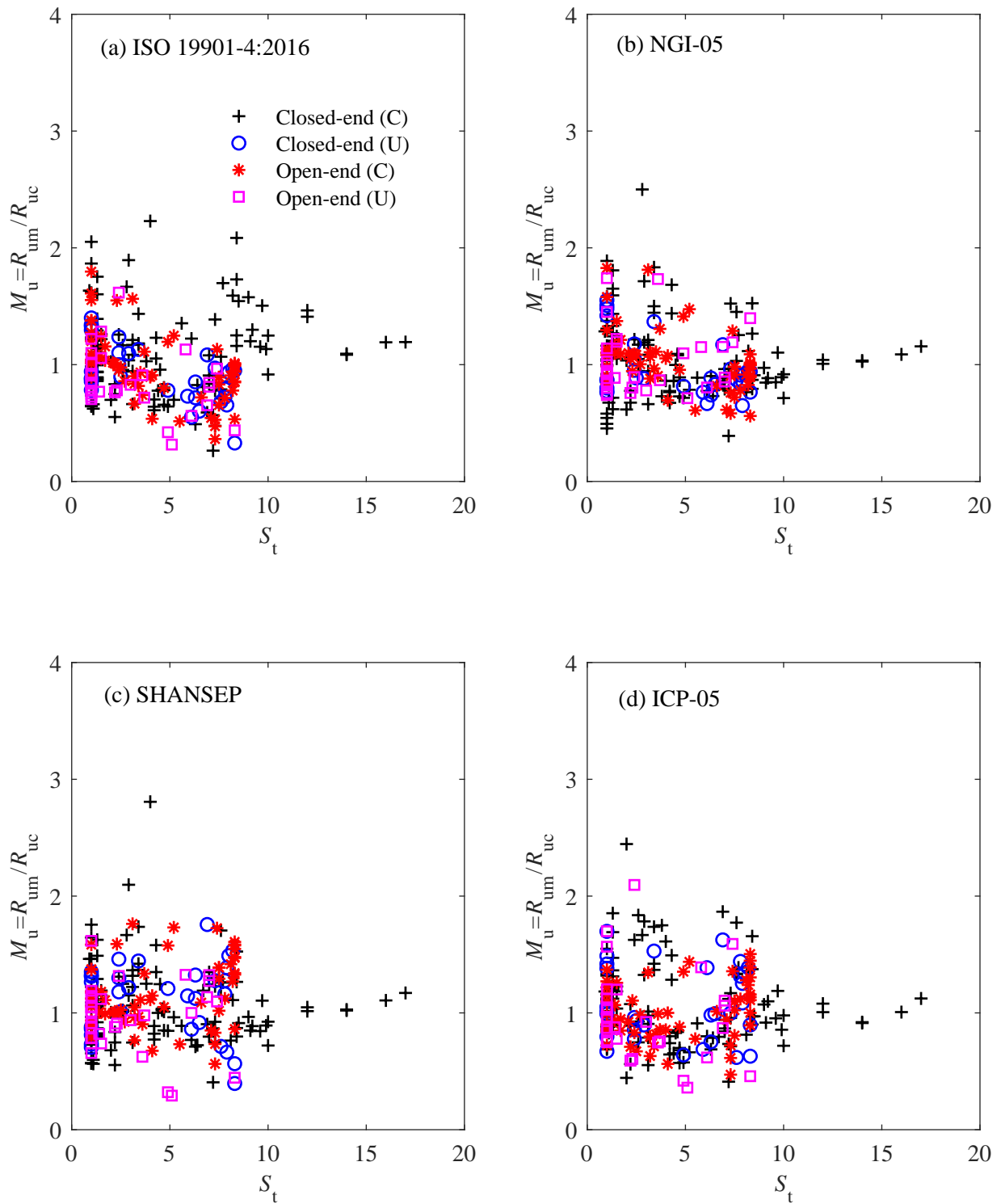


Fig. 8. Distributions of resistance model factor against sensitivity

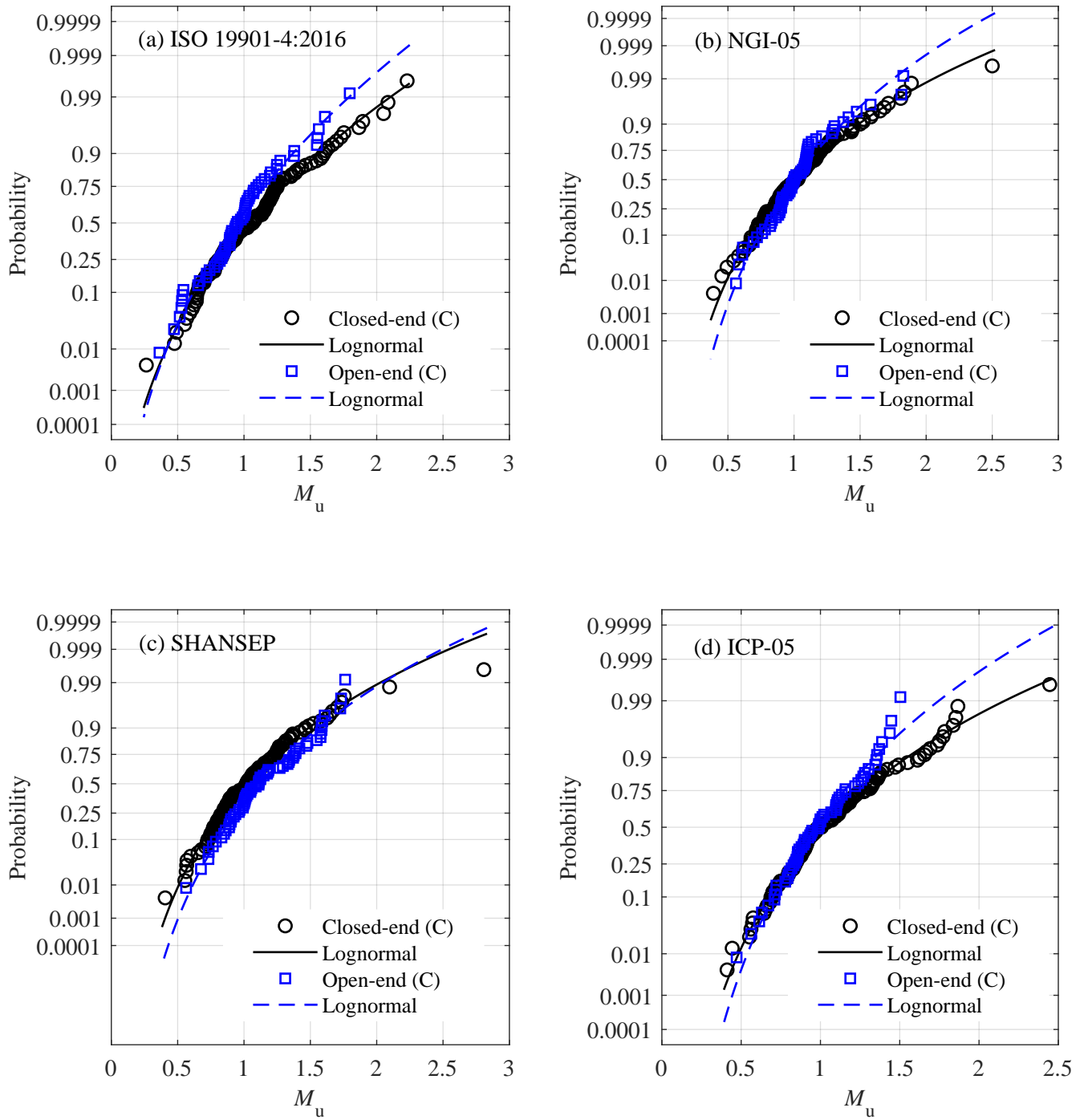


Fig. 9. Cumulative distributions of resistance model factor for driven piles in axial compression



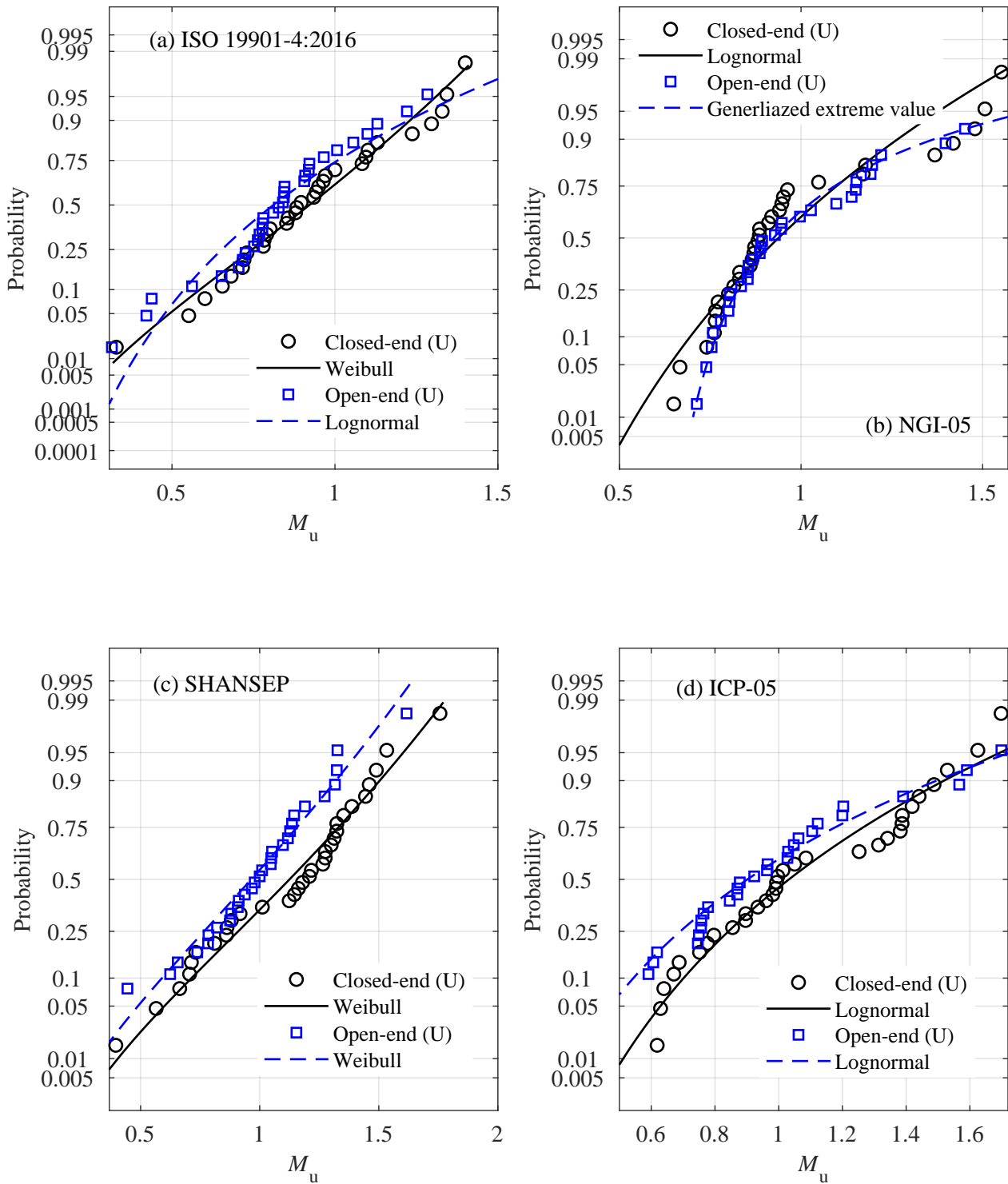


Fig. 10. Cumulative distributions of resistance model factor for driven piles in axial uplift

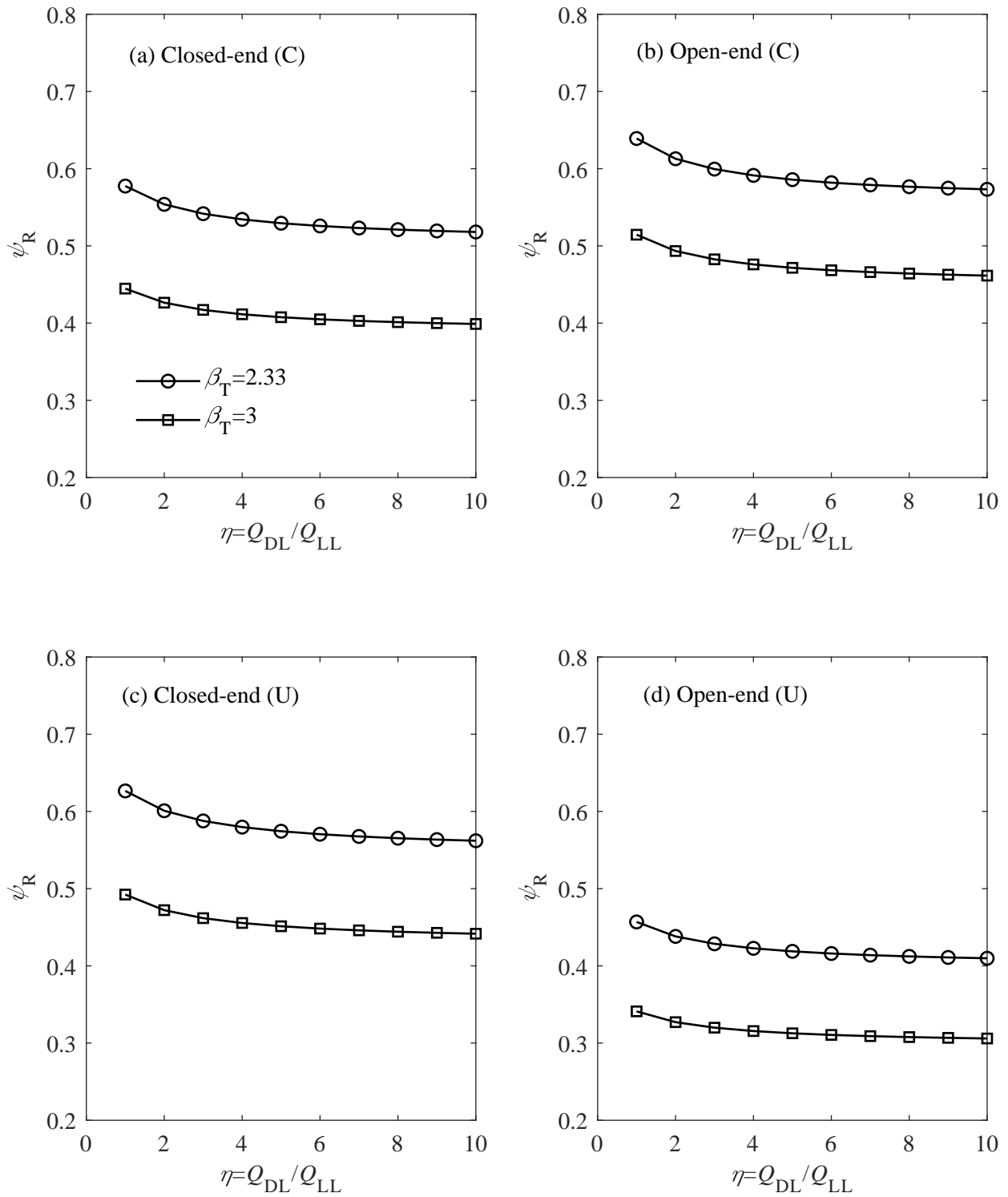


Fig. 11. Variation of resistance factor with dead to live load ratio

Table 1. Ranges of pile geometries and soil properties in the database

Load type	Pile tip	Number of load tests ( $N$ )	Pile geometry			Soil parameters		
			$B$ (m)	$D/B$	$I_p$ (%)	OCR	$S_t$	$s_u/\sigma_{v0}'$
Compression	Closed end	115	0.1–0.61	17.7–158.3	11–160	0.9–25.2	0.9–17	0.26–3.69
	Open end	60	0.11–0.81	7.9–200	15–60	1–43.2	1–8.3	0.24–6.84
Uplift	Closed end	32	0.1–0.4	20–150	12–60	1–24.2	1–8.3	0.24–3.69
	Open end	32	0.1–0.81	7.9–212.9	12–110	1.2–43.2	1–8.3	0.24–6.84

Note:  $B$ , pile diameter or width;  $D$ , embedment depth of pile;  $D/B$ , pile slenderness ratio;  $I_p$ , plasticity index; OCR, overconsolidation ratio;  $S_t$ , soil sensitivity;  $s_u$ , undrained shear strength;  $\sigma_{v0}'$ , effective vertical stress.

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Table 2. Statistics of resistance bias for static design methods of driven piles

Reference	Soil type	Pile tip	Material	Load type	<i>N</i>	Design method	Mean	COV	
Paikowsky et al. (2004)	Clay	Closed/open end	Concrete	Compression	18	$\lambda$ -Method	0.76	0.29	
					17	$\alpha$ -API	0.81	0.26	
					8	$\beta$ -method	0.81	0.51	
					18	$\alpha$ -Tomlinson	0.87	0.48	
			Steel pipe	Compression	18	$\alpha$ -Tomlinson	0.64	0.5	
					19	$\alpha$ -API	0.79	0.54	
					12	$\beta$ -method	0.45	0.6	
					19	$\lambda$ -method	0.67	0.55	
					12	SPT-97	0.39	0.62	
Dithinde et al. (2011)	Clay	Closed/open end	Concrete/steel	Compression	59	Static formula	1.17	0.26	
Lehane et al. (2013)	Clay	Closed/open end	Concrete/steel	Compression/Uplift	75	API-00	1.13	0.46	
						ICP-05	1.12	0.44	
						CPT2000	1.04	0.39	
						Almeida-96	1.08	0.37	
						LCPC	2.22	0.45	
						UWA-13	1.12	0.35	
Karlsrud (2014)	Clay	Closed/open end	Steel pipe	Compression/Uplift	72	Proposed $\alpha$ -method	1.04	0.2	
						Proposed $\beta$ -method	1	0.22	
Lehane et al. (2017)	Clay	Closed/open end	Concrete/steel	Compression/Uplift	23	API-00	1.54	0.33	
						23	Fugro-96	1.21	0.24
						22	ICP-05	0.86	0.45
						47	NGI-05	1.17	0.33
						43	UWA-13	1.14	0.25
						43	Fugro-10	1.01	0.31
This work	Clay	Closed end	Concrete/steel pipe	Compression	115	ISO 19901-4:2016	1.08	0.34	
						NGI-05	1.05	0.31	
						SHANSEP	1.06	0.32	
						ICP-05	1.08	0.33	
				Uplift	32	ISO 19901-4:2016	0.92	0.27	
					32	NGI-05	0.96	0.26	
32	SHANSEP	1.11	0.29						

					32	ICP-05	1.08	0.29
		Open end	Steel pipe	Compression	60	ISO 19901-4:2016	0.97	0.3
This work	Clay	Open end	Steel pipe	Compression	60	NGI-05	1.03	0.25
					60	SHANSEP	1.16	0.25
					60	ICP-05	1	0.24
				Uplift	32	ISO 19901-4:2016	0.85	0.3
					32	NGI-05	1.01	0.27
					32	SHANSEP	0.96	0.3
					32	ICP-05	0.97	0.39
Paikowsky et al. (2004)	Clay	Open end	Steel-H	Compression	4	$\beta$ -method	0.61	0.61
					16	$\lambda$ -method	0.74	0.39
					17	$\alpha$ -Tomlinson	0.82	0.4
					16	$\alpha$ -API	0.9	0.41
					8	SPT-97	1.04	0.41
AbdelSalam et al. (2012)	Clay	Open end	Steel-H	Compression	20	$\alpha$ -API	1.15	0.52
Tang and Phoon (2018b)	Clay	Open end	Steel-H	Compression	26	$\alpha$ -API	1.1	0.4
Tang and Phoon (2018a)	Clay	Closed end	Steel square shaft (single-helix)	Compression	16	Torque-correlation	0.88	0.15
				Uplift	14	Torque-correlation	0.74	0.27
			Steel square shaft (multi-helix)	Compression	14	Torque-correlation	1.04	0.19
				Uplift	10	Torque-correlation	0.93	0.26
				Compression	49	Individual plate	1.25	0.41
		Open end	Steel pipe (single-helix)	Compression	75	Torque-correlation	1.09	0.26
				Uplift	54	Torque-correlation	0.92	0.23
			Steel pipe (multi-helix)	Compression	71	Torque-correlation	1.16	0.18
				Uplift	69	Torque-correlation	1.02	0.27
Paikowsky et al. (2004)	Sand	Closed/open end	Concrete	Compression	36	Nordlund	1.02	0.48
					35	$\beta$ -method	1.1	0.44
					36	Meyerhof	0.61	0.61
					36	SPT-97	1.21	0.47
			Steel pipe	Compression	19	Nordlund	1.48	0.52
					20	$\beta$ -method	1.18	0.62
					20	Meyerhof	0.94	0.59
					19	SPT-97	1.58	0.52
Dithinde et al. (2011)	Sand	Closed/open	Concrete/steel	Compression	28	Static formula	1.11	0.33

Lehane et al. (2017)	Sand	end Closed/open end	Concrete/steel	Compression/Uplift	71	API-00	1.66	0.56
						Fugro-05	0.99	0.4
						ICP-05	1.04	0.27
Lehane et al. (2017)	Sand	Closed/open end	Concrete/steel	Compression/Uplift	71	NGI-05	0.99	0.34
						UWA-05	1.06	0.27
						Simplified ICP-05	1.2	0.31
						Offshore UWA-05	1.28	0.29
Tang and Phoon (2018c)	Sand	Open end	Concrete/steel pipe	Compression	16	ICP-05	1.07	0.24
					16	UWA-05	1.07	0.21
		Closed end	Concrete/steel pipe	Compression	52	ICP-05	1.1	0.31
					52	UWA-05	1	0.39
		Open end	Steel pipe	Uplift	19	ICP-05	1.36	0.38
					19	UWA-05	1.3	0.37
		Closed end	Steel pipe	Uplift	9	ICP-05	1.02	0.35
					9	UWA-05	1.02	0.37
Paikowsky et al. (2004)	Sand	Open end	Steel-H	Compression	19	Nordlund	0.94	0.4
					18	Meyerhof	0.81	0.38
					19	$\beta$ -method	0.78	0.51
					18	SPT-97	1.35	0.43
AbdelSalam et al. (2012)	Sand	Open end	Steel-H	Compression	34	Nordlund	0.92	0.53
Tang and Phoon (2018b)	Sand	Open end	Steel-H	Compression	46	Nordlund	0.82	0.47
Tang and Phoon (2018a)	Sand	Closed end	Steel square shaft (single-helix)	Compression	6	Torque-correlation	1.51	0.39
					7	Torque-correlation	1.2	0.56
		Closed end	Steel square shaft (multi-helix)	Compression	10	Torque-correlation	1.54	0.39
					10	Torque-correlation	1.06	0.22
		Open end	Steel pipe (single-helix)	Compression	55	Individual plate	1.46	0.42
					50	Torque-correlation	1.23	0.37
				Uplift	47	Torque-correlation	0.98	0.3
					49	Torque-correlation	1.51	0.26
Open end	Steel pipe (multi-helix)	Compression	49	Torque-correlation	1.51	0.26		
			51	Torque-correlation	1.2	0.24		
Paikowsky et al. (2004)	Layered	Closed/open end	Concrete	Compression	33	$\alpha$ - Tomlinson/Nordlund	0.96	0.49
					80	$\alpha$ -API/Nordlund	0.87	0.48

					80	$\beta$ -method/Thurman	0.81	0.38
					71	SPT-97	1.81	0.5
					30	FHWA CPT	0.84	0.31
		Closed/open end	Steel pipe	Compression	13	$\alpha$ -Tomlinson/Nordlund	0.74	0.59
					32	$\alpha$ -API/Nordlund	0.8	0.45
					29	$\beta$ -method/Thurman	0.54	0.48
Paikowsky et al. (2004)	Layered	Closed/open end	Steel pipe	Compression	33	SPT-97	0.76	0.38
		Open end	Steel-H	Compression	20	$\alpha$ -Tomlinson/Nordlund	0.59	0.39
					34	$\alpha$ -API/Nordlund	0.79	0.44
					32	$\beta$ -method/Thurman	0.48	0.48
					40	SPT-97	1.23	0.45
AbdelSalam et al. (2012)	Layered	Open end	Steel-H	Compression	26	API $\alpha$ /Nordlund	1.04	0.4
Tang and Phoon (2018b)	Layered	Open end	Steel-H	Compression	32	API $\alpha$ /Nordlund	0.92	0.4

Note: API, American Petroleum Institute; SPT, standard penetration test;  $\alpha$ , ultimate shaft friction normalized to undrained shear strength;  $\beta$ , ultimate shaft friction normalized to vertical effective stress;  $\lambda$ , ultimate shaft friction normalized to the combination of undrained shear strength and vertical effective stress; CPT, cone penetration test; ICP, Imperia College Pile; UWA, University of Western Australia; NGI, Norwegian Geotechnical Institute; SHANSEP, stress history and normalized soil engineering parameter concept; LCPC, Laboratoire Central des Ponts et Chaussées.

Table 3. Resistance and efficiency factors in LRFD of driven piles in clay

Load type	Pile tip	Pile material/shape	N	Methods	$M_u$		$\beta_T=2.33$		$\beta_T=3$	
					Mean ( $\mu$ )	COV	$\psi_R$	$\psi_R/\mu$	$\psi_R$	$\psi_R/\mu$
Compression	Closed end	Concrete/steel pipe	115	ISO 19901-4:2016	1.08	0.34	0.53	0.49	0.41	0.38
				NGI-05	1.05	0.31	0.55	0.52	0.43	0.41
				SHANSEP	1.06	0.32	0.54	0.51	0.42	0.4
				ICP-05	1.08	0.33	0.54	0.5	0.42	0.39
	Open end	Steel pipe	60	ISO 19901-4:2016	0.97	0.3	0.52	0.54	0.4	0.41
				NGI-05	1.03	0.25	0.61	0.59	0.49	0.48
				SHANSEP	1.16	0.25	0.68	0.59	0.55	0.47
				ICP-05	1	0.24	0.6	0.6	0.48	0.48
Uplift	Closed end	Concrete/steel pipe	32	ISO 19901-4:2016	0.92	0.27	0.52	0.57	0.41	0.45
				NGI-05	0.96	0.26	0.55	0.57	0.44	0.46
				SHANSEP	1.11	0.29	0.6	0.54	0.47	0.42
				ICP-05	1.08	0.29	0.59	0.55	0.46	0.43
	Open end	Steel pipe	32	ISO 19901-4:2016	0.85	0.3	0.45	0.53	0.35	0.41
				NGI-05	1.01	0.27	0.57	0.56	0.45	0.45
				SHANSEP	0.96	0.3	0.51	0.53	0.4	0.42
				ICP-05	0.97	0.39	0.43	0.44	0.32	0.33



## Appendix A1

Table A1. Summary of compression load tests on driven piles in clay

Reference	Site location	Pile information			Soil parameters					${}^sR_{uc}$ (kN)				
		#Type	$B$ (m)	$D$ (m)	$I_p$ (%)	$\sigma_{v0}'$ (kN)	OCR	$S_t$	$s_u$ (kPa)	$R_{um}$ (kN)	(1)	(2)	(3)	(4)
Augustesen (2006)	Bangkok, Thailand	CE-Oc-C	0.58	14	38	53	17.8	1	161	1570	1882	2888	2158	1865
		CE-Sq-C	0.25	13	43	43	7.2	1.3	67	313	333	506	361	279
		CE-Sq-C	0.25	16	41	53	10	1	117	580	651	999	733	502
Saldivar and Jardine (2005)	Mexico city	CE-Sq-C	0.56	22	160	68	1.7	12	25	1274	870	1265	1255	1266
		CE-Sq-C	0.56	22	160	48	2	12	25	1048	743	1007	1000	971
		CE-Sq-C	0.56	23	160	46	2.1	10	29	993	795	1082	1074	1015
		CE-Sq-C	0.56	23	160	47	2	9.7	29	1231	818	1116	1114	1036
		CE-Sq-C	0.56	24	160	48	1.8	9	21	1104	700	1135	1143	1030
		CE-Sq-C	0.56	23	160	50	1.7	7.3	24	1040	750	1115	1126	1087
		CE-Sq-C	0.56	24	160	54	1.6	5.6	26	1162	858	1308	1307	1276
		CE-Sq-C	0.56	25	160	45	1.9	8.4	27	1048	838	1205	1204	1081
		CE-Sq-C	0.56	26	160	49	1.8	8.4	27	1049	904	1323	1315	1164
		CE-Sq-C	0.56	26	160	48	2	9.1	27	1058	881	1250	1246	1154
		CE-Sq-C	0.56	32	160	74	2.3	14	43	1858	1699	1795	1806	2018
		CE-Sq-C	0.56	32	160	74	2.3	14	43	1843	1699	1795	1806	2018
		CE-Sq-C	0.56	26	160	66	1.7	9.9	31	1255	1107	1407	1407	1466
		CE-Sq-C	0.34	10	160	55	1.6	8.4	35	540	259	354	354	326
		CE-Sq-C	0.34	10	160	55	1.6	8.4	35	448	259	354	354	326
		CE-Sq-C	0.56	26	160	69	1.5	10	31	1035	1130	1450	1436	1440
		CE-Sq-C	0.56	21	160	91	1.2	8.5	26	1433	928	1576	1570	1476
		CE-Sq-C	0.56	21	160	74	1.5	7	43	1207	1118	1525	1515	1435
		CE-Sq-C	0.56	20	160	87	1.3	8.1	64	1233	1438	1613	1616	1516
		CE-Sq-C	0.56	26	160	60	1.3	9.6	27	1135	984	1336	1344	1190
CE-Sq-C	0.34	35	160	63	1.1	9.2	19	865	666	978	975	787		
CE-Sq-C	0.34	35	160	63	1.6	17	23	864	724	747	738	769		
CE-Sq-C	0.56	29	160	55	1.7	16	23	1151	966	1058	1040	1143		
CE-Sq-C	0.56	19	160	80	1.2	6.4	64	1093	1324	1495	1511	1390		
CE-Sq-C	0.56	20	160	65	1.3	6.1	25	943	771	1217	1227	1179		
CE-Sq-C	0.39	24	160	62	1.6	8.2	35	1163	731	1042	1048	856		
Lehane et al. (2013)	Belgium	CE-Sq-C	0.35	6.4	46	50	15	1	143	625	507	538	574	469
		CE-Sq-C	0.35	11	46	70	13	1	173	1048	962	1015	1086	956
Lehane et al. (2013)	Shanghai, China	CE-Sq-C	0.25	23	18	82	3.8	2.2	76	558	746	719	747	519

Augustesen (2006)	Khulna	CE-Sq-C	0.25	22	16	72	2.6	2.9	50	560	540	470	487	314	
		CE-Sq-C	0.25	24	16	88	3	2.6	67	720	754	687	703	392	
		CE-Sq-C	0.25	24	15	90	4	2	88	900	878	869	896	368	
		CE-Sq-C	0.36	27	18	108	1.5	4.6	47	900	1143	824	870	1057	
		CE-Sq-C	0.31	27	18	108	1.5	4.6	47	760	979	704	744	908	
		CE-Sq-C	0.31	24	18	97	1.6	4.3	45	1000	813	594	633	670	
	—	CE-Sq-C	0.36	24	18	97	1.6	4.3	45	1000	950	695	741	779	
		CE-C-C	0.26	14	34	87	2.4	7	25	255	281	265	189	271	
	Lillebælt, Denmark	CE-C-C	0.26	14	34	87	2.4	7	25	235	281	265	189	271	
		CE-C-C	0.47	23	27	59	7.1	2.6	45	863	917	913	856	1154	
		CE-C-C	0.47	23	27	59	7.1	2.6	45	1069	917	913	856	1154	
		CE-C-C	0.41	24	75	140	11.9	1	269	3237	3823	3518	4230	3188	
		CE-C-C	0.41	17	75	111	14.1	1	254	1864	2532	2168	2852	2187	
		Khorramshahr port, Iran	CE-C-C	0.38	13	26	74	3.9	4.4	33	335	431	390	335	512
			CE-C-C	0.38	15	26	81	3.6	4.7	35	335	510	460	394	586
			CE-C-C	0.38	19	26	98	3.1	5.2	38	515	737	656	535	777
			CE-C-C	0.38	15	26	81	3.6	4.7	35	400	512	463	396	588
			CE-C-C	0.38	17	26	88	3.4	4.9	36	380	592	531	449	660
			CE-C-C	0.38	15	26	81	3.6	4.7	35	410	510	460	394	586
		Maskinonge, Canada	CE-C-C	0.24	24	41	116	1.1	7.6	30	585	548	403	343	330
CE-C-C	0.24		38	47	160	1.1	7.6	42	845	1188	943	740	635		
Nova Scotia, Canada	CE-C-C	0.24	12	11	85	18.5	0.9	180	1240	759	965	848	1048		
	CE-C-C	0.34	13	12	92	17.6	1	181	1950	1207	1501	1334	1734		
Singapore	CE-C-C	0.33	28	25	87	8.2	4	44	2100	942	2435	748	1303		
Aalborg, Denmark	CE-C-C	0.38	31	25	165	4.9	2.2	150	2540	3050	2376	3038	2852		
	CE-C-C	0.45	28	25	165	4.9	2.2	150	1800	3262	2668	3250	3204		
Egå Rensenanlæg, Denmark	CE-C-C	0.32	24	25	91	14.2	1	210	1400	2177	2839	2466	2009		
	CE-C-C	0.38	25	25	84	14.1	1	194	1671	2579	3680	2929	2429		
Algade, Aalborg, Denmark	CE-C-C	0.26	13	25	86	9.7	1.3	135	660	706	921	762	740		
Drammen Stasjon, Norway	CE-C-C	0.34	49	22	295	1.2	7.2	82	1100	4171	2820	2711	2675		
	CE-C-C	0.34	30	22	210	1.3	6.3	66	960	1958	1064	1350	1396		
Saldivar and Jardine (2005)	Mexico city	CE-C-C	0.35	24	160	82	1.4	7.7	38	1316	775	1050	1045	948	
Lehane et al. (2013)	Golden Ears Bridge Dublin, Ireland	CE-C-C	0.36	36	27	124	3.3	2.4	102	3000	2386	2467	2290	1846	
		CE-S-P	0.27	6.4	12	72	21	1	266	1350	658	715	769	1528	
Lehane et al. (2013)	Sandpoint	CE-S-P	0.41	45	22	204	0.9	6.9	59	1915	3244	2251	2120	1026	
	Sarapui	CE-S-P	0.11	4.5	105	11	1.9	3.8	5.9	7	6.8	9.6	5.6	4	
Augustesen (2006)	—	CE-S-P	0.27	13	32	79	2.6	6.7	24	206	255	249	173	259	

		CE-S-P	0.31	14	14	138	11	2	141	697	998	1131	1025	1571
		CE-S-P	0.31	5.5	45	43	7.8	2.9	30	216	114	126	103	163
	Lillebælt, Denmark	CE-S-P	0.27	27	75	154	11.2	1.1	276	1776	2851	2633	3148	2143
		CE-S-P	0.27	27	75	154	11.2	1.1	276	1884	2851	2633	3148	2143
	Houston, USA	CE-S-P	0.27	13	31	81	8.1	1.5	109	670	628	637	665	646
		CE-S-P	0.27	13	31	81	8.1	1.5	109	765	628	637	665	646
		CE-S-P	0.27	13	31	81	8.1	1.5	109	792	628	637	665	646
	Cowden, UK	CE-S-P	0.46	9.2	15	48	25.2	1	136	1670	895	1056	1015	1266
	Khorramshahr port, Iran	CE-S-P	0.35	14	26	76	3.8	4.5	34	400	418	401	321	483
	Maskinonge, Canada	CE-S-P	0.22	24	41	116	1.1	7.6	30	390	495	378	309	292
	St Alban, Canada	CE-S-P	0.22	7.6	21	31	4.6	3.1	20	47	71	71	63	85
		CE-S-P	0.22	7.6	21	31	4.6	3.1	20	67	71	71	63	85
		CE-S-P	0.22	7.6	21	31	4.6	3.1	20	77	71	71	63	85
		CE-S-P	0.22	7.6	21	31	4.6	3.1	20	83	71	71	63	85
		CE-S-P	0.22	7.6	21	31	4.6	3.1	20	86	71	71	63	85
	Cowden, UK	CE-S-P	0.1	6.2	19	50	19.4	1	133	136	112	104	128	118
		CE-S-P	0.1	6.4	19	51	18.6	1	131	108	116	109	132	123
	Lower arrow lake, Canada	CE-S-P	0.61	48	35	156	3.8	4.2	75	3160	5183	4697	4093	4907
		CE-S-P	0.61	48	35	156	3.8	4.2	75	3649	5200	4712	4111	4926
	Canons park, UK	CE-S-P	0.1	5.3	50	45	11	1	88	68	69	65	76	61
		CE-S-P	0.1	6	48	48	10.9	1	93	110	81	80	90	71
		CE-S-P	0.1	5.9	48	48	10.9	1	92	78	80	78	89	70
		CE-S-P	0.17	6.5	47	63	8.4	1.3	96	189	166	161	179	157
		CE-S-P	0.17	6.5	47	63	8.4	1.3	96	200	166	161	179	157
		CE-S-P	0.17	6.5	47	63	8.4	1.3	96	231	166	161	179	157
		CE-S-P	0.17	6.5	47	63	8.4	1.3	96	291	166	161	179	157
		CE-S-P	0.17	6.7	47	63	8.4	1.3	97	194	171	166	184	162
		CE-S-P	0.17	6.7	47	63	8.4	1.3	97	197	171	166	184	162
		CE-S-P	0.17	6.7	47	63	8.4	1.3	97	200	171	166	184	162
		CE-S-P	0.17	6.7	47	63	8.4	1.3	97	221	171	166	184	162
		CE-S-P	0.17	6.7	47	63	8.4	1.3	97	274	171	166	184	162
		CE-S-P	0.17	6.6	45	68	8.5	1.3	105	159	185	145	200	176
		CE-S-P	0.17	6.6	45	68	8.5	1.3	105	161	185	145	200	176
Augustesen (2006)	Canons park, UK	CE-S-P	0.17	6.6	45	68	8.5	1.3	105	163	185	145	200	176
		CE-S-P	0.17	6.6	45	68	8.5	1.3	105	165	185	145	200	176
		CE-S-P	0.17	6.6	45	68	8.5	1.3	105	184	185	145	200	176
		CE-S-P	0.17	6.6	45	68	8.5	1.3	105	231	185	145	200	176
	Napoli, Italy	CE-S-P	0.38	49	33	179	3.1	4.2	85	2348	3668	3071	2856	2934

	Livorno, Italy	CE-S-P	0.48	50	34	208	1.9	7.2	58	2400	4231	3084	2765	3269
		CE-S-P	0.49	57	33	213	1.9	7.2	59	4200	4952	4351	3231	3752
	Bothkennar, UK	CE-S-P	0.1	6	40	30	2.9	3.4	17	27	23	18	19	19
		CE-S-P	0.1	6	40	30	2.9	3.4	17	33	23	18	19	19
		CE-S-P	0.1	3.2	35	21	3.6	2.8	15	15	9	6	9	9
		CE-S-P	0.1	6	40	30	2.9	3.4	17	26	22	18	19	19
	Motorvegbru, Drammen, Norway	CE-S-P	0.4	35	25	240	1.1	7.3	65	1350	2837	1451	1800	1890
		CE-S-P	0.4	35	25	240	1.1	7.3	65	2210	2837	1451	1800	1890
	—	OE-S-P	0.76	20	25	144	1	8.3	35	1567	1831	1727	1180	1567
		OE-S-P	0.46	22	25	148	1	8.3	35	976	1150	1093	728	880
		OE-S-P	0.61	19	25	142	1	8.3	34	1269	1352	1272	863	1118
		OE-S-P	0.36	15	25	448	1	8.3	109	1965	1941	1805	1222	1507
		OE-S-P	0.36	12	25	718	1	8.3	172	2368	2506	2330	1602	2045
		OE-S-P	0.31	44	25	162	1.1	8.2	40	1313	1687	1590	1035	1060
		OE-S-P	0.61	96	25	355	1	8.3	86	8516	15991	15190	9878	9533
		OE-S-P	0.61	74	25	273	1.1	7.8	70	7080	9905	9074	6303	6326
		OE-S-P	0.77	23	25	651	1.1	7.4	176	11276	9965	8748	6535	8311
		OE-S-P	0.33	66	25	222	1.2	7.1	63	2205	4056	3595	2595	2342
		OE-S-P	0.33	31	25	154	1.4	6.6	46	971	1350	1185	892	959
		OE-S-P	0.33	46	25	149	1.6	5.5	54	1097	2128	1803	1499	1410
		OE-S-P	0.33	29	25	104	2.5	5.2	40	1252	1003	849	723	871
		OE-S-P	0.33	14	25	112	1.9	4.9	46	637	533	451	404	471
		OE-S-P	0.33	18	25	51	5.5	3.1	33	638	408	352	362	474
		OE-S-P	0.61	48	25	152	2.8	4.7	65	3802	4756	3978	3621	4317
		OE-S-P	0.11	12	25	44	4.7	4	22	59	66	56	53	69
		OE-S-P	0.17	12	25	33	3	4.1	16	70	77	65	61	70
		OE-S-P	0.35	14	25	59	5.5	3.7	32	401	361	307	300	468
		OE-S-P	0.27	40	25	297	2.8	3.6	165	2868	3874	3173	3177	2895
		OE-S-P	0.61	31	25	92	4.7	3.5	52	2022	2166	1821	1821	2472
		OE-S-P	0.33	23	25	91	5.5	3.4	53	691	845	714	715	969
		OE-S-P	0.33	26	25	98	5.9	3.2	62	971	1078	910	927	1217
		OE-S-P	0.27	25	25	244	3.9	2.7	182	2048	2386	2041	2219	2082
Augustesen (2006)	—	OE-S-P	0.53	15	25	66	8.2	2.5	53	819	839	755	798	1221
		OE-S-P	0.27	32	25	141	8.4	2.4	115	1728	1814	1582	1739	2081
		OE-S-P	0.33	13	25	110	5.5	2.1	107	798	786	726	798	864
		OE-S-P	0.61	17	25	86	9.6	1.7	99	2085	1804	1720	1879	2458
		OE-S-P	0.33	14	25	112	6.9	1.7	131	1015	980	930	1024	1071
		OE-S-P	0.27	13	25	80	9.8	1.4	110	674	630	615	671	721
		OE-S-P	0.61	20	25	104	21.2	1	258	4187	4699	4852	5314	5799

	OE-S-P	0.45	9.1	25	54	27	1	185	1166	1137	1310	1314	1360
	OE-S-P	0.76	18	25	116	22.1	1	325	8212	6832	7467	7779	8288
Empire, LA, USA	OE-S-P	0.36	15	60	256	1	8.3	62	1113	1107	1107	702	740
	OE-S-P	0.36	15	50	448	1	8.3	108	1936	1935	1945	1227	1338
	OE-S-P	0.36	12	55	616	1	8.3	148	2127	2150	2201	1374	1532
	OE-S-P	0.36	12	50	719	1	8.1	178	2354	2594	2574	1661	1839
Cowden, UK	OE-S-P	0.46	9.2	15	48	25.2	1	136	1140	895	880	1015	1266
	OE-S-P	0.46	9.2	15	48	25.2	1	136	1390	895	880	1015	1266
	OE-S-P	0.46	9.2	15	48	25.2	1	136	1608	895	880	1015	1266
Izmir, Turkey	OE-S-P	0.53	17	19	62	7.5	2.3	53	1410	910	1494	887	1276
	OE-S-P	0.53	15	20	57	7.8	2.2	52	780	773	744	771	1099
Sumatra, Indonesia	OE-S-P	0.4	43	40	131	2.3	7.5	35	1225	1872	1702	1203	1520
	OE-S-P	0.4	43	40	131	2.3	7.5	35	1555	1872	1702	1203	1520
	OE-S-P	0.4	43	40	131	2.3	7.5	35	1670	1872	1702	1203	1520
	OE-S-P	0.4	43	40	131	2.3	7.5	35	1670	1872	1702	1203	1520
Lower arrow lake, Canada	OE-S-P	0.61	31	39	94	5	3.2	59	1558	2339	1769	2036	2470
	OE-S-P	0.61	31	39	94	5	3.2	59	1958	2339	1769	2036	2470
	OE-S-P	0.61	47	36	150	3.9	4.1	74	2626	4895	3781	3888	4662
West Sole, North sea, UK	OE-S-P	0.76	6	20	38	43.2	1	260	3051	2217	2764	2576	2503
	OE-S-P	0.76	9	20	56	37.9	1	304	5471	3399	4827	3980	3992
	OE-S-P	0.76	12	20	75	34.5	1	349	6681	4846	6182	5692	5771
	OE-S-P	0.76	15	20	93	30.9	1	369	6788	6213	7523	7261	7535
	OE-S-P	0.76	18	20	111	28.9	1	408	8344	8012	10010	9365	9631
Pentre, UK	OE-S-P	0.76	55	18	320	1.1	7.3	87	6030	11418	6678	7266	8352
Tilbrook, UK	OE-S-P	0.76	30	27	212	19.1	1	478	16131	15969	16374	17915	19205
Kontich, Belgium	OE-S-P	0.61	24	52	124	8.2	1.5	164	4840	3881	3525	4098	3849
	OE-S-P	0.61	20	52	109	8.7	1.4	156	3380	3149	2897	3357	3166
Drammen, Norway	OE-S-P	0.81	35	25	240	1.1	7.3	65	2150	5922	3689	3815	4561
	OE-S-P	0.81	35	25	240	1.1	7.3	65	2800	5922	3689	3815	4561

Note: In Tables A1-A2, OE-S-P=open-end steel pipe pile, CE-S-P=closed-end steel pipe pile, CE-Oc-C=closed-end octagonal concrete pile, CE-Sq-C=closed-end square concrete pile, and CE-C-C=closed-end circular concrete pile. (1)=ISO 19901-4:2016, (2)=NGI-05 (Karlsrud et al. 2005), (3)=the SHANSEP-based approach (Saye et al. 2013), and (4)=ICP-05 (Jardine et al. 2005).

Table A2. Summary of uplift load tests on driven piles in clay

Reference	Site location	Pile information		Soil parameters						${}^{\text{S}}R_{\text{uc}}$ (kN)				
		#Type	$B$ (m)	$D$ (m)	$I_p$ (%)	$\sigma_{v0}'$ (kN)	OCR	$S_t$	$s_u$ (kPa)	$R_{\text{um}}$ (kN)	(1)	(2)	(3)	(4)
Augustesen (2006)	Montreal, Canada	CE-C-C	0.3	17	35	67	5.5	2.5	54	458	511	517	453	490
	Göteborg, Sweden	CE-C-C	0.34	34	40	146	1.3	6.5	45	900	1497	1083	981	906

	Bangkok, Thailand	CE-C-C	0.4	8	55	39	5.3	4.9	16	110	141	135	91	172
		CE-C-C	0.4	12	60	48	3.9	5.9	16	165	226	216	144	240
		CE-C-C	0.4	16	60	57	3.2	6.3	18	245	342	331	218	326
		CE-C-C	0.4	20	60	67	2.8	6.3	21	425	499	480	321	433
	Belfast, Ireland	CE-Sq-C	0.25	6	35	32	2.7	2.9	22	69	63	78.3	56.7	77
	Pentre A5, UK	CE-S-P	0.22	10	14	198	1.1	7.6	52	154	226	177	216	249
	Pentre A6, UK	CE-S-P	0.22	10	17	251	1.1	7.3	69	361	372	375	283	362
	Tilbrook, UK	CE-S-P	0.22	13	23	118	24.2	1	402	1238	1408	1626	1527	1249
	Tilbrook, UK	CE-S-P	0.22	18	23	151	20.3	1	425	1995	2117	2493	2313	1900
	Tilbrook B, UK	CE-S-P	0.22	10	32	298	11.3	1	589	1684	1908	1931	1912	1662
	Onsøy, Norway	CE-S-P	0.22	10	40	62	1.2	6.9	18	130	120	111	74	80
		CE-S-P	0.22	33	40	113	1.1	7.8	29	465	645	560	400	354
		CE-S-P	0.22	33	40	113	1.1	7.8	29	510	645	560	400	354
		CE-S-P	0.22	10	40	100	1	8.2	25	161	167	170	105	116
		CE-S-P	0.22	10	40	139	1	8	35	216	231	235	145	161
		CE-S-P	0.22	10	40	177	1	7.9	45	258	322	300	186	206
	Lierstranda, Norway	CE-S-P	0.22	10	21	75	1.5	6.1	25	86	156	129	100	62
		CE-S-P	0.22	10	14	128	1	7.9	32	89	136	137	134	82
		CE-S-P	0.22	10	13	181	1	8.3	44	104	316	136	184	116
		CE-S-P	0.22	10	12	237	1	8.3	57	95	100	101	240	151
	Haga, Norway	CE-S-P	0.15	4.9	18	49	7.3	2.4	42	59	59	62	50	76
		CE-S-P	0.15	4.9	18	49	7.3	2.4	42	65	59	62	50	76
		CE-S-P	0.15	4.9	18	49	7.3	2.4	42	73	59	62	50	76
	Cowden, UK	CE-S-P	0.1	6.4	19	51	18.7	1	131	90	115	104	123	113
	Canons park, UK	CE-S-P	0.1	5.2	50	45	11	1	87	90	67	58	68	53
		CE-S-P	0.1	6.2	48	49	10.9	1	94	119	85	79	88	80
		CE-S-P	0.1	5.9	48	48	10.9	1	93	105	81	74	83	76
Augustesen (2006)	Canons park, UK	CE-S-P	0.1	5.8	48	48	11	1	92	105	79	71	80	74
	Bothkennar, UK	CE-S-P	0.1	6	40	30	2.9	3.4	17	26	23	19	18	17
Lehane et al. (2013)	Dublin, Ireland	CE-S-P	0.27	6.4	12	72	21	1	266	446	521	578	632	665
Augustesen (2006)	Tilbrook, UK	OE-S-P	0.27	18	23	151	20.3	1	425	1891	2684	2363	2883	2475
	Onsøy, Norway	OE-S-P	0.81	15	40	62	1.2	6.9	18	469	719	407	413	539
	Lierstranda, Norway	OE-S-P	0.81	10	21	75	1.5	6.1	25	374	666	465	374	605
	Izmir, Turkey	OE-S-P	0.53	17	19	62	7.5	2.3	53	710	910	884	782	1171
		OE-S-P	0.53	15	20	57	7.8	2.2	52	590	773	779	670	998
	West Sole, UK	OE-S-P	0.76	6	20	38	43.2	1	260	2438	2217	1680	1508	1435
		OE-S-P	0.76	9	20	56	37.9	1	304	2873	3399	3096	2731	2743
		OE-S-P	0.76	12	20	75	34.5	1	349	4466	4846	4727	4259	4338
		OE-S-P	0.76	15	20	93	30.9	1	369	5240	6213	6140	5746	6019

	OE-S-P	0.76	18	20	111	28.9	1	408	6734	8012	8065	7691	7957	
	OE-S-P	0.76	6	20	38	43.2	1	260	1726	2217	1680	1508	1435	
	OE-S-P	0.76	9	20	56	37.9	1	304	2642	3399	3096	2731	2743	
	OE-S-P	0.76	9	20	56	37.9	1	304	3079	3399	3088	2731	2743	
	OE-S-P	0.76	12	20	75	34.5	1	349	4457	4846	4706	4259	4338	
	OE-S-P	0.76	15	20	93	30.9	1	369	4510	6213	6102	5746	6019	
	OE-S-P	0.76	18	20	111	28.9	1	408	6023	8012	7989	7691	7957	
	Tilbrook, UK	OE-S-P	0.76	29	27	219	17.6	1	489	16200	16098	14220	16039	16788
	Canons park, UK	OE-S-P	0.1	5.7	49	47	11	1	91	94	77	54	79	60
	Kontich, Belgium	OE-S-P	0.61	24	52	124	8.2	1.5	164	4100	3881	3359	3666	3417
		OE-S-P	0.61	20	52	109	8.7	1.4	156	2420	3149	2730	2948	2757
	Long beach, USA	OE-S-P	0.76	23	16	673	2.5	3.7	365	10710	14934	12361	10941	14164
	West Delta, USA	OE-S-P	0.76	71	41	128	2.1	7	37	5030	5958	5655	3800	4552
		OE-S-P	0.76	71	41	128	2.1	7	37	4850	5982	5669	3811	4566
	Belfast, Ireland	OE-S-P	0.17	2.0	35	33	2.5	3	22	12	14.5	15.4	12.8	13
Karlsruud (2012)	Børsea, Norway	OE-S-P	0.41	50	12	230	2.28	5.1	91	1448	4588	2031	4962	4022
	Vigda, Norway	OE-S-P	0.46	27	14	112	4.51	3.6	62.8	1461	1608	843	2341	1958
		OE-S-P	0.46	53	12	212	3.11	4.9	86.9	2172	5154	1980	6769	5176
	Onsøy 2, Norway	OE-S-P	0.51	18	33	68	1.47	5.8	23.5	634	561	551	478	456
	Stjørdal, UK	OE-S-P	0.51	23	14	136	1.41	8.3	32.7	527	1204	377	1185	1151
	Cowden, UK	OE-S-P	0.46	9	18	85	11.9	1.5	113	873	680	730	1183	1122
	Femern, Germany	OE-S-P	0.51	25	110	104	4.62	2.4	85	3028	1873	3391	2301	1445
	Oromieh, Iran	OE-S-P	0.31	66	22	178	1.3	7.4	48	2825	2925	2371	2574	1776

**Appendix A2**

Table A3. Correlation between  $M_u$  and input parameters for driven piles in clay

Load type	Pile tip	$N$	Design method	$B$		$D/B$		$I_p$		OCR		$S_t$		$s_u/\sigma_{v0}'$	
				$r$	$p$	$r$	$p$	$r$	$p$	$r$	$p$	$r$	$p$	$r$	$p$
Compression	Closed-end	115	ISO 19901-4:2016	-0.1	0.27	<b>-0.41</b>	<b>0</b>	<b>0.34</b>	<b>0</b>	0.04	0.65	0.04	0.64	0.18	0.05
			NGI-05	<b>-0.46</b>	<b>0</b>	<b>-0.22</b>	<b>0.02</b>	-0.06	0.51	0.13	0.17	-0.18	0.06	<b>0.19</b>	<b>0.04</b>
			SHANSEP	<b>-0.35</b>	<b>0</b>	-0.14	0.14	-0.13	0.16	-0.04	0.7	0.03	0.73	-0.1	0.28
			ICP-05	<b>-0.44</b>	<b>0</b>	0.03	0.72	0.12	0.19	0.01	0.94	-0.12	0.19	0.16	0.08
	Open-end	60	ISO 19901-4:2016	0.06	0.64	<b>-0.71</b>	<b>0</b>	<b>-0.34</b>	<b>0.01</b>	<b>0.59</b>	<b>0</b>	<b>-0.57</b>	<b>0</b>	<b>0.58</b>	<b>0</b>
			NGI-05	-0.11	0.4	<b>-0.42</b>	<b>0</b>	-0.16	0.22	<b>0.42</b>	<b>0</b>	<b>-0.41</b>	<b>0</b>	<b>0.41</b>	<b>0</b>
			SHANSEP	-0.17	0.2	-0.23	0.07	0.04	0.73	-0.23	0.08	<b>0.29</b>	<b>0.02</b>	<b>-0.28</b>	<b>0.03</b>
			ICP-05	-0.16	0.21	-0.19	0.15	0.09	0.47	-0.23	0.07	0.25	0.06	-0.23	0.08
Uplift	Closed-end	32	ISO 19901-4:2016	<b>-0.61</b>	<b>0</b>	0.03	0.88	0.15	0.41	<b>0.38</b>	<b>0.03</b>	<b>-0.48</b>	<b>0.01</b>	<b>0.42</b>	<b>0.02</b>
			NGI-05	<b>-0.65</b>	<b>0</b>	0.16	0.37	0.19	0.31	0.12	0.5	-0.23	0.2	0.15	0.41
			SHANSEP	-0.27	0.14	0.01	0.95	<b>0.55</b>	<b>0</b>	-0.1	0.59	0.01	0.94	-0.06	0.74
			ICP-05	<b>-0.48</b>	<b>0.01</b>	<b>0.55</b>	<b>0</b>	<b>0.37</b>	<b>0.04</b>	-0.07	0.71	-0.04	0.84	-0.02	0.91
	Open-end	32	ISO 19901-4:2016	-0.15	0.41	-0.06	0.73	<b>0.37</b>	<b>0.04</b>	0.25	0.17	-0.25	0.16	0.25	0.17
			NGI-05	-0.15	0.42	0.09	0.64	0.08	0.68	-0.07	0.72	0.11	0.53	-0.07	0.69
			SHANSEP	0.33	0.07	-0.2	0.28	<b>0.62</b>	<b>0</b>	0.04	0.83	0.01	0.96	0.07	0.69
			ICP-05	0.07	0.69	-0.14	0.43	<b>0.64</b>	<b>0</b>	0.24	0.19	-0.2	0.26	0.26	0.15

Note: Bold values indicate potential correlation between the model factor and the underlying parameters.