Statistical Analysis of Sulfate Attack Resistance of Reactive Powder Concrete

Umut Bektimirova¹, Eldar Sharafutdinov², Chang S. Shon³, Dichuan Zhang⁴, and Jong R. Kim⁵

- ¹ Department of Civil and Environmental Engineering, Nazarbayev University, 53 Kabanbay batyr avenue, Nur-Sultan, Kazakhstan, 010000, ubakhbergenova@nu.edu.kz
- ² Department of Civil and Environmental Engineering, Nazarbayev University, 53 Kabanbay batyr avenue, Nur-Sultan, Kazakhstan, 010000, esharafutdinov@nu.edu.kz
- ³ Department of Civil and Environmental Engineering, Nazarbayev University, 53 Kabanbay batyr avenue, Nur-Sultan, Kazakhstan, 010000, chang.shon@nu.edu.kz
- ⁴ Department of Civil and Environmental Engineering, Nazarbayev University, 53 Kabanbay batyr avenue, Nur-Sultan, Kazakhstan, 010000, dichuan.zhang@nu.edu.kz
- ⁵ Department of Civil and Environmental Engineering, Nazarbayev University, 53 Kabanbay batyr avenue, Nur-Sultan, Kazakhstan, 010000, jong.kim@nu.edu.kz

Abstract. This paper is the study of sulfate attack resistance of reactive powder concrete (RPC). RPC that is also known as ultra-high performance concrete is a special type of concrete material obtained when fine powders like silica fume (SF) are added into the concrete mortar along with very low water-to-binder ratio (w/b). SF is a pozzolanic material obtained as a by-product of silicon metal or ferrosilicon alloys production. In this study, total 6 different RPC mixtures with various w/b (0.18, 0.22 and 0.26) and various SF content were studied. SF was added into the concrete mixtures in the amount of 15%, 20% and 25% of cement by weight. The other testing parameter includes 3 different concentrations of sodium sulfate (Na₂SO₄) solutions (0.35 M, 0.7 M and 1.4 M concentrations). Broad laboratory investigations of behavior of the RPC mixtures were conducted in terms of compressive strength and mass gain of cubes (50×50×50 mm³) and expansion and mass change as in accordance with ASTM C1012. Test results had been analyzed and assessed by Taguchi method. The significance level of experimental parameters was determined by using Analysis of variance (ANOVA) method. According to statistical and analytical results it was observed that RPC has high sulfate attack resistance. Moreover, addition of optimal amount of SF into the RPC mixtures as well as decreasing w/b can significantly improve Na₂SO₄ resistance of RPC.

Keywords: Reactive Powder Concrete, Taguchi Method, Silica Fume, Sulfate Attack Resistance.

1 Introduction

Sustainable development concept has recently become one of the most important topics in the construction industry. Moreover, development of alternative sources of energy in the face of energy crisis due to limited natural resources is foremost issue of the industry. Compressed air energy storage system incorporated into pile foundation system of the apartment building is proposed as a viable alternative to accumulating excess energy from solar panels installed on the building during the off-peak hours to be able to use it during the increased demand periods (Tulebekova *et al.*, 2017, Zhang *et al.*, 2018). Hence, complex structural and internal loading conditions require the piles to be made of superior performance material such as ultra-high performance concrete (Tulebekova *et al.*, 2019). Reactive Powder Concrete (RPC) is a type of

ultra-high performance concrete that is obtained by removing coarse aggregates from and addition of pozzolanic materials like silica fume (SF) to the concrete along with very low water-to-binder ratio (w/b) (Sun *et al.*, 2015). RPC has a densified microstructure that is attributed to the removal of coarse aggregates and the pozzolanic reaction that lead to the formation of strong bonds in interfacial transition zone due to the increased formation of strong calcium silicate hydrate lattices (Beglarigale and Yazıcı, 2015). It was investigated that the optimization of SF content and w/b results in the RPC with very high compressive and tensile strength (Ahmad *et al.*, 2015; Bektimirova *et al.*, 2018). Moreover, compressive strength of RPC could be increased further by optimization of packing degree of small aggregate (Ji *et al.*, 2011, Bektimirova *et al.*, 2020). Nevertheless, RPC is a relatively new type of concrete material, and its durability properties is still an ongoing topic of research.

External sulfate attack (ESA) is a concrete durability issue arising from the migration of sulfate ions from surrounding soils into the concrete structure, resulting in the series of chemical reactions and physical processes that cause irrecoverable damage to material (Marchand *et al.*, 2003). Even though the exact mechanism of sulfate attack is still questionable, it is agreed that the physical damage in the material occurs through the formation of expansive products such as gypsum and ettringite (Tixier and Mobasher, 2003) that leads to dimensional expansion and mass gain of the specimen. Expansive products form in the cracks in the microstructure of concrete and exert pressures that could be sustained by the pore spaces in the material (Ikumi *et al.*, 2019). However, the extensive or prolonged formation of expansive products might lead to the irreclaimable damage to concrete microstructure causing material degradation, loss of cohesiveness and strength (Gu *et al.*, 2019). Although Haufe and Vollpracht (2019) reported that RPC has moderate to high resistance to ESA due to its improved microstructure and reduced porosity, little data are available on the ESA resistance of RPC.

In this study, the ESA resistance of different RPC mixtures was investigated. SF content w/b, and concentration of sodium sulfate (Na₂SO₄) solution were selected as primary factors to influence on the compressive strength and expansion of the RPC mixtures exposed to the ESA environment by Taguchi method. Analysis of variance (ANOVA) was used to assess the significance level of experimental parameters.

2 Experimental Program

2.1 Materials

Ordinary Portland cement (ASTM type I) and SF with specific gravities 3.15 and 2.22 correspondingly were used as binder materials in this study. The chemical composition of cement and SF is provided in Table 1. Locally available quartz sand with specific gravity 2.4, absorption capacity of 6.2% was used as a fine aggregate for the RPC mixtures.

Liquid superplasticizer (SP) Master Glenium ACE 430 with specific gravity 1.02, and ordinary tap water were used in RPC mixing.

Table 1. Chemical composition of binders.

Components	Cement	SF	
CaO [%]	65.91	0.22	
SiO_2 [%]	21.55	97.54	
Al_2O_3 [%]	5.55	0.2	
Fe_2O_3 [%]	4.7	0.06	
SO_3 [%]	1.9	-	
MgO [%]	1.46	-	
K_2O [%]	0.35	-	
Loss on Ignition [%]	0.49	2.08	

2.2 Mixture Proportion and Levels of Evaluation Variables

The experiments were designed to analyze the influence of various w/b, SF content, and sulfate concentration on the compressive strength and expansion of RPC. Mixture proportioning of RPC mixtures was completed using the absolute volume method. The details of mixture proportion are provided in Table 2.

Table 2. Mixture proportion of RPC (kg/m³).

No.	Mixture ID	WB	SF	Cement	SF	Sand	Water	SP [% of binder]
1	0.18WB- 20SF	0.18	20	1000	200	903	216	2
2	0.22WB- 20SF	0.22	20	1000	200	788	264	1.5
3	0.26WB- 20SF	0.26	20	1000	200	673	312	1.5
4	0.22WB- 15SF	0.22	15	1043	157	802	264	1.5
5	0.22WB- 25SF	0.22	25	960	240	776	264	1.5

The Taguchi statistical analysis method was used to determine the optimal mixture that will have the maximum compressive strength and the highest ESA resistance which is determined by the lowest expansion and mass gain during the exposure. Taguchi analysis was performed for 3 factors at a time with 3 levels each. Thus, 2 sets of analyses were performed: first one for w/b, second one for SF content, while sulfate concentration and exposure time were factors of analysis for both sets. Factors and levels of Taguchi analysis are shown in Table 3.

Table 3. Levels of the variables in the experimental program.

Factors	Level 1	Level 2	Level 3	
w/b	0.18	0.22	0.26	
SF content	15	20	25	
Na ₂ SO ₄ concentration	0.35	0.7	1.4	
Time of exposure	1 week	4 weeks	13 weeks	

2.3 Casting, Curing and Maintaining the Samples

Mixing RPC was completed in pan type mixer with total mixing time of 9 ± 1 min. Immediately after mixing was complete, RPC was placed into the molds: $50 \times 50 \times 50$ mm cube mold as required in ASTM C109 for compressive strength test; and, $25 \times 25 \times 250$ mm prism molds as required by ASTM C1012 for length and mass change test. RPC specimens were cured for 24 hours in molds covered by plastic sheets to avoid water evaporation, after which they were placed into the Na_2SO_4 solution where they were stored until the test date.

2.4 Test Methods

The length and mass change tests of RPC were performed in accordance with ASTM C 1012 and ASTM C490 on the same samples. Accuracy of digital length comparator and digital scales used for measurements of length and mass change are ± 0.0001 mm and ± 0.001 g correspondingly. The compressive strength test of RPC was conducted in accordance with ASTM C109.

A number of samples are varied from mixture to mixture: 4-8 samples. To achieve better statistical reliability, outliers had been removed from calculated data as in accordance with ASTM E178. The test set up is provided in Figures 1 (a) and 1 (b).

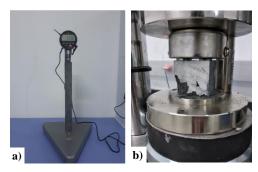


Figure 1. Test setup: (a) length change test; (b) compressive strength test.

3 Results and Discussion

3.1 Statistical Analysis

General Linear Model of analysis of variance (ANOVA) was used to observe statistically important parameters of experiments. Furthermore, to assess the contribution percentage of each parameter to the compressive strength, length and mass change, P-value was used: smaller P-value indicates more affective parameter in the concrete performance characteristics (Lin *et al.*, 2000). The results of ANOVA for both sets of w/b-concentration-time and SF content-concentration-time are shown in Table 5.

Source	SS	MS	F	P-Value	Source	SS	MS	F	P- Value	
	ANOVA for Compressive Strength of RPC									
w/b	48	24	0.31	0.735	SF	472.6	236.29	2.16	0.142	
conc	329.4	164.7	2.15	0.143	conc	143.4	71.72	0.65	0.53	
time	4731.02	2365.51	30.86	0	time	4090.2	2045.12	18.67	0	
	ANOVA for Length Change of RPC									
w/b	0.002954	0.001477	41.65	0	SF	0.001211	0.000605	19.76	0	
conc	0.000478	0.000239	6.74	0.006	conc	0.000404	0.000202	6.59	0.006	
time	0.000484	0.000242	6.82	0.006	time	0.000353	0.000177	5.77	0.011	
ANOVA for Mass Change of RPC										
w/b	6.1525	3.07624	41.31	0	SF	0.3926	0.1963	7.22	0.004	
conc	1.1562	0.57808	7.76	0.003	conc	2.604	1.302	47.89	0	
time	0.8825	0.44127	5.93	0.01	time	1.0554	0.52768	19.41	0	

Table 5. Results of ANOVA for w/b-concentration-time set and SF content-concentration-time set.

According to Table 5, time is the most important parameter for compressive strength in both sets of experiments while length change is controlled by w/b and SF factors in w/b-concentration-time and SF content-concentration-time sets respectively. Mass change is also influenced mostly by w/b in w/b-concentration-time set; nevertheless, in SF content-concentration-time set it is affected by time and concentration factors. Hence, it is possible to suggest that time of exposure and RPC mixture content play more important role in ESA resistance of RPC.

3.2 Taguchi Analysis

The "smaller is better" Taguchi's quality loss function for compressive strength, length, and mass change of RPC was used to determine the optimal conditions for both w/b-concentration-time and SF content-concentration-time sets. The loss function is transferred further into utility function called Signal-to-Noise ratio (S/N) developed by Taguchi. S/N allows to identify performance characteristic deviating from desired value (Rahimi et al., 2016). Noise factor is any factor that causes deviation from targeted value for measurable product or process characteristics. Minitab statistical software was used for the statistical analysis of the results which are discussed in following sections.

3.2.1 Compressive strength

The main goal of every experiment is to determine the highest possible S/N value that will indicate that random effects of the noise factors are negligible compared to that of the signal. Fig. 2 shows the S/N ratio of compressive strength for w/b-concentration-time and SF-concentration-time sets.

As presented in Fig. 2, the minimum variation in compressive strength was obtained for the RPC containing w/b=0.26 and SF=25 %. Fig. 2 also shows that optimal values of concentration and curing time are 0.35M and 1-week in both w/b-concentration-time and SF content-concentration-time sets. In fact, compressive strength of RPC generally tends to decrease with

increasing the concentration of Na₂SO₄ solution: The higher concentration of Na₂SO₄ solution, the more deterioration of in RPC performance. It is possible to observe from Fig. 2 that 1.4M Na₂SO₄ solution not only has lower S/N ratio, but also has more damaging effect on compressive strength than 0.7M solution. This result may be attributed to stoichiometry of chemical reaction occurring during the sulfate attack exposure of concrete: As the concentration of Na₂SO₄ solution increases, more sulfate ions penetrate in to the specimen, consequently leading to more deteriorative cracks inside specimen and the reduction of the strength.

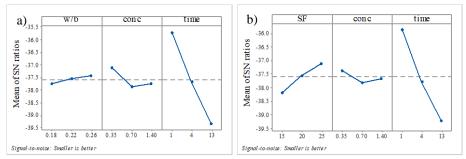


Figure 2. Main effects plots for SN ratios (Compressive strength): (a) w/b-concentration-time set; (b) SF content-concentration-time set.

3.2.2 Length and Mass change

Fig. 3 shows the S/N ratio of length change for two sets of experiments. According to Fig. 3 (a), the minimum variation of length change is created by w/b=0.18 at 0.35M Na₂SO₄ concentration at 1-week exposure. According to Fig. 2 (b) SF content=25 has the most stable reading.

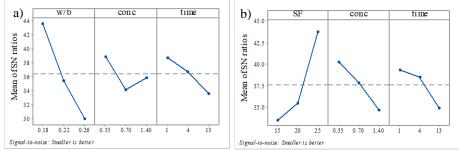


Figure 3. Main effects plots for SN ratios (Length change): (a) w/b-concentration-time set; (b) SF content-concentration-time set.

Fig. 4 shows the S/N ratio of mass change for two sets of experiments. Accordingly S/N ratios of mass change show the same trends as for length change for both sets of experiments. The reason is possibly that the same samples were used for both measurements. Furthermore, expansion of RPC exposed to sulfate attack result in both mass gain and elongation of the sample. Thus, formation and accommodation of expansive products in the RPC internal structure is indicated by the mass gain of the samples. Moreover, the process of accommodation of expansive products (ettringite formation) leads to internal cracking resulting in the expansion

of concrete. Hence, it appears to be logical that both length and mass change measurements show similar statistical behavior as it is observed by Taguchi analysis in this study.

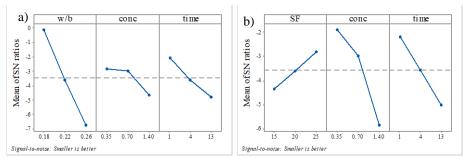


Figure 4. Main effects plots for SN ratios (Mass change): (a) w/b-concentration-time set; (b) SF content-concentration-time set.

4 Conclusion

Sulfate attack is an important durability problem of concrete structures exposed to groundwaters containing sulfate ions as in case of pile foundations. RPC is a relatively new type of material that has superior durability and mechanical characteristics. This study statistically analyzed sulfate attack resistance of RPC in two sets of influence factors. Accordingly, the following conclusions can be made:

- The ANOVA analysis showed that compressive strength of RPC exposed to Na₂SO₄ environment is influenced by time factor for both sets of experiment; while length and mass change are mostly affected by the RPC mixture content (w/b and SF content) and time of exposure.
- Based on Taguchi analysis, it is possible to suggest that optimal w/b=0.18 and optimal SF content=25 % for all three performance characteristics, namely compressive strength, length and mass change.

In conclusion, RPC appears to have high resistance to sulfate attack; however, this study is limited by the statistical analysis of standard test methods. Thus, more comprehensive study of sulfate attack resistance of RPC considering temperature effect and other types of sulfate solution may be needed to assess the resistance of RPC to sulfate attack incorporated with statistical analysis.

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ORCID

Umut Bektimirova: https://orcid.org/0000-0002-8910-6631
Eldar Sharafutdinov: https://orcid.org/0000-0003-4849-3206
Dichuan Zhang: https://orcid.org/0000-0002-9253-4178

Jong R. Kim: https://orcid.org/0000-0002-8796-3832

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