

Structural Model to Describe Restoration Experience From The Impact of Environmental Qualities and Mediation Effect of Perceived Restorativeness

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Abstract: Restoration experience is a positive response against the ever-increasing problem of stress. It is recovery of attentional capacity, clearing random thoughts and feelings of relaxation and calmness. Although there is a body of research on investigating the impact of open green space characteristics on psychological restoration through attention restoration theory and supportive environment theory, there is little knowledge on how the interaction among these characteristics could promote restorative outcomes. To address this problem, using Perceived Sensory Dimension (PSD) for open green space qualities and Perceived Restorativeness (PR) as the property of restorative environment, this study assessed the extent to which the PSD and PR impact on restoration experience. Using 444 screened surveys, a Partial Least Square Structural Equation Model (PLS-SEM) was developed and the validity and reliability of it, was demonstrated. Extensive analysis of the results showed how environmental qualities can promote restoration experience using a sample of university students. These results provide information for landscape architecture and planning researchers to promote the development of open spaces as a resource of psychological restoration and stress relief.

Keywords: perceived sensory dimension (PSD); restoration experience; perceived restorativeness; structural equation modeling; mediation effect

1. Introduction

Stress and mental fatigue are the greatest risk factor of psychological well-being and mental health in human life (Asztalos et al., 2009). Restoration experience in green spaces as a positive action against excess stress is recharging of the resources, which are diminished in performing of daily life tasks (Han, 2003). Perceived restorativeness characteristics have acted as the supportive mechanism on the effect of environment qualities and positive outcomes (Marselle et al., 2016; Hipp et al., 2016). Green spaces with a set of specific characteristics are suggested for mental restoration as some were shown to be more influential than others in this process (Grahn and Stigsdotter, 2010). Still, it is not clear how the addressed salutary factors of green spaces are related with perceived restorativeness characteristics and restoration experience. Although, understanding the significance of underlying measurement variables urged by many studies (e.g. Marselle et al., 2016; Hipp et al., 2016), there are few to take the approach for understanding of the psychological restoration through salutary factors and perceived restorativeness characteristics. Therefore, this study integrates nature related theories to explain how and why restoration experience is happening and what are the important qualities for experience of psychological restoration, as it could provide valuable information to design psychological health-promoting environments.

1.1. Perceived Restoration Experience (PRE)

The association between human interaction with nature has been investigated through the actual and perceived restoration experiences. Through laboratory or field experimental design approaches, the actual restoration experience studies monitors the beneficial changes of short exposure to nature on subjects' psycho-physiological and emotional state, which is manipulated prior to nature intervention (e.g. Nordh et al., 2009). The perceived restoration experience studies, through a cross-sectional design approach assessed the beneficial effects of repeated exposure to nature in subjects everyday settings. The concurrence in nature-health related theories of Biophilia hypothesis, stress recovery theory (SRT) and attention restoration theory (ART) is on restoration experience through contact with natural environments. The Biophilia hypothesis explains human evolutionary affiliation to nature and such connectedness to nature shapes experience of positive outcomes (e.g. Haluza et al., 2014). From the viewpoint of SRT, natural environments rapidly evoke affective responses and reduce high stress (Bratman et al., 2015). The ART asserts that natural environments with soft fascinating objects provides opportunities for psychological restoration as does not require conscious mind efforts (e.g. Kaplan, 1995).

1.2. Perceived Restorativeness (PR)

The concept of Perceived restorativeness is developed in ART. Perceived restorativeness is insight into perceptions toward restorativeness qualities of natural environments (Scopelliti et al., 2012; Ivarsson and Hagerhall, 2008).

There are four components in perceived restorativeness as 'being away', 'fascination', 'extent' and 'compatibility' (Kaplan, 1995). Perceive quality of 'being away' is when one's feel is psychologically and physically away from everyday environment and demands. Perceiving quality of 'fascination' is when environment offers fascinating objects that attract attention effortlessly. Perceiving of 'extent' quality is when environment has sufficient objects to engage one's mind. Perceive quality of 'compatibility' is when there is a perfect match between a person and that environment (Kaplan, 1995).

In conceptualization of perceived restorativeness and perceived restoration experience, it has been explained that both concepts emphasize "the recovering aspects of places, which allow people to distract, to relax, to free their minds and to distance themselves from ordinary aspects of life" Scopelliti and Vittoria Giuliani (2004, p.423). The difference is that perceived restoration experience is the state of reduced mental fatigue and perceived restorativeness is the capacity of setting, where mental fatigue is reduced (Han, 2003). Therefore, research based on perceived restorativeness approach evaluates perception towards the potential restorativeness capacity of physical environment by evaluation on the proposed components (Ivarsson and & Hagerhall, 2008). Perceived restorativeness has been considered to play a mediating role in explaining how nature can induce positive outcomes in recent studies (Hipp et al., 2016; Carrus et al., 2015; Marselle et al., 2016). These studies showed that perceived restorativeness characteristics mediate the impact of perceived environmental qualities on positive well-being out-comes (Marselle et al., 2016; Carrus et al., 2015) and university students' quality of life (Hipp et al., 2016).

1.3. Perceived Sensory Dimension (PSD)

Perceived Sensory Dimension (PSD) has been introduced as the new version of open space characteristics, which has been developed by Grahn and his colleges between years of 1985 to 2010 (Grahn and Stigsdotter, 2010; Grahn et al., 2005; Grahn, 1991). They suggested that classification of green space characteristics is apart from qualities that have been attributed to the physical environment. In the first classification version, the introduced characteristics were 'rich variety of specie', 'wilderness', 'forest', 'sports oriented', 'festive', 'play inspiring', 'peaceful' and 'square'. In the next version, it involved landscape characteristics of 'serene', 'space', 'rich in species', 'wild', 'culture', 'the common', 'the pleasure garden' and 'festive' (Grahn et al., 2005). The latest one, which has been so-called as PSD consisted of eight perceived qualities as 'culture', 'nature', 'prospect', 'refuge', 'rich in species', 'social', 'space' and 'serene' (Grahn and Stigsdotter, 2010). The idea in development of PSD is based on multi-sensory perception of open green spaces and supportive environment theory (SET) Grahn and Stigsdotter (2010); Memari et al. (2017); Stoltz et al. (2016).

The green space related characteristics has been used as a valid and reliable measurement approach in landscape open spaces. For example, using the geographic information system and area-aggregated self-report assessment approaches, studies showed how availability of these characteristics in nearby neighbourhoods could be associated with their residents' higher psychological health benefits (Annerstedt et al., 2012; De Jong et al., 2011). Re- search conducted in nature-based therapy has demonstrated how the outdoor environment with these salutary features can serve as therapeutic landscapes for stress recovery and rehabilitation (Bengtsson and Grahn, 2014). The association of PSDs with evaluation of perceived restorativeness have been supported in urban open spaces Peschardt and Stigsdotter (2013) and in eliciting of restorative responses in the forest environments Stigsdotter et al. (2017). The restorative potential of physical properties of forests stands has been seen through the mediated effect of PSDs (Stoltz et al., 2016). The study by (Memari et al., 2017) highlighted the positive effect of PSDs for stress restoration. In the present study, the perception of these eight qualities in campus open spaces investigated as salutary indicators of psychological restoration.

1.4. Aims and Hypotheses

In accordance with the literature on the beneficial effect of nature, the aim of this study is to investigate perceived restoration through the effect of perceived sensory dimension and perceived restorativeness characteristics (Figure 1). There are three main aims and related hypotheses as followings, which are tested in the context of university campus among population of university students:

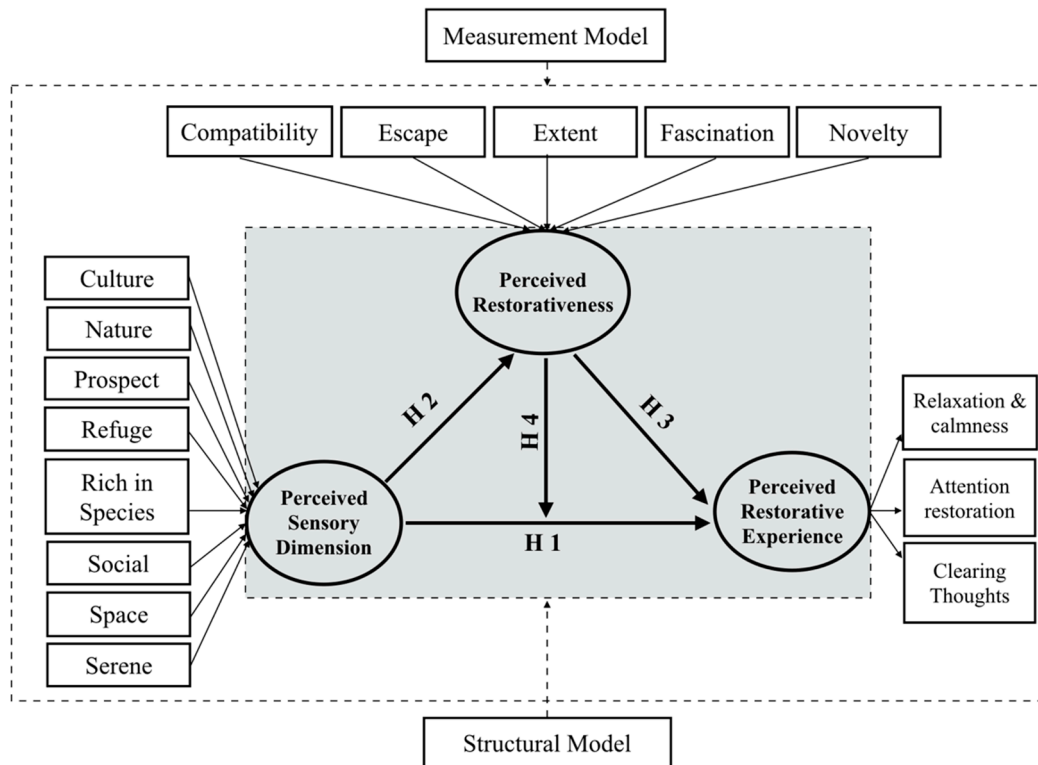


Figure 1. Path model diagram of the associations among study constructs.

- The first aim is to analysis the relationship between perceived sensory dimension and perceived restorativeness and perceived restoration experience.
 - H1: Perceived sensory dimension has positive impact on perceived restoration experience.
 - H2: Perceived sensory dimension has positive impact on perceived restorativeness.
 - H3: Perceived restorativeness has positive impact on perceived restoration experience.
- The second aim is to analyse the effect of perceived restorativeness on the association between perceived sensory dimension and perceived restoration experience.
 - H4: Perceived restorativeness is the underlying mechanism in the relationship between perceived sensory dimension and perceived restoration experience (Mediation Effect).
- The third aim is to determine the role of perceived sensory dimensions and perceived restorativeness characteristics in the process of developing perceived restoration experience. There are two questions to answer as follows:
 - Q1: Which measurement variables explain perceived restorative- ness in campus open spaces?
 - Q2: How measurement variables of perceived sensory dimension are related to perceived restorativeness and restoration experience?

2. Method

2.1. Participants and Procedures

A quantitative questionnaire was conducted through a sample of university students in five Malaysian Research Universities (MRU). Selection of respondents in each university was based on convenience sampling method. Following pilot testing, students were asked to rate their favourite place on university campus outdoor space, in terms of perceived green space related qualities, restorativeness characteristics and restoration experiences, which all were presented in the questionnaire.

2.2. Measures

Perceived Restoration Experience: The Restorative Outcome Scale (ROS) was used in assessment of restoration experience, as was done by previous studies in visit to favorite places (e.g. Korpela et al., 2008). Through ROS-6 items, the measured restorative variables are ‘attention restoration’, ‘clearing thoughts’ and ‘relaxation & calmness’. In previous studies, the reliability of respondents’ recalled feelings of restoration in visit to natural and urban environments has been supported (White et al., 2013). The questions in this part were measured on the 7-points Likert scale of ‘not at all’ to ‘completely’.

Perceived Restorativeness: The Restorative Components Scale (RCS - 22 items) was used in measurement of perceived restorativeness. It consists of five components including ‘compatibility’, ‘fascination’, ‘extent’, ‘novelty’ and ‘escape’. In addition to RCS, perceived restorativeness also was asked through a single item question for construct validity and reliability tests. The questions in this part were measured on the 7-points Likert scale of ‘not at all’ to ‘completely’.

Perceived Sensory Dimension: PSD was assessed using eight perceived qualities including ‘culture’, ‘nature’, ‘prospect’, ‘refuge’, ‘rich in species’, ‘social’, ‘space’ and ‘serene’. The relevant studies have supported the validity of assessment of green spaces with these eight perceived sensory dimensions (Qiu and Nielsen, 2015; Stigsdotter et al., 2017), across different cultural background (Memari et al., 2017; Ska'rb'ack et al., 2015) and in context of university campus (Skarback and Grahn, 2016). In this study, each of eight PSD variables is measured through 3 items, which are addressed in the PSDs’ studies (e.g. Grahn and Stigsdotter, 2010; Peschardt and Stigsdotter, 2013). Based on the relevance to the context of campus open space, the dimensions and their related items are as follows: Culture: 1) Contains fountain, status or pond; 2) Decorated with exotic plants; 3) Decorated with historical elements. Nature: 1) Contains rows of trees, bushes, scent of grass; 2) Has naturally growing greenery; 3) Feelings of being in untouched nature. Prospect: 1) Contains plane and well-cut lawns; 2) Contains plain surfaces; 3) Visibility to over surroundings. Refuge: 1) Safe environment with a sense of privacy; 2) Enclosed with many shrubs and trees; 3) Offers sitting to watch others being active. Rich in Species: 1) Contains a wide range of plants; 2) Contains a wide range of birds, animals and insects; 3) Contains variety of specific flowers. Social: 1) Contains several seats and benches; 2) Contains plenty of people and movements; 3) Equipped with facilities for festivity and pleasure. Space: 1) Is a free and vast environment; 2) Contains lots of sunny and shady areas; 3) Possible to move freely. Serene: 1) Not effects of traffic noise or disturbing people; 2) Is a clean and well-maintained environment; 3) Contains sounds of wind, birds and water. Moreover, a single item question was asked for reliability and validity tests of this construct in addition to 24 items of PSD. The questions in this part were measured on the 7-points Likert scale of ‘totally disagree’ to ‘totally agree’.

3. Statistical Analysis

Structural Equation Modelling (SEM) is the second-generation multivariate data analysis method that combines factor analysis and multiple regressions. Although there are two types of SEM which are covariance-based SEM (CB-SEM) and partial least square SEM (PLS-SEM), the use of PLS-SEM in this study was more appropriate since it is exploratory in its nature (Hair et al., 2016). In this study, a model PLS-SEM model is developed using SmartPLS v3.0 (Ringle et al., 2015). The use of SEM provides more robust model testing compared to conventional regression modelling. Prior to examining the structural model for hypotheses testing, a measurement model is assessed in this study, to determine the validity and reliability of the proposed model. The recommendations by (Hair et al., 2016) was used for all the steps of data screening step and model evaluation.

The first step is data quality evaluation steps including checking for missing data, looking for suspicious response pattern, detecting outliers and checking for data distribution. As it has been expected, by including extra 20 % in the number of respondents (n = 500) (De Vaus, 2002), 19 % of the collected data has been removed in various steps of data screening and the remaining data contains 444 respondents.

The next phase is evaluation of model consisting of reliability and validity assessment of measurement model and structural model. In the proposed PLS-SEM path model, the measurement model contains the relationship between the latent constructs and their measurement variables, which obtained by self-reported quantitative instruments. There are two different analysis tests based on the type of the constructs (reflective or formative). In the reflective construct the measures are all caused by a single underlying construct, while in formative model the measures all have an impact on (or cause) a single construct (Jarvis et al., 2003, p. 201). PRE is the only reflective construct in the proposed model and PSD and PR are the formative construct.

3.1. Reliability and Validity of the Constructs

For the reflective construct of PRE, internal consistency reliability and indicator reliability are two reliability tests. The two validity tests are convergent validity and discriminant validity. As presented in Table 1, in both reliability tests the results of PRE construct could satisfy the conditions for reliability. Moreover, both validity tests were also successful in measuring the PRE construct according to Table 2.

Table 1: Reliability Assessment for Latent Construct of PRE.

Reliability Test	Measurement Method	Criteria	Value
Internal Consistency Reliability	Cronbach's Alpha	> .7	.861
	Composite Reliability	> .7, < .95	.915
Indicator Reliability	Outer Loading	> .708	
	- Attention Restoration		.892
	-Clear Thoughts		.883
	-Relaxation and Calmness		.877

Table 2: Validity Assessment for Reflective Latent Construct of PRE.

Validity Tests	Measurement Method	Criteria	PR	PSD	PRE
Convergent Validity	AVE	> .5	-	-	.781
Discriminant Validity	a) Cross-Loadings	Highest			
	-Attention Restoration		.557	.451	.892
	-Clear Thoughts		.583	.474	.883
	-Relaxation and Calmness		.661	.553	.877
	b) Fornell-Larcker	Highest			
	-PR			.655	
	-PRE		.684	.562	.884

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Formative constructs of the proposed model are PSD and PR. In order to examine the quality of them, convergent validity, collinearity statistics among indicators and significance and relevance of outer weights of indicators have been conducted. Convergent validity is done using a simple model connecting the formative construct to its single-item construct. For the path coefficient higher than 0.7, the convergent validity of the construct is achieved. For PSD, the path coefficient value is 0.836 and for PR, it is 0.839. Thus, the convergent validity of formative constructs in this model is proven. Furthermore, the results of collinearity for proposed model are presented in Table 3 and all the indicators are within the required range.

Last step is to assess the significance of the construct measures in the model. Using Bootstrapping, if the p-value of an indicator is lower than 0.050, then that indicator is significant. Otherwise, the outer loading of that indicator is checked if is equal or greater than 0.500. If so, the indicator still is considered as significant. Otherwise, that indicator is insignificant in the model. According to Table 4, all the variables for the constructs of PSD and PR except 'Culture' and 'Refuge' have p-value less than 0.050. 'Culture' has outer loading of $0.507 \geq 0.500$ and 'Refuge' has outer loading of $0.716 \geq 0.500$. Thus, both these variables are also considered as significant and is used in the assessment of the proposed model.

Table 3: Collinearity Statistics with Outer VIF for Formative Latent Constructs of PSD and PR.

Construct	Indicator	Criteria	VIF
PSD	Culture	< 5	1.558
	Nature		1.908
	Prospect		1.554
	Refuge		1.852
	Rich in Species		1.896
	Social		1.164
	Space		1.378
PR	Serene		1.368
	Compatibility		1.635
	Escape		1.286
	Extent	< 5	1.589
	Fascination		1.699
	Novelty		1.195

Table 4: Indicator Significance Analysis for Formative Latent Constructs of PSD and PR.

Construct	Indicator	Std. Dev.	t-value	p-value	Outer Loading
PSD	Culture	.071	1.045	.296	.507
	Nature	.072	2.829	.005	.729**
	Prospect	.074	3.324	.001	.709**
	Refuge	.072	1.567	.117	.716
	Rich in Species	.073	3.095	.002	.659**
	Social	.057	2.784	.005	.342**
	Space	.070	3.740	.000	.667***
PR	Serene	.065	5.762	.000	.686***
	Compatibility	.065	5.085	.000	.791***
	Escape	.052	3.552	.000	.579***
	Extent	.055	4.171	.000	.738***
	Fascination	.059	7.803	.000	.869***
	Novelty	.043	3.182	.001	.485**

3.3. Structural Model

In a structural model the significant of relationship between the latent constructs is shown to support research theories and hypotheses. In evaluation of structural model, five analysis steps are taken place including: assessing path coefficients, evaluating the coefficients of determination, evaluating the effect size, assessing the predictive relevance.

The collinearity of the model is tested using predictor construct (PSD → PR, PR → PRE and PSD → PRE) tolerance and VIF. As shown in Table 5, all the paths' tolerance and VIF are between 0.20 and 5.00 and thus there is not collinearity problem in the model.

Table 5: Constructs' Collinearity Examinations using VIF.

Link	Criteria	Tolerance	VIF
PSD → PRE	Tolerance > .20	.571	1.751
PSD → PR	and	1.000	1.000

PR → PRE VIF < 5 .571 1.751

In evaluation of structural model, coefficient of determination (R^2 value) shows how much of endogenous construct (dependent variable) is predicted by exogenous constructs (independent variable) connected to it. Value less than .25 shows weak, from 0.25 to 0.50 shows moderate, from 0.50 to 0.75 shows substantial and bigger than that shows high level of predictive accuracy. As presented in Table. 6, a moderate prediction accuracy of the latent constructs exists in the model.

Table 6: Constructs R^2 Results.

Construct	R^2	Std. Dev.	t-value	p-value
PR	.429***	.034	12.555	.000
PRE	.490***	.034	14.249	.000

The effect size f^2 demonstrates that how much predictor constructs of PSD and PR (independent variables) are contributing to the coefficient of determination (R^2 value) of endogenous latent variables (PR and PRE). Values of 0.02, 0.15, 0.35 and greater are interpreted as small, medium and large effect size. As shown in Table 7 there is large effect of PSD on PR, medium effect of PR on PRE and small effect of PSD on PRE.

Table 7: The Effect Size of The Paths in The Model.

Link	f^2
PSD → PRE	.044
PSD → PR	.751
PR → PRE	.342

Measurement of Q^2 displays the model's predictive relevance. Table 8 and 9 are blindfolding measurements for both indicators and endogenous constructs (PR and PRE), where $Q^2 > 0.000$ means that the construct or indicator has predictive relevance. In both tables, SSO indicates the Sum of the Squared Observations and SSE is the Sum of Squared Prediction Errors. Values of 0.02, 0.15, and 0.35 of Q^2 show small, medium and large predictive relevance of an endogenous construct. For the proposed model, there is medium predictability for PR by PSD and large predictability for PRE by PSD and PR.

Table 8: Blindfolding to Examine Cross-Validated Redundancy for Endogenous Constructs.

Construct	SSO	SSE	Q^2
PSD	3,552.00	3552.00	
PR	2,220.00	1782.64	.197
PRE	1,332.00	857.55	.356

Table 9: Blindfolding to Examine Cross-Validated Redundancy for Indicators.

Construct	Indicator	SSO	SSE	Q^2
PSD	Culture	444	444	
	Nature	444	444	
	Prospect	444	444	
	Refuge	444	444	
	Rich in Species	444	444	
	Social	444	444	
	Space	444	444	
	Serene	444	444	
PR	Compatibility	444	346.347	.220
	Escape	444	397.704	.104
	Extent	444	341.866	.230

	Fascination	444	297.359	.330
	Novelty	444	399.363	.101
PRE	Attention Restoration	444	305.497	.312
	Clearing Thoughts	444	294.112	.338
	Relaxation & Calmness	444	257.944	.419

The significances of the path coefficients are examined using Bootstrapping method. As shown in Table 10, all the p-values for paths are lower than 0.05. Moreover, T Statistics (t-value) for all paths are above 1.96. Thus, all the paths are significant in this model.

Table 10: Examining the Significance of Path Coefficients Using Bootstrapping.

Link	Path Coefficient	Std. Dev.	t-value	p-value
PSD → PRE	.199***	.046	4.310	.000
PSD → PR	.655***	.026	25.276	.000
PR → PRE	.553***	.041	13.423	.000

3.4. Model Analysis Results

In model analysis, the first relation to investigate is the link between PSD and PRE. Although the path coefficient of PSD → PRE is as low as 0.199, the mediation effect of PR also should be taken into account. Thus, the total effect of this link is calculated and presented in Table 11. As shown in this Table, the total effect of PSD on PRE is as high as 0.562. Therefore, the existence of the link between PSD and PRE is supported. In addition to PSD → PRE, the other two links of this model (PSD → PR and PR → PRE) show a high total effect with values 0.655 and 0.553, respectively. Thus, the existence of the strong links among all constructs of this model has been supported.

Table 11: Direct, Indirect and Total Effect.

Link	Direct Effect	Indirect Effect	Total Effect
PSD → PRE	.199	.362	.562
PSD → PR	.655		.655
PR → PRE	.553		.553

Figure 2 demonstrates a complete view to the links and relations of variables and constructs of the model. The highlighted paths have higher effect in the model compared to other ones. For instance, PSD → PR is highlighted but not PSD → PRE comparing the two path coefficients of 0.655 and 0.199.

In this part, the effect of measurement variables to develop their construct is examined. The only reflective construct in the model is PRE with three measurement variables of 'Attention Restoration', 'Clearing Thoughts', 'Relaxation & Calmness'. As shown in Table 12, all three measurement variables of construct PRE are significant (p-value=0.000) with high t-values. Moreover, all three variables have almost the same outer loading values which demonstrates the importance of presence of all of them in developing the construct of PRE.

There are two formative constructs in the model PSD and PR. The result of outer weights for measurement variables of these two constructs is presented in Table 13. PSD consists of 8 measurement variables. As shown, 'Culture' and 'Refuge' have not significant effect in PSD construct with p-values of 0.287 and 0.121 respectively. From the rest of measurement variables 'Serene' has the highest outer weight (0.372). 'Space', 'Prospect', 'Rich in Species' and 'Nature' are the next important measurement variables in PSD construct. The lowest and yet significant measurement variable in PSD construct is 'Social' with outer weight of 0.159.

The second formative construct in the model is PR. PR consists of 5 measurement variables and the result of outer weight analysis of them is presented in Table 13. All these variable are significant with $p < 0.050$. Among these variables, 'Fascination' has the highest outer weight followed by 'Compatibility'. Other three measurement variables 'Extent', 'Escape' and 'Novelty' have relatively low outer weight compared to two aforementioned.

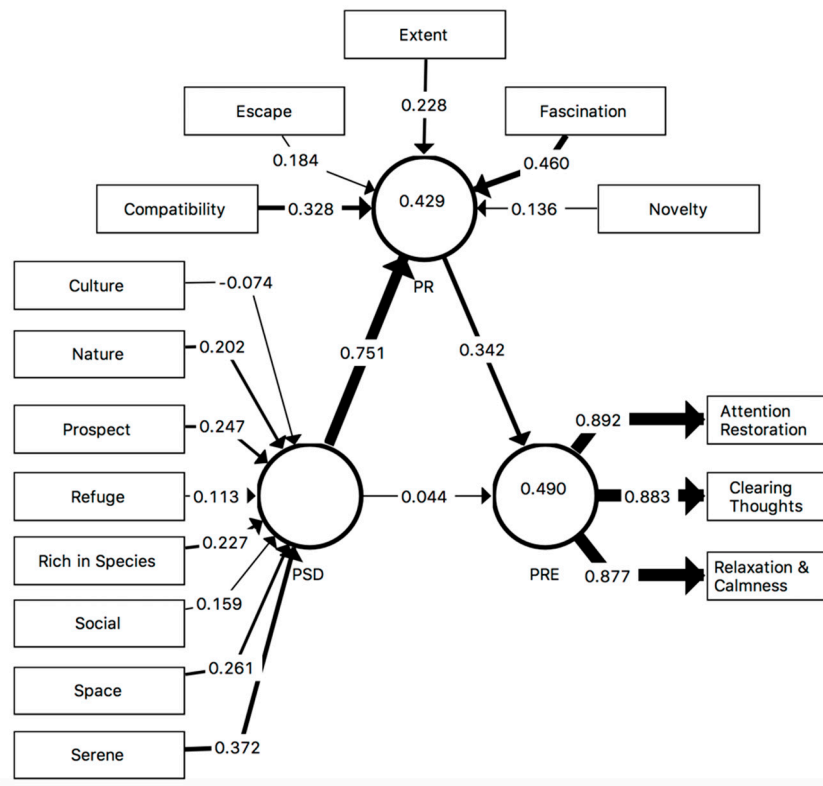


Figure 2. Result of PLS Analysis on Proposed Model.

Table 13: Outer Weights of Formative Constructs of PSD and PR.

Construct	Indicator	Std. Dev.	t-value	p-value	Outer Weight
PSD	Culture	.070	1.064	.287	-.074
	Nature	.072	2.821	.005	.202**
	Prospect	.074	3.347	.001	.247**
	Refuge	.073	1.551	.121	.113
	Rich in Species	.074	3.057	.002	.227**
	Social	.056	2.833	.005	.159**
	Space	.070	3.739	.000	.261***
	Serene	.065	5.689	.000	.372***
PR	Compatibility	.065	5.076	.000	.328***
	Escape	.052	3.534	.000	.184***
	Extent	.055	4.131	.000	.228***
	Fascination	.059	7.818	.000	.460***
	Novelty	.043	3.146	.002	.136**

3.5. Mediator Effect Analysis of PR

To show that the PR has a mediation effect in the model, following steps are done. Firstly, the path coefficient of PSD → PRE is measured in the absence of construct PR. The PLS and Bootstrapping results of it are as shown in Table 14. As shown, there is a significant relation between PSD and PRE (T Statistic 17.628 > 1.96 and p-value 0.00 < 0.05) with the path coefficient of 0.569. Secondly, for indirect analysis, PR is included as a mediator for the relation between PSD and PRE where the proposed model is shown in Fig 2. The PLS and Bootstrapping results (Table 10) show that PR is a partial mediator for PSD to PRE relation. The first reason is that both the paths of PSD to PR and PR to PRE are significant (t-value 13.459 > 1.96 & 25.428 > 1.96) where p-values are less than 0.05. Next, the significant of direct relation between PSD to PRE decreased from 17.628 to 4.365, which demonstrates the presence of the mediator effect in the model. PR acts as a partial moderator in the model as the path between PSD and PRE in the mediator model is still significant. To examine this, the Variance Accounted For (VAF) is calculated. Based on (Hair et al., 2016), the VAF bigger than 0.8 means full mediation and a value between 0.2 to 0.8 is partial mediation effect. The result of VAF in this model with mediator effect is 0.645. Therefore, PR has a partial mediation rule and indirectly, the link between PSD and PRE is effected via the mediate effect of this construct.

Table 14: PLS and Bootstrapping result for relation between PSD and PRE without mediation effect.

Link	Path Coefficient	Std. Dev.	t-value	p-value
PSD → PRE	.569***	.032	17.628	.000

4. Discussion

Studies that have investigated the impact of PSD on perceived restorativeness and restoration experience are few. The purpose of this study was to examine the restoration experience through impacts of PSDs and perceived restorativeness characteristics, in order to provide recommendations for de- signing health-promoting environments. Also, it examined whether perceived restorativeness would mediate the effect of PSD on restoration experience as well as what are the influential PSDs and restorativeness characteristics in this process.

The result on PSD → PRE shows positive significant relationship (support H1). This finding is accordance with previous studies that showed perceived green space related qualities could be associated with better mental health, well-being and stress restoration (Annerstedt et al., 2012; De Jong et al., 2011; Memari et al., 2017). The finding is also correspond with the study on university campus environments that showed perceived greenness is positively related with higher level of students' quality of life (Hipp et al., 2016).

The result on PSD → PR supports the second hypothesis (H2) that perceived open space qualities have influence on evaluation of restorative- ness characteristics. In a more similar attempt, through expert objective measurement approach, it showed that PSDs can positively be associated with users' judgement of restorativeness value of urban open green spaces (Peschardt and Stigsdotter, 2013). However, in this study, this relationship is established through subjective experience of PSDs and potential restorativeness characteristics, rather than experts' objective evaluation approach, which may cause different views in evaluation of qualities in landscape perception (Qiu and Nielsen, 2015).

The result on PR → PRE supports the third hypothesis (H3) that perceived restorativeness has significant effect on restoration experience. It is similar with the findings of Felsten (2009), who demonstrated exposure to restorativeness characteristics of simulated nature in indoor campus settings has recovery effects. This study found that experience of restorativeness in campus outdoor open spaces has positive effect on students' psychological restoration. Based on ART, the essential condition for experience of restorative outcomes is when environment provides restorativeness values (Marselle et al., 2016). Campus open space permits restorativeness experience and is capable of promoting experience of psychological restoration.

The direct, indirect and total effect analysis as well as VAF calculation supports that PR provides a medium mediation effect to explain the impact of PSD on PRE (H4). This is congruence with earlier studies that showed mediation effect of perceived restorativeness on the effect of environmental qualities on emotional well-being (Marselle et al., 2016; Carrus et al., 2015) and university students better quality of life Hipp et al. (2016). The association of PSD and restorativeness has been demonstrated by previous studies (Stigsdotter et al., 2017; Stoltz et al., 2016; Peschardt and Stigsdotter, 2013). To our knowledge, this is the first study in which the mediator effect of perceived restorativeness on the relationship between PSD and restoration experience is examined. Similar with other studies that showed mediation effect of perceived restorativeness (Hipp et al., 2016; Marselle et al., 2016; Carrus et al., 2015), this study showed that perceived restorativeness is important in shaping relationship between

PSD and restoration experience. Greater restoration experience highly depends on effect of PSDs on perceived restorativeness, and then experience of restorative outcomes.

All five measurement variables of PR were found with positive significant effects (Q1). However, the highest effect is occurred by ‘fascination’ and ‘compatibility’. Campus open spaces, which are rich in providing of soft fascination experiences and supporting students required activities or behaviors highly lead to restoration experience. Similar finding with less experience of extent has been addressed in Felsten (2009), where campus indoor settings with no views of nature did not induce great mental restoration. Campus outdoor open spaces, however, is suggested to be ideal setting in experience of restoration by engaging to abundance restorative objects (Lau et al., 2014; Seitz et al., 2014). So, it is expected that such settings allow a deep immersion, which facilitate a sense of distance from sustained academic life strains. It could be because students typically use campus open spaces for their daily activities and in such settings, they still continue stressful feelings which are associated with their campus life. That might be the reason why they are not become fully immersed in such settings to perceive more psychologically and physically aspects of being away from daily responsibilities. Support to this explanation is, when students were asked to visit a natural place that they believe to be beneficial for their mental health development, they visited a separate natural place from the context of their everyday campus to relief from daily concerns (Windhorst and Williams, 2015). Recreational visits on campus open spaces would not give students shift attention away from ‘hard fascination’ experiences that associated with campus structure such as lectures, busy course schedules, assignments, exams and so on (Seitz et al., 2014).

A number of measurement variables of PSD was found with significant effects in the model (Q2). The strongest effect is by perceiving the ‘serene’ quality followed by perceived qualities of ‘space’, ‘prospect’, ‘rich in species’ and ‘nature’. ‘Serene’ was the most cited quality in preference for urban green open spaces (Grahn and Stigsdotter, 2010), experience of restorativeness (Peschardt and Stigsdotter, 2013; Stigsdotter et al., 2017) and stress restoration (Memari et al., 2017). Sense of ‘space’ was found with effect on evaluation of perceived restorativeness (Peschardt and Stigsdotter, 2013) and decrease in poor mental health (Annerstedt et al., 2012). A setting with broad vista view (‘prospect’) has restorativeness potential as required less direct attention Gatersleben and Andrews (2013) and is effective during a stress recovery stage Wang et al. (2016). People inherently love living things in nature and was shown that environments with ‘rich in species’ have positive effect on their emotional restoration (Carrus et al., 2015; Marselle et al., 2016). Strong feelings for component of ‘nature’ reflects its biological effect, which found with positive outcomes (Grahn and Stigsdotter, 2010). Therefore, it is logically plausible that campus open spaces, in which there are sense of silent, peaceful and undisturbed environment (‘serene’), lots of sunny and shady areas without signals that demand attention (‘space’), landscapes with open view areas ‘prospect’, diverse expressions of life in nature ‘rich in species’ and sensation of naturally growing greenery ‘nature’ are associated with perceived restorativeness and emerged feelings of restoration.

The finding in less association of ‘social’ is similar with studies with focus on nature- assisted therapy program (Grahn et al., 2010). A possible explanation might be that students who encountered with severe stress and have socialization in class programs expect to find campus open spaces as places of tranquillity and solitude. This dimension may be a desired quality of open spaces for people who are living in cities (Peschardt and Stigsdotter, 2013). The result of separation and solitude by Windhorst and Williams (2015) demonstrated that for experience of better mental health, university students preferred to visit separate natural places from the context of campus to remove themselves from social environment of campus life.

Perceived restorativeness and restoration experience are associated neither with perceived quality of ‘refuge’ and nor with ‘culture’. Green open spaces with cultural qualities are interesting places for experience of well-being outcomes (De Jong et al., 2012) and perceived restorativeness (Peschardt and Stigsdotter, 2013). In human nature interaction, it explained that people first sought simple objects and experience of ‘culture’ found to be important only when people began to explore the environments for symbolic values Grahn et al. (2010); Stigsdotter et al. (2017). Although, the study by Windhorst and Williams (2015) highlighted the importance of cultural features in visitation to natural places for university students’ mental health development, the effect was not found in open spaces inside campus. The restorative potential of ‘refuge’ quality is that this dimension offer sitting in privacy (Peschardt and Stigsdotter, 2013; Stigsdotter et al., 2017). However, it seems that university students with more experiences of indoor campus settings prefer campus open spaces with visibility of views than landscapes with enclosed areas.

5. Limitations and recommendations

There are some limitations in this study, which should be considered in the future studies. The non-experimental approach in measurement of PSD and PRE might be the limitation of this study. The first reason is that it could not monitor restorative changes in the subjects’ psychological, physiological and emotional states. Second, it could not

monitor environmental changes that reflect on perception of PSDs. Further research is needed to elucidate them by an experimental approach, to obtain data from the same respondents repeatedly over time and by monitoring changes in perceiving of PSDs, in order to gain knowledge on the effect of PSDs over the changing seasons in development of better psycho-physiological and emotional conditions. A comparative study on evaluation of PSDs would be valuable to find the differences and similarities of experts as open space designers and lay-public as its users. Little knowledge of designers and non-designers' perception of these characteristics has been addressed, yet. Although restoration experience is supported by the proposed characteristics, further research should be accounted for other missing mediating variables to find more possible effects on other aspects of human health.

6. Limitations and Recommendations

This study provides an understanding of the factors that influenced perceived restoration experience. The findings can be used within landscape architecture and health development research to design green spaces with a combination of restorativeness characteristics and salutary qualities which support psychological restoration and consequently affect the whole mental health. The restorativeness characteristics and supportive salutary qualities of open spaces is not limited by geographical boundaries. Thus, it can be applied in other cases or at least environments that sharing the same population with this study. The results are expected to be the same in other educational settings in Malaysia.

7. Conclusion

As the contribution of environment qualities and perceived restorativeness for positive outcomes is required, understanding the impact of PSD and perceived restorativeness on perceived restoration experience is important. The findings on structural model supports significant relationship between constructs of PSD, PR and PRE. Moreover, the model explains half of the perceived restoration through the effect of PSD and PR. In this relationship, the greatest effect was predicted through the mediating effect of perceived restorativeness. The influential PSD variables were 'serene', 'space', 'prospect', 'rich in species' and 'nature' and PR variables were 'fascination' and 'compatibility'. Integration of these PSD and PR qualities provided restorative outcomes of 'attention restoration', 'clearing thoughts' and 'relaxation & calmness' almost equally.

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