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Research article

# Exhaustive behavioral profile assay to detect genotype differences between wild-type, inflammasome-deficient, and Nlrp12 knock-out mice

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Abstract: Technological advances in computer vision led to the development of various algorithms that are designed to analyze human and animal behavior. We have used an algorithm based on hidden Markov model to monitor the behavior of two different knock-out mice and a healthy control. The goal of this study was to detect behavioral changes in mice with single gene deletion in different inflammatory molecular pathways. Mice with elevated inflammatory activity were compared to wild-type and to mice that lack an inflammasome, a multiprotein complex that processes main inflammatory cytokines, IL-1 beta and IL-18. Importantly, there were no previous reports of any behavioral abnormalities in these mice. We used 10 days continuous recording analysis of 34 behavioral activities. Resulting data were analyzed using R programming. Within the dataset, we found a large number of statistically significant correlations and therefore used factor analysis and hierarchical clustering to reduce the dimensionality of the data that resulted in the 6 factors and 6 clusters. We found that 3 factors and 4 clusters were significantly different between three groups of mice. In conclusion, by using computerized video assessment method paired with R, we have found profound differences where differences could not have been detected by a naked eye. This method allows for fast, accurate, sensitive, and unbiased evaluating of multiparametric behavioral arrays in biomedical research.

**Keywords:** behavioral genotype differences; automated behavioral assessment; R program; supervised learning; home cage behavior; long-term continuous recording; Nlrp12 knock-out; ASC knock-out; inflammasome deficient mice

## 1. Introduction

Large body of evidence that accumulated over the last century suggests strong effect of the immune system on the behavioral outcome. Most of the observations were made studying sickness behavior. For example, bacterial infection or exposure to bacterial products such as lipopolysaccharides (LPS) result in loss of appetite, social withdrawal, decreased locomotion, etc. [1,2]. Similar effects are observed after viral infection or interferon beta treatment [3,4]. Drastic changes in behavior are among main side effects of interferon treatment for multiple sclerosis (MS). In MS studies, researchers use strong immunological activation that induces the expression and release of high concentration of potent proinflammatory molecules such as interleukin 1 beta (IL-1 $\beta$ ), tumor necrosis factor alpha (TNF $\alpha$ ), prostaglandins, etc. [2]. We hypothesized that even small deviation in composition of immune system brings about changes in central nervous system function resulting in behavioral changes. With recent technological advances in detection of multiple various behavioral characteristics provides an ideal opportunity to study how subtle changes in immune system may bring about changes in behavioral profile.

In this study, we chose to investigate basal home cage behavioral profile of mouse genetic strains with positive and negative deviations of inflammatory homeostasis. First, apoptosis-associated speck-like protein knock-out mouse strain (ASC KO) is lacking a key adapter molecule in the assembly of inflammasome [5]. As a consequence, these mice have diminished levels of IL-1 $\beta$  and IL-18, which are the major proinflammatory cytokines. These mice are resistant to several autoimmune diseases and have deficiency in responding to several pathogens. Visually these mice do not differ from wild-type (WT) controls. The only difference that was reported in the context of ASC KO mice is that these mice, with age, gain more weight compared to WT [5].

Second, Nlrp12 KO mice are lacking a molecule that inhibits nuclear factor kappa B (NF $\kappa$ B), a major proinflammatory transcription factor that promotes the expression of proinflammatory cytokines such as IL-1 $\beta$ , TNF $\alpha$ , prostaglandins, etc. [6]. NOD-like receptors (Nlrs) are among the main regulatory proteins of the immune system [7]. The Nlr family of proteins comprises 23 members in humans and 34 in mice and can regulate both the innate and adaptive immune systems. Upon pathogen recognition, these proteins can activate multiple proinflammatory molecular pathways, including formation of the inflammasome and NF $\kappa$ B and mitogen-activated protein (MAP) kinase pathways. Nlrs have been implicated in the development of autoimmune disorders; however, their function in neuroinflammation and behavior is poorly understood. The recently discovered gene, Nlrp12 is thought to play a major role in host immunity by suppressing NF $\kappa$ B activity in microglial activation and dendritic cell migration [8,9]. Similar, to young ASC KO mice, these mice were not reported to have any obvious behavioral phenotypes.

Importantly, till today, the majority of behavioral observations are made based on a specific hypothesis. A specific experimental paradigm is designed based on a research question. Otherwise, behavioral observations are purely opportunistic, which means that the researchers that work with mice make occasional observations on the behavioral abnormalities that are striking and conspicuous. In our study, we used continuous 24-hour video recording which was analyzed by a computer supervised software (Clever Sys Inc. HomeCageScan). The resulting list of behavioral activities was analyzed using R statistical programming to systematically detect behavioral differences in the multi-parametric, exhaustive behavioral assay.

# 2. Results

## 2.1. Correlation matrix

After scaling data and removing activities that were present on the list of the output results but were not detected (value of zero) during our experiments, we acquired a behavioral array of 34 activities that were exhibited by a mouse (Table 1). The results are presented in a correlation matrix as a combined dataset, which contains data from recordings of all three mouse strains (Figure 1). Correlation matrix represents correlations between individual behavioral activities over 10 days. We observed 342 positive and 146 negative correlation in the combined dataset. Some activities change in a similar manner to each other and, therefore, may form groups of "similar activities". The results above indicate that an exploratory data analysis is necessary due to the high number of statistically significant correlations. We used hierarchical clustering and factor analysis to understand how individual behavioral activities relate to each other.

Activity	Definition	Abbreviation
Awaken	Any movement from sleep that starts and continues without	awaken
	resumption of sleep	
Chew	Any brief period during eating where the mouth detaches	chew
	from the food	
Come down	Any movement of the animal from a fully reared position to	cd
	a low position	
Come down from	Any movement of the animal from a partially reared up	cd from pr
partially reared	position to a low level	
Come down to	Any movement of the animal from a fully reared up	cd to pr
partially reared	position to a partially reared up position	
Dig	Any movement with animal's hind limbs inside bedding	dig
	and resulting in a considerable movement of the bedding	
Drink	In a reared up position, animal's nose/mouth crosses water	drink
	spout calibrated line	
Eat	In a reared up position, animal's nose/mouth crosses	eat
	feeding box calibrated line	
Forage	Any movement with animal's forepaws and/or mouth inside	forage
	bedding and resulting in a considerable movement of the	
	bedding, typically in front of the animal	
Groom	Deformation of body over a defined criteria and longer than	groom
	specified time	
Hang cuddled	Any movement of the animal resulting in animal having all	hc
	four limbs at the top of the cage (more horizontal position at	
	the top of the cage)	

Table 1. The list of the detected activities by the software, definitions of these activities, and their corresponding abbreviations.

Continued on next page

Activity	Definition	Abbreviation
Hang vertically from	Any movement from a hang cuddled position to a hang	hv from hc
hang cuddled	vertical position	
Hang vertically from	Any movement of the animal resulting in animal leaving the	hv from ru
rear up	floor and not coming back down immediately and	
	remaining vertical after leaving the floor	
Jump	Any movement from a lower to a higher position and back	jump
	to the lower position	
Land vertically	Any movement of the animal from a hanging position with	land vert
	feet off of the floor to the feet coming back down on to the	
	floor	
Pause	Implemented similar to sleep with those sleep constraints,	pause
	but lasting only for much smaller prescribed minimum time	
Rear up	Any movement of the animal from a low position to a full	ru
	reared up position	
Rear up from	Any movement of the animal from a partially reared	ru from pr
partially reared	position to a fully reared up position	
Rear up partially	Any movement of the animal from low position to a	ru part
	partially reared position	
Remain hang	After hanging cuddled, remain in a hanging cuddled	remain hc
cuddled	position	
Remain hang	After hanging vertically remain in a hanging vertical	remain hv
vertically	position	
Remain partially	Remain in a partially reared position	reaming pr
reared		
Remain reared up	After rearing up, remain in the reared up position	remain ru
Repetative jumping	Any series of successive jump behaviors	repet jump
Sleep	The onset of sleep is detected at each instance there is no	sleep
	significant movement for a prescribed amount of time	
Sniff	When the animal is either fully or partially reared, and the	sniff
	tip of the mouth makes some random movements (back and	
~ .	forth, up/down, protrude/retract)	
Stationary	Any sequence for which there is no translational movement	stationary
Stretch body	Any movement from shorter to longer/elongated body	stretch body
	(horizontally or vertically)	
Twitch	Any movement of the animal from a side view to a front	turn
	view or vice versa	
Twitch	Any brief movement of the animal during sleep	twitch
Walk left	Any movement of the animal in left direction over a given	walk left
<b>XX7 11 1 1</b>	distance	11 1 1
walk right	Any movement of the animal in right direction over a given	walk right
Walls al	distance	
walk slowly	Any sideways movement of animal without a definite	walk slowly
	direction component	



Figure 1. Correlation Matrix of Behavioral Activities of ASC KO, Nlrp12 KO, and WT Mice. Correlation between time (24 hour segments) and individual activities (expressed as percentage of 24 hours). Bivariate scatter plots with a fitted line are presented on the plot in the bottom of the diagonal, with the correlation value and significance (represented by red stars) in the top of the diagonal. \*\*\* is  $p \le 0.001$ , \*\* is  $p \le 0.05$ . n = 8 per group.

### 2.2. Hierarchical clustering and dendrogram

Hierarchical clustering is a statistical approach that groups variables into clusters based on dissimilarities. To create a dendrogram, most similar clusters are grouped into new clusters of a new hierarchical order, continuing until only one cluster is left. Correlation matrix-based hierarchical clustering is one of the most widely used tools for exploratory data analysis of large datasets, such as genomic and proteomic analysis and imaging [10]. For this analysis, we used the combined dataset only (WT, ASCKO, and P12KO data) since it has the most variability. Hierarchical clustering matrix and the dendrogram of the combined dataset is presented in Figure 2. Hierarchical clustering matrix shows whether the correlation between behavioral activities is positive, negative, or neutral (represented by colour based on Pearson correlation). Drawing of vertical line across dendrogram defines the number and the content of the resulting clusters. For example, vertical line at level 1 would separate the 34 activities in two clusters. The vertical line at level 5 segregates data into 6 clusters that can be explained with our current knowledge of mice behavior. We can't explain the differences in clusters beyond this level.

In Figure 2, the first cluster consist of rearing up, hanging vertically from rearing up, sniffing, coming down from partially reared position, remaining hang vertically, hanging cuddled and vertically, rearing up from partially reared position, coming down, jumping, walking right and left, and hanging vertically from hanging cuddled activities. The second cluster consists of turning,

chewing, foraging, and digging. The third cluster consists of repetitive jumping, remaining hang cuddled, and grooming. The fourth cluster consists of sleeping and drinking. The fifth cluster consists of walking slowly, stretching body, remining reared up, and landing vertically. The sixth cluster consists of pausing, eating, stationary, twitching, awakening, rearing up partially, coming down from partially reared position, and remaining partially reared. We will be using these clusters to assess the variation in behavioral arrays between wild-type, P12 knock-out, and ASC knock-out mice.



Figure 2. Correlation Matrix-Based Hierarchical Clustering of Activities of ASC KO, Nlrp12 KO, and WT mice. Colour spectrum of the graph represents positive correlations (in red) to no correlation (in white) to negative correlation (in blue) between individual activities. Dendrogram on the left groups together activities based on their dissimilarities in a bottom-up approach. The black line that cuts through the dendrogram separates the activities into six clusters.

The variability in the data that resulted from the three experimental groups allowed us to explore the behavioral profiles of a healthy C57BL/6J, Nlrp12 knock-out, and ASC knock-out mice and divide the 34 activities into six clusters by their association to each other.

## 2.3. Factor analysis

Factor analysis allows to estimate the unobserved structure underlying the variations of observed variables and their interrelationships [11]. We performed factor analysis on the combined dataset to generate a model, which will be used to demonstrate the relationships between activities and the variations associated with the genotype. While drawing of a vertical line through the dendrogram of hierarchical clustering is based on our previous knowledge of mouse behavior, factor analysis separates the data based on statistical modeling.

To establish the number of factors, we used parallel analysis, which revealed that there are six factors and six components in the combined dataset (Figure 3). In addition, we ran the very simple structure (VSS) to verify the most appropriate number of factors, which confirmed that six factors would be the best model fit. With a loading cutoff of 0.4, we have generated six groups of activities (Figure 4). The values of the standardized value loadings range from  $\lambda = 0.874$  to  $\lambda = 0.448$ ; the mean lambda of absolute values for factor 1 is 0.637, factor 2 is 0.593, factor 3 is 0.633, factor 4 is 0.651, factor 5 is 0.811, and factor 6 is 0.661. Factor 5 is the most well-defined factor with lambda of 0.811 and factor 2 is the least well-defined factor with lambda of 0.593. Furthermore, there were no detected correlations between the latent constructs, which demonstrates that there is very little common variance between the defined factors. The model explains 65% of variance in the dataset. Most factors load uniquely onto one activity when a cutoff value of  $\lambda = 0.4$  is used. Furthermore, negative factor loadings represent negative correlation between an activity as it relates to other activities in a group (red colored arrows in Figure 4).



Parallel Analysis Scree Plots

**Figure 3. Parallel Analysis.** The scree plots were generated using *psych* package in R. Principal component (PC) and factor analysis (DA) eigen values are plotted on the *y* axis. Note that the PC simulated data and PC resampled data lines overlap. Similarly, FA simulated data and FA resampled date lines overlap as well. The cut-off black solid line runs through the elbow of FA actual data, Thus, six factors are suggested as the optimal number for this dataset.



Figure 4. Factor Analysis of the Dataset Using First Order Factor Model. Six factors were selected for the factor analysis. The above diagram represents factor loadings on behavioral activities with the corresponding  $\lambda$  values. Positive correlations with the corresponding  $\lambda$  value loading are represented in black. One negative correlation was uncovered in factor 3, turn activity has the inverse interaction with his factor. Average  $\lambda$  of absolute values is under each factor heading.

# 2.4. WT vs. Nlrp12 KO vs. ASC KO by cluster

Figure 5 presents the full comparison by cluster of the three experimental groups: ASC KO, Nlrp12 KO, and WT mice. Cluster 1 that represents, by the most part, collection of physically demanding activities showed no significant differences between the genotypes. In cluster 2, ASC KO mice spent more time on days 1 and 2 turning, chewing, foraging, and digging compared to Nlrp12 KO and WT mice. In cluster 3 the main activity is grooming, which generally takes 20% of a 24-hour period in WT animals. ASC KO mice groom, remain hang cuddled, and repetitively jump

significantly less compared to Nlrp12 KO and WT mice. Cluster 4 consists, sleeping and drinking, is performed for a significantly longer duration by ASC KO and Nlrp12 KO mice on days 5 to 10 compared to the WT controls. Cluster 5, walking slowly, stretching body, remaining reared up, and landing vertically, was performed for a significantly longer duration by ASC KO and Nlrp12 KO animals compared to the WT controls. Cluster 6 activities were exhibited for a longer duration by the WT control animals compared to the ASC KO and Nlrp12 KO mice.



Figure 5. Comparison Analysis of Clusters Between Nlrp12 KO, ASC KO, and WT mice. A) Cluster 1, there were no significant differences between the groups. B) Cluster 2, on days 1 and 2, ASC KO mice exhibited significantly different behavioral pattern compared to WT and Nlrp12 KO. C) Cluster 3, throughout the 10 day period, ASC KO mice was significantly different from WT and Nlrp12 KO. D) Cluster 4, from day 5 to day 10 WT mice exhibited behavioral pattern that was significantly different from ASC KO and Nlrp12 KO. E) Cluster 5, WT mice were significantly different from ASC KO and Nlrp12 KO for the 10 days. F) Cluster 6, WT mice were significantly different from ASC KO and Nlrp12 KO from day 1 to day 7. # WT is significantly different from ASC KO and Nlrp12 KO, \* ASC KO is significantly different from WT and Nlrp12 KO.

## 2.5. WT vs. Nlrp12 KO vs. ASC KO by factor

Figure 6 presents the comparison by factor of the three experimental groups. Activities in factor 1 that include variety of physically demanding activities and grooming were significantly

higher on days 2 and 10 in WT and Nlrp12 KO mice compared to ASC KO with a similar general trend throughout the 10-day period. Activities in factor 2 that include activities that group around eating (eat, pause, rearing, remain stationary) that were significantly lower in ASC KO and Nlrp12 KO mice compared to WT controls. Factor 3 includes, by the large part sleep associated activities such as sleep, twitch, awaken, etc., has no significant differences between the groups. The inverse relationship is seen in factor 4 (walking slowly, stretching, chew, remain rear up) where ASC KO and Nlrp12 KO mice outperform WT controls. Foraging/exploratory activities in factor 5 exhibited by the ASC KO mice are significantly higher compared to Nlrp12 KO and WT mice on days 1 to 8. Activities in factor 6 include activities that associated with drinking behavior (drink, rear up, sniff, etc.) were significantly higher in Nlrp12 KO mice on days 4 and 5 compared to ASC KO and WT mice. On day 10, both WT and Nlrp12 KO had higher performance of these activities compared to ASC KO mice.



Figure 6. Comparison analysis of factors between Nlrp12 KO, ASC KO, and WT mice. A) Factor 1, on days 2 and 10 ASC KO exhibits significantly different behavioral pattern compared to WT and Nlrp12 KO. B) Factor 2, WT is significantly different from ASC KO and Nlrp12 KO for the duration of 10 days. C) Factor 3, there were no significant differences between the groups. D) Factor 4, each group showed unique trends, while WT was significantly different from ASC KO and Nlrp12 KO. E) Factor 5, ASC KO was significantly different from WT and Nlrp12 KO. E) Factor 5, Factor 6, on days 4 and 5 Nlrp12 KO was significantly different from WT and ASC KO; and on day 10 ASC KO was significantly different from WT and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # WT is significantly different from ASC KO and Nlrp12 KO. # ASC KO is significantly different from WT and ASC KO. p < 0.01. n = 8 per genotype group.

Our study demonstrates that Nlrp12 KO and ASC KO mice have profound behavioral changes compared to WT control. These changes are not detectable by a naked eye but were revealed by the computer analysis and factor and hierarchical clustering analysis using R programming of 10 days of continuous video recordings.

Some changes in behavioral profile of ASC KO and Nlrp12 KO mice are consistent with their immune phenotype. Indeed, Nlrp12 KO and ASC KO mice spent an increased amount of time walking slowly, stretching body, remaining reared up, and chewing/landing vertically. Although, at this point, we cannot conclude that KO mice experience sickness behavior, from our unpublished observations, an increase in this array of activities is associated with sickness behavior. Similar observations were reported by another group [12].

Factor 2 and cluster 6 contain activities associated with eating, including pausing, rearing up partially, coming down from partially rearing, eating, stationary, remaining partially reared (factor 2) and the additional activities in cluster 6, including twitching and awaking. We observed that Nlrp12 KO and ASC KO spent less time on these activities compared to the WT controls. One of the sickness behavior characteristics is the tendency the eat less [1].

Digging and foraging activities are the activities performed to explore the home cage environment. ASC KO mice spent significantly more time exploring compared to the Nlrp12 KO and WT counterparts on days 1 to 8. Similarly, in cluster 2 (turn, chew, forage, and dig) there was an increase in these activities on days 1 and 2. We have not found any previous studies in the literature assessing exploration activities in the ASC KO animals. Sleeping and drinking activities were performed for longer length of time by ASC KO and Nlrp12 KO animals from day 5 to 10. Increased time spent sleeping was also linked to sickness behavior [1].

Human studies suggest that NLRP12 may play a proinflammatory role by contributing to the activation of inflammasome. This evidence comes from a cohort of Mediterranean families with mutation in NLRP12 that results in inflammatory skin lesions similar to patients with mutation in NLRP3, a well know activator of inflammasome [13]. In mice, Nlrp12 was shown to activate inflammasome only in the context of infection by *yersina pestis*, an inducer of plague [14]. A similar gene to ASC, Aim2, is inflammasome-activating, proinflammatory gene, was shown to regulate axonal growth and to shape hippocampal neurons in IL-1 beta-dependent manner. A series of short-term behavioral testing revealed a deficit in audition-triggers freezing and lower locomotor activity in Aim2 KO mice [15].

Our study suggests that the behavioral effects of Nlrp12 are, in many instances, similar to that of ASC. This is not surprising since As ASC Nlrp12 plays role in inflammasome activation. At the same time, Nlrp12 exerts strong anti-inflammatory effect by supressing NFkB pathway.

#### 4. Summary and perspective

Here we report that video recording analysis used along side factor and cluster analysis provide a sensitive method to distinguish subtle changes in behavioral traits in mice that have mutation of immune genes but are otherwise normal. Unlike acute inflammation that is associated with infection, chronic inflammation is by far more subtle. Nevertheless, far reaching consequences of chronic inflammation are no less, if not more devastating than acute one. For example, cancer, type II diabetes, cardiovascular diseases, Alzheimer's disease, and many other diseases have strong inflammatory components. Therefore, novel means to detect slowly developing basal inflammation may help improve early diagnosis and to develop better and more efficacious treatments. At this point, it is important to note that the exact mechanisms of the behavioral array changes observed in this study is not clear. Changes in behavior can't be attributed to a lack of expression of a single protein but rather to the consequences of gene deletion. Such consequences may include downstream effects and compensatory mechanisms to the gene deletion.

## 5. Materials and methods

## 5.1. Mice

All experiments were approved by the animal ethics committee of the University of Sherbrooke. Eight male C57Bl/6J mice (WT) were purchased from The Jackson Laboratory (Bar Harbor, ME). They were acclimatized for 4 weeks before the beginning of the experiments [16]. Eight Nlrp12 knock-out (Nlrp12 KO) and eight ASC knock-out (ASC KO) male mice were bred at the University of Sherbrooke Animal Facility. Before experimentation, all mice were housed in groups of four. Mice were maintained in a sterile environment with a photoperiod of 14 hours of light (lights on at 6 am) and 10 hours of dark (lights off at 8 pm). Animals used in the experiments were 11 weeks old at day 0, housed in standard plastic cages with water and food ad libitum. Mice were separated one mouse per cage for the video recording for a duration of 10 days.

## 5.2. Video recording set up

Video recording devices (Swann Pro Series HD 720P) were placed perpendicularly to the clear home cages. The cages were surrounded by three white walls to facilitate the detection of movements and to shut out any stimulus from the surroundings. Each mouse was housed individually and was visible to the camera at all times. The feeding area was located on the opposite side of the cage from the drinking spout to ensure the accuracy of detection of these activities. The cameras were connected to a Swann 8 Channel HD Digital Video Recorder. The videos were recorded in AVI format in 1-hour segments and converted to MP4 format using Any Video Converter version 6.0.7.0. After the conversion, the hour-long videos were combined into 24-hour segments from 13:00–13:00 using Avidemux 2.6 (32-bit). The resulting video was analyzed using the HomeCageScan (HCS) software from CleverSys Inc.

# 5.3. Accuracy of the software

The settings of the software were tested by comparing HCS results with the results of three independent observers using one-minute video segments at four different time points (2 in dark cycle; 2 in light cycle). The results from the manual detection were compared with the results from the HCS software and resulted in over 90% of concordance. Two new backgrounds for dark and light cycle were created for each 24-hour segment.

## 5.4. Data analysis

The HCS software analyzed the footage from the recordings. HCS is based on supervised learning [17]. Data of mice' activities were expressed as the percentage of time out of 24 hours. R programming was used for factor analysis, hierarchical clustering, parallel analysis, very simple structure (VSS), and the one- and two-way ANOVA tests to find correlations between behavioral activities and to uncover factor loadings, to cluster together activities based on their dissimilarity, to find significant differences between genotypes in the established factors and clusters. The *p*-value was set at 0.01 for all statistical tests.

# 5.5. R and statistical significance

Correlation matrix was generated based on Pearson parametric correlation test. Hierarchical clustering matrix was computed using Euclidian distance and complete linkage method, generating a dendrogram based on dissimilarities between clusters. For the factor analysis, we used ordinary least squares technique with varimax data rotation to define the factor loadings. Statistical testing for model fit for factor analysis was conducted using the root mean square of the residuals (RMSR)  $\leq 0.07$  and Tucker Lewis Index of factoring reliability (TLI)  $\geq 0.95$  [18]. Best model was selected using VSS with RMSR  $\leq 0.07$ , TLI  $\geq 0.95$ , and Bayesian Information Criterion (BIC). Oneway ANOVA followed by Tukey Honest Significant Difference (HSD) was used for within cluster/factor comparisons throughout 10-day period. Two-way ANOVA by Tukey HSD was used for comparisons between clusters/factors. The following R packages were used for analysis, statistics, and figures: *Xlsx, PerformanceAnalytics, dplyr, reshape2, ggplot2, Rmisc, devtools, corrplot, nFactorspsych* [19], and *GPArotation*.

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