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Title: Use of the Concordance Correlation Coefficient when Examining Agreement in Dyadic Research

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Abstract: Abstract

Background:

The statistical measure used to quantify the degree of agreement or congruence between two research subjects has been the intraclass or the Pearson correlation coefficient; however, the concordance correlation coefficient (CCC) is another measure of agreement that examines agreement between two observers or raters.

Objectives:

The purpose of this article is to (i) highlight the differences among three statistical measures used to quantify the degree of agreement or congruence, (ii) demonstrate the use of the CCC in examining agreement between heart failure (HF) patients and their family members, and (iii) provide nurse researchers another method for evaluating agreement.

#### Method:

Symptom evaluation scores obtained from HF patients and their family members were used in the analysis of this study. In order to explain the use of the CCC in this analysis, a distinction between Pearson correlation coefficient (PCC) and ICC is discussed. The CCC calculation is then described in detail.

#### Results:

The HF patients in this sample were  $71 \pm 9.6$  years in age and 40% male, and 41.4% African American. The majority of family members were female (75%). There were several different categories of family members, however most were spouses. The CCC results indicated that no symptom achieved good agreement and 8 of 14 symptoms were in moderate agreement ( $0.4 \leq \text{CCC} \leq 0.7$ ) within the dyads. Of the six symptoms with poor agreement ( $0 \leq \text{CCC} < 0.4$ ), HF patients and their FM's agreed least on worsening cough (CCC: 0.152, 95% CI(-.134, .413)) and bloated abdomen (CCC: 0.055, 95% CI(-.224, .325)).

#### Discussion:

Applying the CCC to dyadic data from HF patients and FM's, identified symptoms in which the patient and family member had the most and least agreement. The six symptoms with poor agreement were symptoms that can show HF decline and may be important when examining future nursing interventions. The CCC offered more detail such as providing a confidence interval along with the correlation. Further study using the CCC with dyadic data along with other family factors that influence agreement is needed.

#### Key words:

Correlations, Dyads, Agreement

November 13, 2008

Molly C. Dougherty, PhD, RN, FAAN

Editor, Nursing Research

Dear Dr. Dougherty,

Attached you will find our manuscript, Use of the Concordance Correlation Coefficient when Examining Agreement in Dyadic Research, which describes a correlation measurement that has not been widely used in nursing research.

Information presented may help guide future researchers when determining the type of analysis to use when the interest involves congruence (or agreement) between two subjects.

This is being submitted for the Methodology section of your journal. Information in this manuscript has not been published or used previously. The authors (Christina Quinn, Michael Haber, and Yi Pan) have no conflict of interest to report and have followed ethical guidelines in preparation of this manuscript.

Thank you and please notify me with any concerns or questions.

Sincerely,

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Use of the Concordance Correlation Coefficient when Examining Agreement in  
Dyadic Research

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Abstract

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Objectives: The purpose of this article is to (i) highlight the differences among three statistical measures used to quantify the degree of agreement or congruence, (ii) demonstrate the use of the CCC in examining agreement between heart failure (HF) patients and their family members, and (iii) provide nurse researchers another method for evaluating agreement.

Method: Symptom evaluation scores obtained from HF patients and their family members were used in the analysis of this study. In order to explain the use of the CCC in this analysis, a distinction between Pearson correlation coefficient (PCC) and ICC is discussed. The CCC calculation is then described in detail.

Results: The HF patients in this sample were  $71 \pm 9.6$  years in age and 40% male, and 41.4% African American. The majority of family members were female (75%). There were several different categories of family members, however most were spouses. The CCC results indicated that no symptom achieved good agreement and 8 of 14 symptoms were in moderate agreement ( $0.4 \leq CCC \leq 0.7$ ) within the dyads. Of the six symptoms with poor agreement (0

1  $\leq \text{CCC} < 0.4$ ), HF patients and their FM's agreed least on worsening cough  
2 (CCC: 0.152, 95% CI(-.134, .413)) and bloated abdomen (CCC: 0.055, 95% CI(-  
3 .224, .325)).

4 Discussion: Applying the CCC to dyadic data from HF patients and FM's,  
5 identified symptoms in which the patient and family member had the most and  
6 least agreement. The six symptoms with poor agreement were symptoms that  
7 can show HF decline and may be important when examining future nursing  
8 interventions. The CCC offered more detail such as providing a confidence  
9 interval along with the correlation. Further study using the CCC with dyadic  
10 data along with other family factors that influence agreement is needed.

11 Key words: Correlations, Dyads, Agreement

12

1 Background/Introduction

2

3         Examining congruence or agreement between patient and family member  
4 ratings of some aspect of health have increased in frequency in studies of  
5 patients with different chronic disease states. Early studies of agreement with  
6 oncology patients focused on understanding how family caregivers' interpreted  
7 symptom distress as compared to the patients' own perception of the same  
8 symptoms (Lobchuk, Kristjanson, Degner, Blood, & Sloan, 1997; O'Brien &  
9 Francis, 1988). Cancer pain management and the congruence between patient  
10 and family member have also been studied in depth (Lin, 2001; McMillan &  
11 Moody, 2003; Riley-Doucet, 2005). Recently, congruence of depressive  
12 symptoms between persons with stroke and their caregivers has been studied  
13 (Klinedinst, Clark, Blanton, & Wolf, 2007). Other recent examples of interest in  
14 dyadic congruence can be found in the cardiology literature with a study  
15 examining if patient and spouse's perceptions of myocardial infarction predict  
16 recovery (Figueiras & Weinman, 2003) and, a study on heart failure symptom  
17 congruence between patient and family member (Quinn, 2007).

18         In most of these studies, the statistical measure used to quantify the  
19 degree of agreement or congruence between two research subjects has been the  
20 intraclass correlation (ICC) or the Pearson's R correlation. In addition to the  
21 ICC, some studies use mean directional difference scores between patient and  
22 family member and analyze this with a paired t-test (McPherson, Wilson,  
23 Lobchuk, & Brajtman, 2008).



1 failure patients. Data were collected from 70 dyads all receiving home health  
2 care. The study was approved by the University institutional review board (IRB)  
3 and permission was attained from the respective home health agencies.  
4 Informed consent was obtained from both patient and family member prior to  
5 any data collection.

6 The Heart Failure Symptom Survey (HFSS) was used as the primary  
7 measurement tool for symptom assessment. This tool consists of 14 symptoms  
8 common to HF such as: shortness of breath with activity; fatigue; extremity  
9 swelling; depression; and others (Pozehl, Duncan, & Hertzog, 2006). Each  
10 symptom is assessed using an eleven-point scale with scores ranging from 0-  
11 10. A score of zero indicates that the person did not experience the symptom;  
12 with 10 indicating very severe or frequent. A mean of two of the items  
13 (frequency and severity) for each symptom is computed to provide a mean  
14 symptom evaluation score for each symptom. Dyads completed measures of  
15 perceived frequency and severity of these HF symptoms experienced by the  
16 patient over a seven-day period. During the data collection process, the dyad  
17 completed the instruments without collaborating or discussing responses.

18

19

## Methodology

### Data analysis

21 The CCC analysis was computed using a SAS (SAS Institute, Cary, NC)  
22 macro that is available at the Rollins School of Public Health at Emory

1 University's web site: <http://www.sph.emory.edu/observeragreement/>. The  
2 CCC computation is also described in detail using two biomedical examples  
3 published by Crawford et al. (Crawford, Kosinski, Lin, Williamson, & Barnhart,  
4 2007).

5 Symptom evaluation scores for each dyad were used in the estimation of  
6 the CCC in this study. In order to explain the use of the CCC in analysis, a  
7 distinction between Pearson correlation coefficient (PCC), the ICC and the CCC  
8 will be presented.

9 Agreement between two observers is usually evaluated via the PCC or an  
10 ICC. Let's denote the observations made on subjects  $i$  by observer 1 and 2 as  
11  $X_i$  and  $Y_i$ , respectively. Then the PCC is defined as:

$$12 \quad PCC = \frac{\sum_i (X_i - \bar{X})(Y_i - \bar{Y})}{\sqrt{\sum_i (X_i - \bar{X})^2 \sum_i (Y_i - \bar{Y})^2}},$$

13 where  $\bar{X}$  and  $\bar{Y}$  are the sample means. The PCC is designed to detect any  
14 linear association between the observers' readings. Thus, if the readings  
15 satisfy:

$$16 \quad Y_i = a + b \cdot X_i$$

17 for *any* constants  $a$  and  $b$  then the PCC will attain the value 1. The  
18 observations in Example 1 (Table 1 and Figure 1) satisfy this equation with  
19  $a = 1$  and  $b = 2$ .

20 Intraclass Correlation Coefficients (ICC's) are usually defined in the  
21 context of an analysis of variance (ANOVA) model. This model expresses the

1 total variance as a sum of three components: the between-subject variance,  $\sigma_S^2$ ,  
 2 the between-observers variance,  $\sigma_O^2$ , and the error (residual) variance,  $\sigma_E^2$ .  
 3 Using the terminology and notation of McGraw and Wong (McGraw & Wong,  
 4 1996), there are at least two types of ICC's: the ICC for consistency, ICC(C,1),  
 5 and the ICC for agreement, ICC(A,1), which are defined as follows:

$$6 \quad \text{ICC(C,1)} = \frac{\sigma_S^2}{\sigma_S^2 + \sigma_E^2},$$

$$7 \quad \text{ICC(A,1)} = \frac{\sigma_S^2}{\sigma_S^2 + \sigma_O^2 + \sigma_E^2}.$$

8 The ICC(C,1) is designed to detect a linear association of the type given in  
 9 equation (1) with  $b = 1$ . In other words, this coefficient attains the value 1  
 10 whenever there is a fixed difference between  $X$  and  $Y$ . Example 2 (Table 1 and  
 11 Figure 1) presents data of this kind with  $a = 3$ .

12 ICC(A,1) will attain the value 1 only if the linear association (equation (1))  
 13 between the observers is such that  $a = 0$  and  $b = 1$ , i.e., only if  $X_i = Y_i$  for every  
 14 subject  $i$ . Example 3 in Table 1 and figure 1 illustrates this situation: (see  
 15 Table1 and Figure 1).

16 In 1989 Lin (Lin, 1989) introduced the CCC as a measure of agreement.  
 17 This coefficient is based on comparing the mean squared difference between  
 18 the reading of the observers,  $(X - Y)^2$ , to its expected value in the case where  
 19 the observers are independent of each other. The CCC is not based upon an  
 20 ANOVA model, and it can be estimated directly from the means and variances  
 21 of the joint distribution of  $X$  and  $Y$ :

1 
$$CCC = \frac{2 \cdot S_{XY}}{(\bar{X} - \bar{Y})^2 + S_X^2 + S_Y^2}$$

2 where  $S_X^2$  and  $S_Y^2$  are the sample variances and  $S_{XY}$  is the sample covariance.  
3 Barnhart et al. (Barnhart, Haber, & Song, 2002) showed that if the  
4 assumptions of the above-mentioned ANOVA model are satisfied then the CCC  
5 coincides with the agreement ICC. Since the CCC is easier to calculate and it  
6 does not require the ANOVA assumptions, we will now refer to ICC(A,1) as the  
7 CCC.

8         So far we introduced three coefficients for evaluating inter-observer  
9 agreement: PCC, ICC-C and CCC. In order to decide which of the coefficients  
10 should be used in a specific case, one must first realize that the three  
11 coefficients measure different kinds of agreement. The PCC is a measure of  
12 *linear agreement*, where the points  $(X_i, Y_i)$  just need to be close to a straight  
13 line as in Example 1. There is no requirement that the differences  $X_i - Y_i$  will  
14 be small or fixed across subjects. The ICC-C is a measure of *additive*  
15 *agreement*, hence it indicates the extent to which the differences  $X_i - Y_i$  are  
16 fixed across subjects, but there is no requirement that this fixed difference will  
17 be small (Example 2). The CCC measures *absolute agreement*, i.e., it requires  
18 the differences  $X_i - Y_i$  to be small (Example 3). These concepts of linear,  
19 additive and absolute agreement are special cases of *relational agreement*  
20 (Fagot, 1993). The choice of the appropriate coefficient depends on the type of  
21 agreement that one wants to assess. In most cases one wants to check

1 whether the observed values,  $X_i$  and  $Y_i$  are close to each other for all (or most)  
2 subjects. In this case the coefficient of absolute agreement, i.e., the CCC, is  
3 the one that should be used. However, there are situations where one only  
4 wants to check whether the observations  $(X_i, Y_i)$  follow a certain pattern. If one  
5 only wants to know whether X and Y usually vary in the same direction, i.e.  
6 small X's go with small Y's and large X's go with large Y's, then the coefficient  
7 of linear agreement, i.e., the PCC, is an appropriate measure of agreement. In  
8 fact one may argue that correlation is a special case of observer agreement  
9 where the observers are not penalized if their readings are different as long as  
10 the reading of one of them is a linear function of those of the other observer, as  
11 in Example 1. Similarly, the coefficient of additive agreement, ICC-C, is an  
12 acceptable measure of observer agreement if observers' readings are allowed to  
13 differ by a fixed (though maybe large) value.

14 In the current example we are interested in the actual differences  
15 between the symptom severity scores assigned by the patient and the family  
16 member. In other words, we are interested in *absolute* agreement, and  
17 therefore we use the concordance correlation coefficient (CCC).

## 18 Results

19 The heart failure (HF) patients in this sample of 70 dyads were  $71 \pm 9.6$   
20 years in age, 40% male, 44.3% married, and 41.4% African American and  
21 57.1% Caucasian. The majority of family members were female (75%) and  
22 younger than the patient ( $57 \pm 15$  years). There were several different categories

1 of family members, however most were spouses. Table 2 summarizes the  
2 demographic variables of interest in this study.

3 Agreement between HF patients and their FM's was assessed using the  
4 CCC as well as its 95% confidence interval (Table 3). Within the entire 14  
5 symptoms, no symptom achieved good agreement; however, HF patients and  
6 their FM's experienced moderate agreement on 8 symptoms within the dyads.  
7 The symptom with highest agreement was extremity swelling (CCC= .620, 95%  
8 CI(.406 - .767). Of the six symptoms with poor agreement, HF patients and  
9 their FM agreed least on worsening cough (CCC= .152, 95% CI(-.134 - .413)  
10 and bloated abdomen (CCC= .055, 95% CI(-.224 - .325).

## 11 Discussion

12 Agreement between observers when examining symptoms of a disease  
13 process can be assessed using several methods. The purpose of this article has  
14 been to demonstrate the use of the CCC in examining agreement between HF  
15 patients and their FM when asked to rate the same symptoms in a specified  
16 time frame. Although other methods such as PCC and ICC are frequently used,  
17 this article has illuminated an alternative method for assessing agreement.  
18 Advantages of the CCC are the ability to categorize (good, moderate, and poor)  
19 agreement based on CCC obtained and the ability to examine a confidence  
20 interval (CI). From a statistical perspective, a limitation of the CCC is its  
21 dependence on the variability between subjects (Atkinson G. & Nevill, 1997).  
22 For example, the CCC will attain a much higher value if it is calculated from a

1 group of patients that include less severe and more severe cases than if it was  
2 calculated from a group of very severe cases only. This will happen regardless  
3 of the magnitude of the differences between scores assigned by the observers to  
4 the same patient. In other words, one has to be very careful when comparing  
5 values of the CCC obtained from different studies, or even from the same study  
6 conducted by the same observers at different locations. Recently, Haber and  
7 Barnhart (Haber & Barnhart, 2008) introduced a new family of coefficients of  
8 agreement that do not share this limitation. However, these new *coefficients of*  
9 *individual agreement* require that each observer makes at least two readings on  
10 each study subject.

11 After obtaining the CCC, other statistical measures should be used to  
12 examining agreement in more detail. A graphical approach that can be used to  
13 explore the data is by the Bland-Altman method (Bland & Altman, 1986). This  
14 is a useful tool for plotting data between two observers. Graphics add a visual  
15 component to the analysis of agreement.

16 Applying the CCC to dyadic data from HF patients and their FM,  
17 identified symptoms in which the patient and FM had the most and least  
18 agreement. The six symptoms with poor agreement were symptoms that can  
19 show HF decline: fatigue, shortness of breath (SOB) at rest, SOB when lying in  
20 bed, SOB waking up at night, worsening cough, and bloated abdomen.  
21 Analysis of these data with Spearman Rho resulted in five of these same  
22 symptoms having poor agreement (Quinn, Dunbar, & Higgins, 2008). Thus, the

- 1 CCC offered more detail and refinement to this HF symptom data. Further
- 2 study is required to examine the usefulness of the CCC with dyadic data and
- 3 other factors that influence agreement such as family functioning,
- 4 communication, and family support.

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Table 1

*Three examples of readings  $(X_i, Y_i)$  of two observers on four subjects*

	Example 1		Example 2		Example 3	
Subject ( $i$ )	$X_i$	$Y_i$	$X_i$	$Y_i$	$X_i$	$Y_i$
1	1.0	4.0	1.0	5.0	1.0	1.0
2	2.0	6.0	2.0	6.0	2.0	2.0
3	3.0	8.0	3.0	7.0	3.0	3.0
4	4.0	10.0	4.0	8.0	4.0	4.0
PCC	1.00		1.00		1.00	
ICC (C,1)	0.80		1.00		1.00	
CCC	0.67		0.72		1.00	

Table 2

*Demographic Variables: heart failure patients and family caregivers*

	Patient	Family Member
Age	71 ± 9.6 years	56.7 ± 15 years
Gender	40% male 60% female	25% male 75% female
Ethnicity	41.4% African American 57% Caucasian 1.4% Asian	Same as patient
Marital Status	44.3% Married 7.1% Single 48.6% Widowed/Divorced	60% Married 40% Single
Relationship of family member to patient		43% Spouse 32% Adult Children 5% Adult Sibling 20% Other

N= 70 dyads

Table 3

*Heart Failure Symptom Survey:**Concordance Correlation Coefficient (CCC) with 95% Confidence Interval*

Symptom	Moderate Agreement	Poor Agreement
Extremity Swelling	.620 (.406 - .767)	
Forgetfulness	.488 (.243 - .674)	
Dizziness	.480 (.233 - .668)	
Irregular Heart Beat	.455 (.208 - .648)	
SOB with Activity	.446 (.192 - .644)	
Chest Pressure	.443 (.187 - .641)	
Difficulty Sleeping	.414 (.154 - .620)	
Depressed	.404 (.151 - .609)	
Fatigue		.398 (.137 - .608)
SOB at rest		.391 (.127 - .603)
SOB lying down		.330 (.056 - .557)
SOB wakeup at night		.305 (.037 - .533)
Worsening Cough		.152 (-.134 - .413)
Bloated Abdomen		.055 (-.224 - .325)

SOB=shortness of breath

Figure 1

Three examples of readings  $(X_i, Y_i)$  of two observers on four subjects

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