

## Canonical Correlation Analysis for Estimation of Relationships Between Some Characteristics and Color of Broiler Meat

Lutfi Bayyurt<sup>1</sup>, Ahmet Akdag<sup>1</sup>, Cem Tirink<sup>1\*</sup>

(Ondokuz Mayıs University, Faculty of Agriculture, Department of Animal Science, Samsun/Turkey)  
Corresponding Author: Cem Tirink

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**Abstract:** In this study, canonical correlation analysis (CCA) was applied to estimate the relationships between two sets ( $X - Y$ , water holding capacity (WHC) and pH-lightness ( $L^*$ ), redness ( $a^*$ ), yellowness ( $b^*$ ) values, respectively). Canonical correlation analysis was applied to data obtained from thigh and breast meats of 30 male Ross 308 broilers. Two canonical variable pairs were constituted as  $U$  and  $W$ . The first canonical correlation between  $U$  and  $W$  canonical variable pairs ( $U_1W_1$ ) was found 0.481( $p=0.020$ ), while the second canonical correlation ( $U_2W_2$ ) was 0.108( $p=0.722$ ). According to results of this analysis, relationship between the two canonical variable pairs was determined as 48.1%. In conclusion, the decrease of pH caused to increase in  $W_1$  and as a result of this  $b^*$  value increased. So, the reduction of WHC and pH caused to decrease in  $L^*$  and  $a^*$  values and increase of  $b^*$  value.

**Keywords:** Canonical correlation, canonical variable, meat quality, water-holding capacity, meat color

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### I. Introduction

Broiler meat is mostly preferred with the reasons like low fat-high protein content, rich vitamin and mineral content, easy preparing, usability in a wide variety of dishes and being cheaper than red meat [1]. Poultry meat is delicious, easy to digest and have nutrients to meet the daily requirements for human [2]. However, increased level of prosperity and consciousness to healthy nutrition leads to an increase in more attentive consumers with quality demands.

The quality of poultry meat is a complex issue that may be evaluated from various standpoints. Carcass yields, appropriate carcass scores, good aesthetics, sensory and nutritional parameters are all desirable traits from a consumer and marketing perspective [3]. Pale, soft and exudative meat (PSE) is an increasing problem in the poultry industry. Properties of PSE meat are low water-holding capacity (WHC), paleness and soft gel formation [4,5]. This imperfect meat is the result of postmortem metabolism resulting in a sudden pH decline while meat temperature is still relatively high [6]. Meat color including lightness, redness, and yellowness values,  $L^*$ ,  $a^*$ , and  $b^*$ , respectively, is another important characteristic affecting the consumer preference. The  $L^*$  value of the broiler meat is closely related to total antioxidant capacity due to the relationship between meat brightness and phospholipase  $A_2$  activity, which oxidases the phospholipids in meat [7,8]. Meat color, WHC and pH can be influenced by environmental factors such as temperature prior to slaughter [9]. Feed formulation manipulations, access to outdoor and breed are the other factors affecting the meat color and WHC.

Researchers still care about the WHC, pH and meat color parameters while exploring the effects of different supplements on performance, health or another feature of broilers. Measuring  $L^*$ ,  $a^*$  and  $b^*$  values needs a high technology equipment called color-meter, calculating WHC is a time consuming, long-period process by centrifuging. In this study, it was aimed to determine the relationships among pH, WHC,  $L^*$ ,  $a^*$  and  $b^*$  values of broiler meats by using canonical correlation analysis. Therefore, it may be possible to evaluate some of the relations as an indicator of meat quality and prevent time loss and create an easier method to compare and discuss about the broiler meat quality.

### II. Material and Methods

All procedures for animal handling and sample collection were applied according to the advices of the company, producing the genotypes.

Experimental diet was a typical corn-soybean based, which was formulated to meet all nutrient requirements reported in the Ross rearing guidelines [10] and any performance enhancers were not used. A total of 30 male birds were fed 42 days in 2 periods (Starter 0-21, Finisher 22-42). Breast and thighs of the birds were collected during the slaughter. The breast and thighs were separated with their skin on. The color values of breast and thighs were determined according to the CIELAB method using Minolta CR-400 (USA) colorimeter

apparatus. Lightness, redness, and yellowness values,  $L^*$ ,  $a^*$  and  $b^*$ , respectively, were represented according to this method. Water-holding capacity was calculated by the centrifuging method [11].

The canonical correlation analysis is a method used to reveal the correlations between the two data sets ( $X$  and  $Y$ ), which contain  $p > 1$ ,  $q > 1$  number. Canonical correlation analysis is a multivariate method evaluating the relationship between sets through linear components. In the canonical correlation analysis, the magnitude of the relationship between the  $X$  data matrix, which contains the  $p$ -variable, and the data matrix  $Y$  which contains a number of factors, are found. In order to determine the direction and importance of the relationship, the correlation between the canonical variables which are the linear components of the  $X$  and  $Y$  matrices and the correlation between these two variables are calculated.

In canonical correlation analysis we want to maximize correlations between objects that are represented with two data sets. These data sets are;

$$(X' = [X_1 X_2 \dots X]) \text{ and } (Y' = [Y_1 Y_2 \dots Y])$$

dimensions of  $X$  and  $Y$  is  $m \times p$  and  $m \times q$ , respectively. The canonical variables were obtained from the  $X$  and  $Y$  variable data sets,  $U_i$  and  $W_i$ , respectively.

$$U_i = a_i' X, W_i = b_i' Y$$

Canonical correlation between  $U$  and  $W$  canonical variables, we can obtain,

$$\sigma_{U_i}^2 = \alpha_i' \sum_{XX} \alpha_i, \sigma_{W_i}^2 = b_i' \sum_{YY} b_i, \sigma_{U_i W_i}^2 = \alpha_i' \sum_{XY} b_i$$

and

$$Corr = \frac{\alpha_i' \sum_{XY} b_i}{\sqrt{\alpha_i' \sum_{XX} \alpha_i} \sqrt{b_i' \sum_{YY} b_i}} \quad (1)$$

To maximize correlation between  $U$  and  $W$  canonical variables  $a$  and  $b$  the coefficient of correlation where the coefficients are maximum must be calculated. The maximum correlation is possible between the  $U$  and  $W$  canonical variable pairs with unit variance as shown in eq. 2

$$\sigma_{U_i}^2 = \alpha_i' \sum_{XX} \alpha_i = 1 \sigma_{W_i}^2 = b_i' \sum_{YY} b_i = 1 \quad (2)$$

Let the maximization problem of eq. 1 write in a Lagrangian form (eq. 2), Lagrange function for  $U$  and  $W$  variables,

$$L = \alpha_i' \sum_{XY} b_i - \frac{1}{2} \lambda_X (\alpha_i' \sum_{XX} \alpha_i - 1) - \frac{1}{2} \lambda_Y (b_i' \sum_{YY} b_i - 1) \quad (3)$$

To maximize the eq. (3), after taking derivatives  $L$  function with respect to  $a$  and  $b$  with the constraint  $\lambda_X = \lambda_Y = \lambda$  given eq. (2) and (3). So, canonical correlations are calculated from the maximum one to minimum one ( $\lambda_1 \geq \lambda_2 \geq \dots \geq \lambda_p$ ). [12, 13, 14, 15].

The null and alternative hypotheses for assessing the statistical significance of the canonical correlation

$$H_0 = p_1 = p_2 = \dots = p_p$$

$$H_0 = p_i \neq 0 \text{ at least one } i=1, 2, \dots, p$$

Bartlett test is common used to determine the statistical significance of canonical correlation [16].

$$\chi^2 = -[n - 1 - (p + q + 1)/2] \ln \left[ \prod_{i=1}^p (1 - r_i^2) \right]$$

which is approximately distributed  $\chi^2$  as with  $p \cdot q$  degrees of freedom. We reject if  $H_0: \chi^2 \geq \chi_{\alpha}^2$ . Where,  $n$ : the number of cases,  $\ln$ : the natural logarithm function,  $p$ : the number of variables in  $X$  set,  $q$ : the number of variables in  $Y$  set,  $r_i^2$ : the squared canonical correlations [17].

### III. Results and Discussion

The descriptive statistics for examined traits are showed in Table 1. All the computational work was provided to study the relationships between two data sets of the traits by means of SPSS 21 statistical package. Pearson correlation coefficients for traits are showed Table 2. The highest correlation was predicted between  $b^*$  and  $a^*$  (0.568,  $p < 0.001$ ), while the lowest correlation was between a value and pH (-0.009,  $p = 0.947$ ). There was positive relationship between WHC and  $L^*$  value (0.303,  $p = 0.020$ ), while there was negative relationship between WHC and  $a^*$  value (-0.129,  $p = 0.330$ ).

**Table 1.** Descriptive statistics for studied traits

Parameters	Mean	Std. Dev.	Min.	Max.
WHC	58.6947	4.3486	48.96	69.49
pH	6.3846	0.1735	6.05	6.77
$L^*$	70.8571	3.9851	62.92	77.93
$a^*$	2.9964	0.3380	-0.9	11.17
$b^*$	7.6163	3.4575	1.81	16.90

**Table 2.** Pearson correlation coefficient for traits in two sets

	WHC	pH	$L^*$	$a^*$	$b^*$
WHC	1				
pH	0.284*	1			
$L^*$	0.303*	0.352**	1		
$a^*$	-0.129	-0.009	-0.067	1	
$b^*$	-0.212	-0.169	-0.010	0.568**	1

WHC: Water-holding capacity,  $L^*$ : Lightness,  $a^*$ : Redness,  $b^*$ : Yellowness, \*:  $P < 0.05$ ; \*\*:  $P < 0.01$ .

However, some researchers have reported the relationship among broiler meat  $L^*$  value and pH and meat quality, low pH or high  $L^*$  value was reported to be associated low WHC [18, 19]. Low or high  $L^*$  values cause a decrease in WHC [20]. There is a positive relationship between pH and  $a^*$  value of broiler meat, while there was a negative relationship among pH and  $L^*$ ,  $b^*$  values [18, 21, 22, 19].

It was found that early content of products was also proportional with water holding capacity and high fat products had lower water holding capacity [23]. This situation means higher water holding capacity is related with low fat and high pH. [24] have reported that PSE meats contained more protein and less fat than normal meats. Pale, soft and exudative (PSE) meat is a meat quality problem that affects important meat physical characteristics, such as WHC and pH [25].

In this study, X and Y variable sets have  $p = 3$  and  $q = 2$  variables, respectively. Hence, two canonical variable or variate pairs ( $U_i, W_i$ ) can be potentially ensured and canonical correlations between pairs were calculated by using eq. (1). These canonical correlations are presented in Table 3.

As seen in Table 3, the first canonical correlation between  $U$  and  $W$  canonical variate pairs was found statistically significant ( $P < 0.05$ ). Therefore, only the first pair canonical variate was considered in the next calculations. By the first canonical variate pairs ( $U_1, W_1$ ), the canonical correlation is found 48.1% ( $r_{U_1, W_1} = 0.481$ ). This result noticed that study of the relationships between (WHC, pH) and meat color traits in broilers by using first canonical variates ( $U_1, W_1$ ) will be equal to original variables. So, 23.13 ( $r^2_{U_1, W_1} = (0.481)^2$ ) this percent of the variation will be expressed by only  $U_1 - W_1$  canonical pairs.

**Table 3.** Canonical correlation coefficients

Canonical					
Variables	Correlations	P value	Wilk's Lambda	DF	Chi-SQ
$U_1, W_1$	0.481	0.020	0.760	6	15.090
$U_2, W_2$	0.108	0.722	0.988	2	0.651

The standardized canonical coefficients are observed in Table 3. In canonical correlation analysis, standardized canonical coefficients indicate the alteration in canonical variable with regard to their standard deviation when original variable changes one standard deviation [15]. Indeed, these coefficients indicate the effect of original variables on the canonical variates. These coefficients and variable-variate correlations or canonical loadings were showed in Table 4.

According to  $U_1$  canonical variate,  $L^*$  (-0.865) had the highest negative coefficient and  $b^*$  (0.618) had the highest positive coefficient in X data set in eq.6. For the  $W_1$  canonical variate, pH (-0.688) had the highest coefficient in Y data set in eq.7. If there is multicollinearity in the data and the sample size is small, the standardized canonical coefficients may be unstable. In such cases, the use of loading and structural correlation has been proposed [26]. So, loadings for first canonical variates were showed in Table 4.

**Table 4.** Standardized canonical coefficients and canonical loadings for the first canonical variate pairs

Parameters	Standardized Canonical Coefficients	Variable - Variate Correlations	
		$U_1$	$W_1$
WHC	-0.556	-0.751	-0.660
pH	-0.688	-0.846	0.533
$L^*$	-0.865	-0.855	0.079
$a^*$	-0.247	0.162	0.987
$b^*$	0.618	0.487	0.505

The  $U_1$  and  $W_1$  canonical variate pairs are expressed as standardized canonical coefficients in the eq.6 and eq.7.

$$U_1 = -0.865L - 0.247a + 0.618b \quad (6)$$

$$W_1 = -0.556WHC - 0.688pH \quad (7)$$

All loadings in  $X$  set, except  $b^*$ , were found negatively correlated with  $U_1$  and  $W_1$ . On the other hand all loadings in  $Y$  set were found negatively correlated with  $U_1$  and  $W_1$ . In spite of canonical coefficient of  $a^*$  was positive, canonical load of this variable was found positive in Table 4. When the original variables loadings in  $X$  set are examined,  $L^*$  value had the negative and highest value with (-0.855) and this followed by  $b^*$  value with 0.487,  $a^*$  value with (0.162). Besides, in  $Y$  set, WHC was highly and negative correlated with (-0.660)  $W_1$  canonical variate while the pH was found (0.533).

To get high value for  $U_1$ , all parameters, except  $L^*$  value should be high value. Likewise, in order to get high value for  $W_1$ , WHC should be low values.

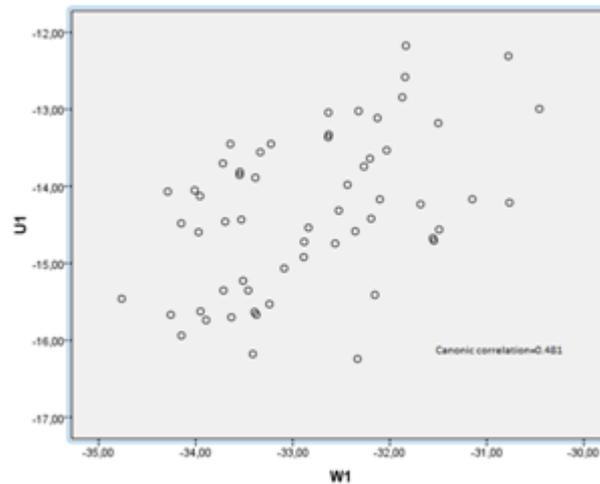


Figure. 1. Scatter plot of canonical variates  $U_1$  and  $W_1$ .

#### IV. Conclusion

Canonical correlation analysis was used for definition the relationships between (WHC, pH) and color traits. According to results of analysis, relationship between the two set has been found as 48.1% in fig. 1.

Hence, it can be expected that when WHC and pH traits have high values, color traits also will be high. The  $U_1$  will be increased when  $W_1$  increased because the canonical coefficient between  $U_1$  and  $W_1$  canonical variables is positive. According to this, the decrease of pH will cause to the increase of  $W_1$  and as a result of this,  $b^*$  value will increase. In conclusion, the reduction of WHC and pH caused to decrease in  $L^*$  and  $a^*$  value and increase of  $b^*$  value.

#### References

- [1]. Dokuzlu, S., Barış, O., Hecer, C. ve Gültaş, M. 2013. Türkiye’de Tavuk Eti Tüketim Alışkanlıkları ve Marka Tercihleri, Uludağ Üniversitesi Ziraat Fakültesi Dergisi, 27: 83-92.
- [2]. World Health Organization (WHO). 2007.Report of a joint WHO/FAO/UNU expert consultation. Protein and amino acid requirements in human nutrition. Geneva, Switzerland.
- [3]. Attia YA., Al-Harathi MA., Korish MA., Shiboob MA., (2016). Evaluation of the broiler meat quality in the retail market: Effects of type and source of carcasses. Rev MexCiencPecu 7(3):321-329.
- [4]. Ferket, P. and Foegeding, E., 1994. How nutrition and management influence PSE in poultry meat. In: BASF Technical Symposium, Multi-State Feeding and Nutrition Conference, Indianapolis, IN. BASF Corporation, Parsippany, NJ, pp. 64-78.
- [5]. Owens CM, Hirschler EM, McKee SR, Martinez-Dawson R, Sams AR. (2000). The characterization and incidence of pale, soft, exudative turkey meat in a commercial plant. Poult Sci. 2000 Apr;79(4):553-8.
- [6]. Woelfel RL., Owens CM., Hirschler EM., Martinez-Dawson R., Sams AR., 2002. The characterization and incidence of pale, soft and exudative broiler meat in commercial processing plant. Poultry Science, 81:579-584.
- [7]. Küçükylmaz K., Kıryma Z., Akdağ A., Çetinkaya M., Atalay H., Ateş A., Gürsel FE., Bozkurt M., 2017. Effect of lavender (*Lavandula Stoechas*) essential oil on growth performance, carcass characteristics, meat quality and antioxidant status of broilers. SAfr J AnimSci, 47, 178-186.
- [8]. Soares A. L., Ida, E. I., Miyamoto, S., Hernandez-Blazquez, F., Olivo, J., Pinheiro R. J.W. &Phosopolipase, M.S., 2003. A2 Activity in poultry pale, soft, exudative (PSE) meat. J. Food Biochem. 27, (4), 309-320.
- [9]. Babji, A. S., G. W. Froning, and D. A. Ngoka, 1982.The effect of preslaughter environmental temperature in the presence of electrolyte treatment on turkey meat quality. Poultry Sci. 61:2385–2389.
- [10]. Aviagen., 2007. Broiler nutrition specifications.Aviagen Inc., Newbridge, Scotland, U.K.

- [11]. Castellini, C., Mugnai, C. & Dal Bosco, A., 2002. Effect of organic production system on broiler carcass and meat quality. *Meat Sci.* 60, 219-225.
- [12]. Tabacnick BG, Fidell LS. 2001. Using multivariate statistics. Fourty Edition Allyn and Bacon, Inc., 996p., New York.
- [13]. Johnson RA, Wichern DW. 2002. Applied multivariate statistical analysis. Prentice-Hall, Inc., Upper Saddle, 762 p., New Jersey.
- [14]. Keskin S, Özsoy AN. 2004. Kanonik korelasyon ve bir uygulaması. *TarımBilimleriDergisi*, 10(1): 67-71.
- [15]. Sakar, E., Ünver, H., Keskin, S., and Sakar, Z. M. (2016). The investigation of relationships between some fruit and kernel traits with canonical correlation analysis in Ankara region walnuts. *Erwerbs-Obstbau*, 58(1), 19-23.
- [16]. Thompson B. 1984. Canonical correlation analysis: Uses and interpretation. Sage Publications, Inc. California.
- [17]. Cankaya, S., Ocak, N., & Sungu, M. (2008). Canonical correlation analysis for estimation of relationships between sexual maturity and egg production traits upon availability of nutrients in pullets. *Asian-Australas J AnimSci*, 21, 1576-84.
- [18]. Allen, C.D., Fletcher, D.L., Northcutt, J.K., and Russell, S.M. (1998). The relationship of broiler breast color to meat quality and shelf-life. *Poultry Science*, 77, 361-366.
- [19]. Qiao, M., Fletcher, D.L., Smith, D.P., and Northcutt, J.K. (2002). Effects of raw broiler breast meat color variation on marination and cooked meat quality. *Poultry Science*, 81:276-280.
- [20]. Lee, E.S., Dadgar, S., Kim, C.J., Shand, P.J., 2007. Effect of raw meat L\* value, pH and marination on cooked meat quality of broiler thigh meat. *CMSA News*, 30-32.
- [21]. Fletcher, D.L., 1999. Broiler breast meat color variation, pH, and texture. *Poultry Sci*, 78:1323-1327.
- [22]. Fletcher, D.L., Qiao, M., Smith, D.P., 2000. The relationship of raw broiler breast meat color and pH to cooked meat color and pH. *Poultry Sci*, 79:784-788.
- [23]. Najji, TAA., Amadou I., Abbas S, Zhao RY., Shi YH., Le GW., (2013). Phytosterol supplementation improves antioxidant enzymes status and broiler meat quality. *Pakistan Journal of Food Science* 23(4):163-171.
- [24]. Evans, D. G., D. G. Topel, and K. Ono, 1979. Chemical composition of chops from pale, soft, exudative (PSE) and normal pork loins. *J. Food Sci.* 44:678-680.
- [25]. Komiyama CM. Caracterização (2006). ocorrência de carne pálida em frangos de corte e seu efeito na elaboração de produtos industrializados [dissertação]. Botucatu (SP): Faculdade de Medicina Veterinária e Zootecnia, Universidade Estadual Paulista.
- [26]. Sharma S. 1996. Applied multivariate techniques. John Wiley and Sons. Inc., 493p., New York.

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