

(CUSUM)

Monitoring Simple Linear Profiles Using Cumulative Sum Control Charts

ABSTRACT

In some applications a single variable, either a process variable or product variable, characterizes the state of the process. In the other applications, multiple variables characterize the state of the process. However, in some practical situations, the quality of a process or product is characterized by a relationship between two or more variables instead of by the distribution of a single quality characteristic. This relationship, which can be linear, nonlinear or even a complicated model, is referred to as profile by researchers. Up to now, several methods have been proposed for monitoring simple linear profiles in both Phases I and II. In this paper, for improving phase II monitoring of linear profiles, a method has been proposed which applies Cumulative Sum control charts. Average run length criterion and simulation studies are used in order to evaluate the performance of the proposed method. The results show the suitable performance of the proposed method. Finally, the effect of reference value on the performance of the proposed method is evaluated.

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KEYWORDS

Profile, Average Run Length (ARL), Cumulative Sum (CUSUM) control chart, Exponentially Weighted Moving Average (EWMA) control chart, Statistical process control.

EWMA [] EWMA/R T^2
 [] GLT/R [] MEWMA/ χ^2 MCUSUM/ χ^2 []

Y

X

$Y_{ij} = A_0 + A_1 X_i + \varepsilon_{ij} \quad i = 1, 2, \dots, n \quad ()$

$A_1 \quad A_0$

$X \quad \varepsilon_{ij} \quad \sigma^2$

$x_n \dots x_2 \quad x_1 \quad n$

$y_{nj} \dots y_{2j} \quad y_{1j} \quad j$

$(x_n y_{nj}) \dots (x_2 y_{2j}) \quad (x_1 y_{1j})$

$() \quad j$

T^2

T^2

R

(a_0, a_1)

T^2

$T^2 = (z_j - \mu)^T S^{-1} (z_j - \mu) \quad ()$

$z_j = (a_{0j}, a_{1j})^T, \mu = (A_0, A_1), S = \begin{pmatrix} \sigma_0^2 & \sigma_{01}^2 \\ \sigma_{01}^2 & \sigma_1^2 \end{pmatrix}, \quad []$

$a_{0j} = \bar{y}_j - a_{1j} \bar{x} \quad a_{1j} = \frac{s_{xy(j)}}{s_{xx}} \quad ()$

$\sigma_0^2 = \sigma^2 \left(\frac{1}{n} + \frac{\bar{x}^2}{s_{xx}} \right) \quad \sigma_1^2 = \frac{\sigma^2}{s_{xx}} \quad \sigma_{01}^2 = -\sigma^2 \frac{\bar{x}}{s_{xx}} \quad [] [] [] [] [] []$

T_j^2

$$b_{1j} \quad b_{0j} \quad () \quad A_1 \quad ()$$

$$B_1 \quad B_0 \quad \alpha \quad \chi^2_{2,\alpha} \quad UCL = \chi^2_{2,\alpha}$$

$$\frac{\sigma^2}{S_{xx}} \quad \frac{\sigma^2}{n}$$

$$b_{1j} \quad b_{0j} \quad EWMA/R$$

[]

[]

$$EWMA \quad EWMA/R$$

R

EWMA

B_0

EWMA

j EWMA

EWMA

b_{0j}

$$z_j = \theta \bar{e}_j + (1-\theta)z_{j-1} \quad ()$$

$$< \theta \leq$$

$$EWMA_I(j) = \theta b_{0j} + (1-\theta)EWMA_I(j-1), j=1,2,\dots,n \quad ()$$

$$e_{ij} = y_{ij} - A_0 - A_1 x_i, \bar{e}_j = \frac{1}{n} \sum_{i=1}^n e_{ij}, z_0 = 0 \quad ()$$

$$< \theta \leq$$

$$EWMA_I(0) = B_0$$

$$UCL = L\sigma \sqrt{\frac{\theta}{(2-\theta)n}} \quad LCL = -L\sigma \sqrt{\frac{\theta}{(2-\theta)n}} \quad ()$$

$L(>)$

$$LCL = B_0 - L_I \sigma \sqrt{\frac{\theta}{(2-\theta)n}}$$

ARL

$$UCL = B_0 + L_I \sigma \sqrt{\frac{\theta}{(2-\theta)n}} \quad ()$$

R

ARL

$L_I (>) ()$

$$R_j = \max(e_{ij}) - \min(e_{ij})$$

:

R

EWMA

$b_{1j} \quad B_1$

$$UCL = \sigma(d_2 + Ld_3) \quad LCL = \sigma(d_2 - Ld_3) \quad ()$$

ARL

$L(>)$

EWMA

$d_3 \quad d_2$

$$EWMA_S(j) = \theta b_{1j} + (1-\theta)EWMA_S(j-1), j=1,2,\dots,n \quad ()$$

$$< \theta \leq ()$$

$$EWMA_S(0) = B_1$$

EWMA

X

[]

$$LCL = B_1 - L_S \sigma \sqrt{\frac{\theta}{(2-\theta)S_{xx}}}$$

$$UCL = B_1 + L_S \sigma \sqrt{\frac{\theta}{(2-\theta)S_{xx}}} \quad ()$$

X

T^2

ARL

$L_S (>)$

()

$$Y_{ij} = B_0 + B_1 X'_i + \varepsilon_{ij}, \quad i=1,2,\dots,n \quad ()$$

$$X'_i = (X_i - \bar{X}) \quad B_1 = A_1 \quad B_0 = A_0 + A_1 \bar{X}$$

EWMA

[]

B_0

j

B_1

$$b_{0j} = \bar{y}_j$$

σ^2

) MSE_j



$$\chi_j^2 = \frac{1}{\sigma^2} \sum_{i=1}^n e_{ij}^2$$

$n \chi^2$

$$UCL = \chi_{\alpha,n}^2$$

$$\chi_j^2 > \chi_{\alpha,n}^2$$

MEWMA/ χ^2

[] MEWMA

$$z_j = \theta x_j + (1 - \theta) z_{j-1}$$

$$T_j^2 = z_j' \Sigma_{z_j}^{-1} z_j$$

$$\Sigma_{z_j} = \frac{\theta}{2 - \theta} [1 - (1 - \theta)^{2j}] \Sigma$$

$$\Sigma_{z_j} = \frac{\theta}{2 - \theta} \Sigma$$

T_j^2 MEWMA

ARL

GLT/R

F

H_0 : Intercept = B_0 , Slope = B_1

(j

EWMA

$$EWMA_E(j) = \max\{\theta \ln(MSE_j) + (1 - \theta)EWMA_E(j - 1), \ln(\sigma_0^2)\}$$

$j = 1, 2, \dots, n$

$< \theta \leq$

$$EWMA_E(0) = Ln(\sigma_0^2)$$

$$EWMA_E(0) = 0$$

$EWMA_E(j)$

() ()

[] MEWMA

$$UCL = L_E \sqrt{\frac{\theta \text{var}[\ln(MSE_j)]}{(2 - \theta)}}$$

$$\text{Var}[\ln(MSE_j)] = \frac{2}{(n - 2)} + \frac{2}{(n - 2)^2} +$$

$$\frac{4}{3(n - 2)^3} - \frac{16}{15(n - 2)^5}$$

ARL $L_E (>)$

$< \theta \leq$

MCUSUM/ χ^2

[] MCUSUM

[]

MCUSUM

$$S_j = \max(S_{j-1} + a'(x_j - \mu_G) - .5D, 0)$$

$$a' = \frac{(\mu_B - \mu_G)' \Sigma^{-1}}{\sqrt{(\mu_B - \mu_G)' \Sigma^{-1} (\mu_B - \mu_G)}}$$

$$D = \sqrt{(\mu_B - \mu_G)' \Sigma^{-1} (\mu_B - \mu_G)}$$

x_j

Σ j

μ_G

μ_B

UCL

ARL

UCL

S_j

[]



$H_1: \text{Intercept} \neq B_0, \text{Slope} \neq B_1$ ()

UCL_L $CUSUM_L^-$ $CUSUM_L^+$ B_1 B_0 ()

UCL_L ARL $F_j^* = [\sum_{i=1}^n (Y_{ij} - B_0 - B_1 X_{ij})^2 - \sum_{i=1}^n (Y_{ij} - b_{0j} - b_{1j} X_{ij})^2] / 2 \div [\sum_{i=1}^n (Y_{ij} - b_{0j} - b_{1j} X_{ij})^2 / (n-2)]$ ()

$CUSUM$ b_{1j} H_0 $F_j^* < F_{(1-\alpha; df(Rj) - df(Fj), df(Fj))}$

$CUSUM_S^+(j) = \max[0, b_{1j} - (B_1 + K_S) + CUSUM_S^+(j-1)]$ $df(Rj)$
 $CUSUM_S^-(j) = \max[0, (B_1 - K_S) - b_{1j} + CUSUM_S^-(j-1)]$ () $df(Fj)$

$K_S \cdot CUSUM_S^+(0) = CUSUM_S^-(0) = 0$ n

UCL_S $CUSUM_S^-$ $CUSUM_S^+$ [] R

MSE_j $CUSUM$ X
 $CUSUM_E^+(j) = \max[0, MSE_j - K_E + CUSUM_E^+(j-1)]$
 $CUSUM_E^-(j) = \min[0, MSE_j - K_E + CUSUM_E^-(j-1)]$ () $CUSUM$

$K_E \cdot CUSUM_E^+(0) = CUSUM_E^-(0) = 0$ UCL_E

UCL_E $CUSUM_E^-$ $CUSUM_E^+$ $CUSUM$

X () $CUSUM$

ARL b_{0j} $CUSUM^+$ $CUSUM^-$

[] () $X = Y_{ij} = \mu + X_i + \epsilon$ $\epsilon \sim N(0,1)$ ARL
 $CUSUM_I^+(j) = \max[0, b_{0j} - (B_0 + K_I) + CUSUM_I^+(j-1)]$
 $CUSUM_I^-(j) = \max[0, (B_0 - K_I) - b_{0j} + CUSUM_I^-(j-1)]$ ()
 $CUSUM^-$ $CUSUM^+$ K_I $i(j)$

ARL () B_0 $B_0' = B_0 + \Delta$ K_I

$\epsilon \sim N()$ $Y_{ij} = \mu + X_i + \epsilon$ $CUSUM_I^+(j)$ K B_0 $K_I = \Delta /$ $CUSUM_I^-(j)$

EWMA
CUSUM

CUSUM
ARL CUSUM

EWMA
 $A_1 \quad / \quad \sigma \quad / \quad \sigma \quad / \quad \sigma \quad / \quad \sigma$

CUSUM⁺
CUSUM
UCL₁

CUSUM
ARL : ()

$/ \quad K_1 \quad /$

Chart	β	$A_1 + \beta\sigma$		A_1	
		/	/	/	/
EWMA-3		/	/	/	/
CUSUM-3		/	/	/	/

ARL

ARL

ARL

MEWMA/ χ^2 MCUSUM/ χ^2

() ()

ARL
 $\delta=0$

B_1 ()
 δ
[]

[]

) A_0

ARL

CUSUM⁺

σ

(B_0)

MEWMA/ χ^2 MCUSUM/ χ^2

T^2

EWMA EWMA/R

MEWMA/ χ^2 χ^2 MCUSUM/

ARL

σ

A_1

... / /

()

()

MEWMA/ χ^2

CUSUM

MCUSUM/ χ^2

CUSUM

GLT/R []

MEWMA/ χ^2

T^2

EWMA/R

[]

CUSUM



/ / / /

X

X

K

CUSUM

GLT/R ()

[]

CUSUM

K

K

T²

K

CUSUM

EWMA/R

/ /

GLT/R

/ /

T² EWMA/R

/ /

ARL

/ /

CUSUM

GLT/R

T²

EWMA/R

EWMA/R

[]

()

CUSUM

K

/

()

CUSUM

/ /

CUSUM

MEWMA/ χ^2 χ^2 MCUSUM/

/ /

CUSUM

K

CUSUM

CUSUM

MCUSUM/ χ^2 EWMA

EWMA/R T^2

GLT/R MEWMA/ χ^2

%

ARL

χ^2 MEWMA/ MCUSUM/ χ^2

K

K

MEWMA/ χ^2 MCUSUM/ χ^2

CUSUM

MEWMA/ χ^2

MEWMA/ χ^2

$A_0 + \lambda\sigma$ A_0

ARL : ()

Chart \ λ	$A_0 + \lambda\sigma$	A_0									
EWMA/R	/	/	/	/	/	/	/	/	/	/	/
T^2	/	/		/	/		/	/	/	/	/
EWMA-3	/	/	/	/	/	/	/	/	/	/	/
MCUSUM/ χ^2	/	/	/	/	/	/	/	/		/	/
MEWMA/ χ^2	/	/	/	/	/	/	/	/	/	/	/
CUSUM-3	/	/	/	/	/	/	/	/	/	/	/

$A_1 + \beta\sigma$ A_1

ARL : ()

Chart \ β	$A_1 + \beta\sigma$	A_1								
EWMA/R		/	/	/	/	/	/	/	/	
T^2		/	/	/	/	/	/	/	/	/
EWMA-3	/	/		/	/	/	/	/	/	/
MCUSUM/ χ^2	/	/	/	/	/	/	/	/	/	/
MEWMA/ χ^2	/	/	/	/	/	/	/	/	/	/
CUSUM-3	/	/		/	/		/	/	/	/



/ / / /

		$\gamma\sigma$	σ	ARL				:()			
Chart	γ	/	/	/	/	/	/	/	/	/	/
EWMA/R		/	/	/	/	/	/	/	/	/	/
T^2		/	/	/	/	/	/	/	/	/	/
EWMA-3		/	/	/	/	/	/	/	/	/	/
MCUSUM / χ^2		/	/	/	/	/	/	/	/	/	/
MEWMA / χ^2		/	/	/	/	/	/	/	/	/	/
CUSUM-3		/	/	/	/	/	/	/	/	/	/

		$B_1 + \delta\sigma$	B_1	ARL				:()			
Chart	δ	/	/	/	/	/	/	/	/	/	/
EWMA/R		/	/	/	/	/	/	/	/	/	/
T^2		/	/	/	/	/	/	/	/	/	/
EWMA-3		/	/	/	/	/	/	/	/	/	/
MCUSUM / χ^2		/	/	/	/	/	/	/	/	/	/
MEWMA / χ^2		/	/	/	/	/	/	/	/	/	/
CUSUM-3		/	/	/	/	/	/	/	/	/	/

		$A_0 + \lambda\sigma$	A_0	ARL				:()			
Chart	λ	/	/	/	/	/	/	/	/	/	/
CUSUM-3 (small K)		/	/	/	/	/	/	/	/	/	/
CUSUM-3 (medium K)		/	/	/	/	/	/	/	/	/	/
CUSUM-3 (big K)		/	/	/	/	/	/	/	/	/	/

		$A_1 + \beta\sigma$	A_1	ARL				:()			
Chart	β	/	/	/	/	/	/	/	/	/	/
CUSUM-3 (small K)		/	/	/	/	/	/	/	/	/	/
CUSUM-3 (medium K)		/	/	/	/	/	/	/	/	/	/
CUSUM-3 (big K)		/	/	/	/	/	/	/	/	/	/

Gupta, S.; Montgomery, D. C.; Woodall, W. H.; "Performance Evaluation of Two Methods for Online Monitoring of Linear Calibration Profiles", International Journal of Production. Research, Vol. 44, No. 10, p.p. 1927-1942, 2006.

Healy J.D; "A Note on Multivariate CUSUM Procedures", Technometrics, Vol. 29, No. 4, p.p. 409-412, 1987.

Jensen, W. A.; Birch, J. B.; "Profile Monitoring via Nonlinear Mixed Models". Technical Report No. 06-4, Department of Statistics, Virginia Polytechnic Institute & State University, 2006.

Kang, L.; Albin, S. L.; "On-line Monitoring When the Process Yields a Linear Profile", Journal of Quality Technology, Vol. 32, No. 4, p.p.418-426, 2000.

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Croarkin, C.; Varner, R.; "Measurement Assurance for Dimensional Measurements on Integrated-Circuit Photomasks". NBS Technical Note 1164, U.S. Department of Commerce, Washington, D.C., 1982. []

Crowder, S. V.; Hamilton, M. D.; "An EWMA for Monitoring a Process Standard Deviation", Journal of Quality Technology, Vol. 24, No. 1, p.p. 12-211, 992. []

Ding, Y.; Zeng, L.; Zhou, S; "Phase I Analysis for Monitoring Nonlinear Profiles in Manufacturing Processes", Journal of Quality Technology, Vol. 38, No. 3, p.p.199-216, 2006. []

- Wang, K.; Tsung, F.; "Using Profile Monitoring Techniques for a Data-Rich Environment with Huge Sample Size". *Quality and Reliability Engineering International*, Vol. 21, No. 7, p.p. 677–688, 2005. []
- Williams, J. D.; Woodall, W. H.; Birch, J. B.; "Statistical Monitoring of Nonlinear Product and Process Quality Profiles", *Quality and Reliability Engineering International*, Vol. 23, No. 8, p.p. 925-941, 2007. []
- Woodall, W. H.; Spitzner, D. J.; Montgomery, D. C.; Gupta S.; "Using Control Charts to Monitor Process and Product Quality Profiles", *Journal of Quality Technology*, Vol. 36, No. 3, p.p. 309–320, 2004. []
- Woodall, W. H.; "Current Research on Profile Monitoring". *Revista Produção*, Vol. 17, No. 3, p.p. 420-425, 2007. []
- Zou, C.; Tsung, F.; Wang, Z.; "Monitoring General Linear Profiles Using Multivariate Exponentially Weighted Moving Average Schemes", *Technometrics*, Vol. 49, No. 4, p.p. 395-408, 2007. []
- Zou, C.; Zhang, Y.; Wang, Z.; "Control Chart Based on Change-Point Model for Monitoring Linear Profiles", *IIE Transactions*. Vol. 38, No. 12, p.p. 1093-1103, 2006. []
- Kazemzadeh, R. B.; Noorossana, R.; Amiri, A.; "Phase I Monitoring of Polynomial Profiles", *Communications in Statistics-Theory and Methods*, Vol. 37, No. 10, p.p.1671-1686, 2008. []
- Kazemzadeh, R. B.; Noorossana, R; and Amiri, A.; "Monitoring Polynomial Profiles in Quality Control Applications", *The International Journal of Advanced Manufacturing Technology*, Vol. 42, No. 7, p.p. 703-712, 2009. []
- Kim, K.; Mahmoud, M. A.; Woodall, W. H.; "On the Monitoring of Linear Profiles", *Journal of Quality Technology*, Vol. 35, No. 3, p.p. 317–328, 2003. []
- Lowry C.A.; Woodall W.H.; Champ C.W.; Rigdon S.E. "A Multivariate Exponentially Weighted Moving Average Control Chart", *Technometrics*, Vol. 34, No. 1, p.p. 46-53, 1992. []
- Mahmoud, M. A.; Parker, P. A.; Woodall, W. H.; Hawkins, D. M.; "A Change Point Method for Linear Profile Data", *Quality and Reliability Engineering International*, Vol. 23, No. 2, p.p. 247–268, 2007. []
- Mahmoud, M. A.; Woodall, W. H.; "Phase I Analysis of linear profiles with calibration applications", *Technometrics*, Vol. 46, No. 4, p.p. 380-391, 2004. []
- Niaki, S. T. A.; Abbasi, B.; Arkat, J.; "A Generalized Linear Statistical Model Approach to Monitor Profiles", *International Journal of Engineering, Transactions A: Basics*, Vol. 20, No. 3, p.p. 233–242, 2007. []
- Stover, F. S.; Brill, R. V.; "Statistical Quality Control Applied to Ion Chromatography Calibrations", *Journal of Chromatography*, Vol. 804, No.1-2, p.p.37-43, 1998. []

