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**Lampiran 1. Berat Bayi Baru Lahir Bulan Januari 2012 sampai
November 2012 di Puskesmas Manyar**

No.	Berat Bayi Baru Lahir (gram)	Kelompok (Y)
1	3400	1
2	3000	1
3	3300	1
4	3000	1
5	3100	1
6	3800	1
7	2900	1
8	2900	1
9	3000	1
10	3600	1
11	2900	1
12	2900	1
13	3000	1
14	2900	1
15	3000	1
16	3100	1
17	3100	1
⋮	⋮	⋮
298	1700	2
299	2200	2
300	2100	2
301	2500	2
302	1700	2
303	2400	2
304	2300	2
305	1500	2
306	1500	2
307	1600	2
308	2300	2

Keterangan:

1 = Kelompok Berat Bayi Lahir Normal (berat bayi > 2500 gram)

2 = Kelompok Berat Bayi Lahir Rendah (berat bayi ≤ 2500 gram)

Lampiran 2. Peubah-Peubah yang Mewakili Keadaan Ibu Saat Hamil

No.	X₁	X₂	X₃	X₄	X₅	X₆
1	28	0	40	23	10.8	0
2	20	0	40	24	11	0
3	20	0	38	23.5	11	0
4	21	0	69	26	11.1	0
5	24	0	48	24	11	0
6	26	0	55	25	11	0
7	24	0	50	24	11	0
8	24	0	51	24.5	11	0
9	31	1	54	26	11	8
10	27	2	60	28	12	2
11	22	0	45	23.5	11.5	0
12	30	1	50	25	11	5
13	29	0	38.5	23	10.5	0
14	22	1	58	28	11	18
15	25	0	50	25	11.8	0
16	33	1	48	25	12	7
17	31	2	55	25	12	2
∴	∴	∴	∴	∴	∴	∴
298	37	3	51	28	11	8
299	37	5	61	27	10.8	4
300	28	2	50	22.5	10.8	4
301	19	0	52	27	11.2	0
302	38	2	46	23	11	7
303	30	0	49.5	27	11	0
304	24	0	45.5	21	11.8	0
305	35	0	59	27	11	0
306	37	5	61	27	10.8	4
307	19	0	50	26	11	0
308	27	1	47	24.7	11.1	8

Lampiran 2. (Lanjutan)

Keterangan:

X_1 : Usia ibu (tahun)

X_2 : Jumlah anak (anak)

X_3 : Berat badan ibu prahamil (kg)

X_4 : Ukuran LILA ibu hamil (cm)

X_5 : Kadar Hb ibu hamil (gr/dl)

X_6 : Jarak kelahiran (tahun)

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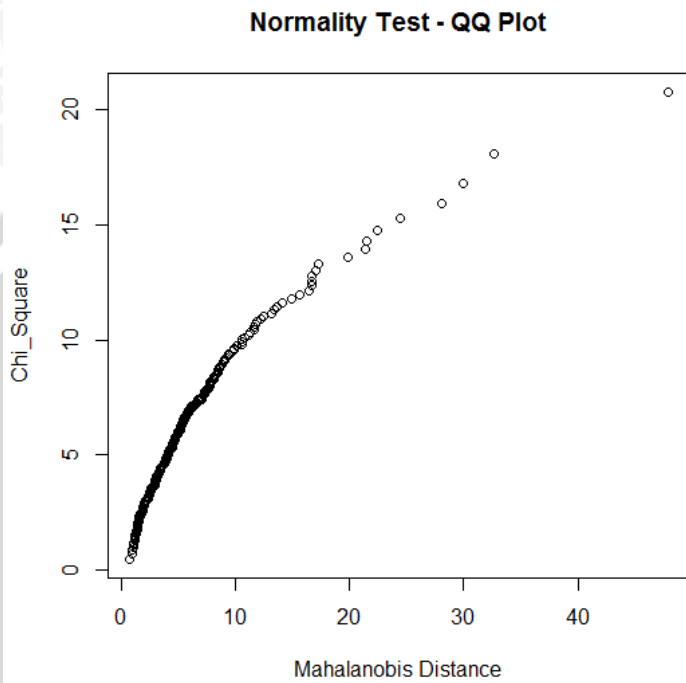
Lampiran 3. Training set (TS)

No.	X ₁	X ₂	X ₃	X ₄	X ₅	X ₆	Y
1	24	0	48	24	11.6	0	1
2	25	1	37	23.2	11.7	4	1
3	26	1	54	28	11	5	1
4	32	0	43	24	11	0	1
5	34	3	56	25	11.7	4	1
6	31	2	81	30	11	5	1
7	28	1	67.5	31	11	3	1
8	18	0	45	23	11	0	1
9	24	1	50	25	11	4.5	1
10	28	1	34	23	11	4	1
11	24	0	47	21.5	11.8	0	1
12	37	2	42	22.5	11.8	11	1
13	31	2	52	27	11.4	5	1
14	31	1	54	26	11	8	1
15	24	0	50	24	11	0	1
16	34	2	71	33	11	2.5	1
17	27	0	54	26	9.2	0	1
18	20	1	59	29	11	3	1
19	23	1	69	27	11.8	5	1
20	40	6	58	29	11.7	5	1
21	21	0	46	26	11	0	1
22	28	1	47	24.5	11.4	7	1
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮
236	37	5	61	27	10.8	4	2
237	34	1	37	22.5	11	7	2
238	24	0	40	24	10.9	0	2
239	37	5	61	27	10.8	4	2
240	19	0	52	27	11.2	0	2
241	37	3	51	28	11	8	2
242	33	1	48	24	11	1	2
243	35	0	59	27	11	0	2
244	33	3	45	23	10.5	5	2
245	22	0	55	24	11.5	0	2
246	20	3	40	24	12	2	2

Lampiran 4. *Testing set* (VS)

No.	X_1	X_2	X_3	X_4	X_5	X_6	Y
1	22	0	46	24	10.8	0	1
2	24	0	45	24	11.4	0	1
3	23	0	79	24	12.3	0	1
4	18	0	80	30	11.4	0	1
5	31	1	55	26	12.5	5	1
6	22	0	45	24	22.6	0	1
7	26	2	49	25	10.8	1	1
8	24	1	56	24	11.2	4	1
9	38	3	52	29	10.8	8	1
10	21	0	68	24	11.7	0	1
11	25	1	50	23.5	11	2	1
12	31	1	48	25	11	5	1
13	20	0	51	24	11.8	0	1
14	36	1	56	25.2	11.3	4	1
15	26	2	45	23.5	11.3	1.5	1
16	21	1	47	24	11	2.5	1
17	24	0	50	24.5	11	0	1
18	37	1	56	29	11	5	1
19	35	1	47	24	11	8	1
20	29	1	61	32	11.4	5	1
21	24	0	47	23.5	10.8	0	1
22	21	0	46	22.5	11.2	0	1
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮
52	32	2	54	25	11	7	1
53	22	1	75	28	11.4	1.2	1
54	24	1	70	27	11.4	4	1
55	26	0	53	25	12	0	1
56	30	2	40	24	11.2	10	1
57	26	0	38	22	11	0	2
58	24	0	31	18	11	0	2
59	24	0	47	24	11	0	2
60	24	0	45.5	21	11.8	0	2
61	25	0	50	25	12	0	2
62	20	0	45	24	11	0	2

Lampiran 5. Hasil Pengujian Asumsi Sebaran Normal Multivariat



Lampiran 6. Hasil Pengujian Asumsi Kehomogenan Matriks Ragam Peragam

Test Results

Box's M		50.302
F	Approx.	2.183
	df1	21
	df2	6.886E3
	Sig.	.001

Tests null hypothesis of equal population covariance matrices.



Lampiran 7. Hasil Pengujian Perbedaan Vektor Rata-Rata

Wilks' Lambda

Test of Function(s)	Wilks' Lambda	Chi-square	df	Sig.
1	.944	13.902	6	.031



Lampiran 8. Hasil Identifikasi Pencilan Pada *Training set*

Chi.sq = 14.44938

x- 1 = 1.304054 --> bukan pencilan
x- 2 = 4.875746 --> bukan pencilan
x- 3 = 3.372323 --> bukan pencilan
x- 4 = 8.430354 --> bukan pencilan
x- 5 = 5.097002 --> bukan pencilan
x- 6 = 11.67061 --> bukan pencilan
x- 7 = 5.539238 --> bukan pencilan
x- 8 = 4.024695 --> bukan pencilan
x- 9 = 2.106161 --> bukan pencilan
x- 10 = 5.476774 --> bukan pencilan
x- 11 = 3.964802 --> bukan pencilan
x- 12 = 11.27582 --> bukan pencilan
x- 13 = 2.261156 --> bukan pencilan
x- 14 = 4.760575 --> bukan pencilan
x- 15 = 1.547294 --> bukan pencilan
x- 16 = 12.22877 --> bukan pencilan
x- 17 = 21.46305 --> pencilan
x- 18 = 7.063406 --> bukan pencilan
x- 19 = 8.611391 --> bukan pencilan
x- 20 = 28.03863 --> pencilan
x- 21 = 3.659328 --> bukan pencilan
x- 22 = 3.020929 --> bukan pencilan
x- 23 = 3.507245 --> bukan pencilan
x- 24 = 2.506022 --> bukan pencilan
x- 25 = 5.865617 --> bukan pencilan
x- 26 = 3.313305 --> bukan pencilan
x- 27 = 5.875084 --> bukan pencilan
x- 28 = 1.625246 --> bukan pencilan
x- 29 = 29.91721 --> pencilan
x- 30 = 0.9044848 --> bukan pencilan
x- 31 = 13.40678 --> bukan pencilan
x- 32 = 10.48358 --> bukan pencilan
x- 33 = 13.6121 --> bukan pencilan
x- 34 = 3.065181 --> bukan pencilan
x- 35 = 9.796845 --> bukan pencilan
x- 36 = 5.762363 --> bukan pencilan
x- 37 = 1.320286 --> bukan pencilan
x- 38 = 47.95035 --> pencilan
x- 39 = 11.64082 --> bukan pencilan
x- 40 = 1.970648 --> bukan pencilan
x- 41 = 1.541098 --> bukan pencilan
x- 42 = 4.482041 --> bukan pencilan

Lampiran 8. (Lanjutan)

x- 43 = 6.562329 --> bukan pencilan
x- 44 = 4.400765 --> bukan pencilan
x- 45 = 1.10644 --> bukan pencilan
x- 46 = 4.446428 --> bukan pencilan
x- 47 = 1.866347 --> bukan pencilan
x- 48 = 11.16618 --> bukan pencilan
x- 49 = 1.863923 --> bukan pencilan
x- 50 = 8.403219 --> bukan pencilan
x- 51 = 1.898697 --> bukan pencilan
x- 52 = 1.523126 --> bukan pencilan
x- 53 = 2.416647 --> bukan pencilan
x- 54 = 8.911107 --> bukan pencilan
x- 55 = 3.565912 --> bukan pencilan
x- 56 = 3.321772 --> bukan pencilan
x- 57 = 3.88258 --> bukan pencilan
x- 58 = 4.678219 --> bukan pencilan
x- 59 = 7.129051 --> bukan pencilan
x- 60 = 6.643121 --> bukan pencilan
x- 61 = 2.900645 --> bukan pencilan
x- 62 = 2.069356 --> bukan pencilan
x- 63 = 3.103019 --> bukan pencilan
x- 64 = 4.808828 --> bukan pencilan
x- 65 = 14.88324 --> pencilan
x- 66 = 2.938497 --> bukan pencilan
x- 67 = 1.815123 --> bukan pencilan
x- 68 = 6.440606 --> bukan pencilan
x- 69 = 2.86089 --> bukan pencilan
x- 70 = 3.889414 --> bukan pencilan
x- 71 = 3.432159 --> bukan pencilan
x- 72 = 1.863377 --> bukan pencilan
x- 73 = 4.629014 --> bukan pencilan
x- 74 = 2.935685 --> bukan pencilan
x- 75 = 4.09309 --> bukan pencilan
x- 76 = 32.62514 --> pencilan
x- 77 = 0.6941274 --> bukan pencilan
x- 78 = 5.178286 --> bukan pencilan
x- 79 = 7.467955 --> bukan pencilan
x- 80 = 1.09946 --> bukan pencilan
x- 81 = 8.118964 --> bukan pencilan
x- 82 = 1.226389 --> bukan pencilan
x- 83 = 2.410656 --> bukan pencilan
x- 84 = 12.45851 --> bukan pencilan
x- 85 = 8.061432 --> bukan pencilan
x- 86 = 1.918053 --> bukan pencilan
x- 87 = 4.337638 --> bukan pencilan

Lampiran 8. (Lanjutan)

x- 88	=	4.258177	-->	bukan pencilan
x- 89	=	5.826647	-->	bukan pencilan
x- 90	=	5.282423	-->	bukan pencilan
x- 91	=	4.215762	-->	bukan pencilan
x- 92	=	5.331427	-->	bukan pencilan
x- 93	=	4.484621	-->	bukan pencilan
x- 94	=	1.129121	-->	bukan pencilan
x- 95	=	2.306537	-->	bukan pencilan
x- 96	=	6.341259	-->	bukan pencilan
x- 97	=	1.427362	-->	bukan pencilan
x- 98	=	4.708533	-->	bukan pencilan
x- 99	=	2.128387	-->	bukan pencilan
x- 100	=	17.04258	-->	pencilan
x- 101	=	7.283198	-->	bukan pencilan
x- 102	=	2.933368	-->	bukan pencilan
x- 103	=	1.082202	-->	bukan pencilan
x- 104	=	3.298622	-->	bukan pencilan
x- 105	=	2.507947	-->	bukan pencilan
x- 106	=	1.04154	-->	bukan pencilan
x- 107	=	4.180094	-->	bukan pencilan
x- 108	=	3.421592	-->	bukan pencilan
x- 109	=	3.026945	-->	bukan pencilan
x- 110	=	3.167152	-->	bukan pencilan
x- 111	=	2.567239	-->	bukan pencilan
x- 112	=	3.25038	-->	bukan pencilan
x- 113	=	8.555438	-->	bukan pencilan
x- 114	=	2.881338	-->	bukan pencilan
x- 115	=	4.152759	-->	bukan pencilan
x- 116	=	7.707567	-->	bukan pencilan
x- 117	=	2.85065	-->	bukan pencilan
x- 118	=	4.36935	-->	bukan pencilan
x- 119	=	1.363828	-->	bukan pencilan
x- 120	=	1.593414	-->	bukan pencilan
x- 121	=	1.343982	-->	bukan pencilan
x- 122	=	1.757274	-->	bukan pencilan
x- 123	=	0.992556	-->	bukan pencilan
x- 124	=	3.771746	-->	bukan pencilan
x- 125	=	7.60513	-->	bukan pencilan
x- 126	=	10.55314	-->	bukan pencilan
x- 127	=	4.408774	-->	bukan pencilan
x- 128	=	5.346334	-->	bukan pencilan
x- 129	=	1.901746	-->	bukan pencilan
x- 130	=	1.417409	-->	bukan pencilan
x- 131	=	2.618426	-->	bukan pencilan
x- 132	=	5.948061	-->	bukan pencilan

Lampiran 8. (Lanjutan)

x- 133 = 9.751434 --> bukan pencilan
x- 134 = 1.406132 --> bukan pencilan
x- 135 = 2.356152 --> bukan pencilan
x- 136 = 3.828443 --> bukan pencilan
x- 137 = 5.59947 --> bukan pencilan
x- 138 = 11.59043 --> bukan pencilan
x- 139 = 6.697419 --> bukan pencilan
x- 140 = 5.329527 --> bukan pencilan
x- 141 = 3.709287 --> bukan pencilan
x- 142 = 1.440949 --> bukan pencilan
x- 143 = 3.413239 --> bukan pencilan
x- 144 = 2.310296 --> bukan pencilan
x- 145 = 7.372948 --> bukan pencilan
x- 146 = 4.868659 --> bukan pencilan
x- 147 = 2.66717 --> bukan pencilan
x- 148 = 5.217969 --> bukan pencilan
x- 149 = 6.590799 --> bukan pencilan
x- 150 = 1.912753 --> bukan pencilan
x- 151 = 2.972542 --> bukan pencilan
x- 152 = 2.96528 --> bukan pencilan
x- 153 = 4.11894 --> bukan pencilan
x- 154 = 1.733827 --> bukan pencilan
x- 155 = 9.06528 --> bukan pencilan
x- 156 = 10.51987 --> bukan pencilan
x- 157 = 7.672255 --> bukan pencilan
x- 158 = 4.711986 --> bukan pencilan
x- 159 = 1.218863 --> bukan pencilan
x- 160 = 3.901874 --> bukan pencilan
x- 161 = 10.1265 --> bukan pencilan
x- 162 = 2.748407 --> bukan pencilan
x- 163 = 9.005035 --> bukan pencilan
x- 164 = 17.18919 --> pencilan
x- 165 = 7.756285 --> bukan pencilan
x- 166 = 16.43843 --> pencilan
x- 167 = 9.09356 --> bukan pencilan
x- 168 = 4.556666 --> bukan pencilan
x- 169 = 2.554843 --> bukan pencilan
x- 170 = 0.9343641 --> bukan pencilan
x- 171 = 15.58512 --> pencilan
x- 172 = 3.206036 --> bukan pencilan
x- 173 = 4.036187 --> bukan pencilan
x- 174 = 24.36485 --> pencilan
x- 175 = 3.97227 --> bukan pencilan
x- 176 = 7.029423 --> bukan pencilan
x- 177 = 2.258643 --> bukan pencilan

Lampiran 8. (Lanjutan)

x- 178	= 5.698873	--> bukan pencilan
x- 179	= 9.334963	--> bukan pencilan
x- 180	= 9.857915	--> bukan pencilan
x- 181	= 4.918234	--> bukan pencilan
x- 182	= 1.406132	--> bukan pencilan
x- 183	= 9.353105	--> bukan pencilan
x- 184	= 5.096452	--> bukan pencilan
x- 185	= 1.013768	--> bukan pencilan
x- 186	= 5.002972	--> bukan pencilan
x- 187	= 2.434243	--> bukan pencilan
x- 188	= 21.36972	--> pencilan
x- 189	= 6.091292	--> bukan pencilan
x- 190	= 1.887848	--> bukan pencilan
x- 191	= 8.261426	--> bukan pencilan
x- 192	= 14.03157	--> bukan pencilan
x- 193	= 2.875879	--> bukan pencilan
x- 194	= 1.878528	--> bukan pencilan
x- 195	= 2.301888	--> bukan pencilan
x- 196	= 6.071577	--> bukan pencilan
x- 197	= 8.535084	--> bukan pencilan
x- 198	= 3.934746	--> bukan pencilan
x- 199	= 3.298025	--> bukan pencilan
x- 200	= 6.098662	--> bukan pencilan
x- 201	= 4.671386	--> bukan pencilan
x- 202	= 1.115203	--> bukan pencilan
x- 203	= 5.141861	--> bukan pencilan
x- 204	= 3.182624	--> bukan pencilan
x- 205	= 1.430414	--> bukan pencilan
x- 206	= 1.511167	--> bukan pencilan
x- 207	= 8.131676	--> bukan pencilan
x- 208	= 4.4635	--> bukan pencilan
x- 209	= 3.773689	--> bukan pencilan
x- 210	= 3.895821	--> bukan pencilan
x- 211	= 11.87688	--> bukan pencilan
x- 212	= 10.7425	--> bukan pencilan
x- 213	= 2.638155	--> bukan pencilan
x- 214	= 1.374148	--> bukan pencilan
x- 215	= 4.429781	--> bukan pencilan
x- 216	= 1.83111	--> bukan pencilan
x- 217	= 4.096527	--> bukan pencilan
x- 218	= 5.593291	--> bukan pencilan
x- 219	= 5.352352	--> bukan pencilan
x- 220	= 2.124904	--> bukan pencilan
x- 221	= 7.261482	--> bukan pencilan
x- 222	= 5.424089	--> bukan pencilan

Lampiran 8. (Lanjutan)

x- 223	=	2.406377	-->	bukan pencilan
x- 224	=	5.218489	-->	bukan pencilan
x- 225	=	8.792117	-->	bukan pencilan
x- 226	=	5.074421	-->	bukan pencilan
x- 227	=	19.83259	-->	pencilan
x- 228	=	2.553763	-->	bukan pencilan
x- 229	=	7.001665	-->	bukan pencilan
x- 230	=	1.430414	-->	bukan pencilan
x- 231	=	3.37703	-->	bukan pencilan
x- 232	=	7.957727	-->	bukan pencilan
x- 233	=	4.930023	-->	bukan pencilan
x- 234	=	16.69107	-->	pencilan
x- 235	=	7.746423	-->	bukan pencilan
x- 236	=	16.69107	-->	pencilan
x- 237	=	8.011609	-->	bukan pencilan
x- 238	=	3.612687	-->	bukan pencilan
x- 239	=	16.69107	-->	pencilan
x- 240	=	3.871542	-->	bukan pencilan
x- 241	=	7.618914	-->	bukan pencilan
x- 242	=	4.854416	-->	bukan pencilan
x- 243	=	13.1535	-->	bukan pencilan
x- 244	=	7.287795	-->	bukan pencilan
x- 245	=	2.446769	-->	bukan pencilan
x- 246	=	22.36761	-->	pencilan

Lampiran 9. Koefisien Diskriminan Linier *Robust*, *Cutting point* dan Ketepatan Klasifikasi Setiap *Breakdown point*

• *Breakdown point* 0.15

Koefisien diskriminan linier *robust*:

$$\beta_{s1} = -0.0878 \quad \beta_{s4} = -0.0541$$

$$\beta_{s2} = -0.7887 \quad \beta_{s5} = 0.4668$$

$$\beta_{s3} = 0.0518 \quad \beta_{s6} = 0.2712$$

$$\text{Cutting point} = 3.9236$$

Aktual	Prediksi		Total
	1	2	
1	48	8	56
2	4	2	6
Total	52	10	62

$$APER = \frac{(4+8)}{62} = 0.1935 = 19.35\%$$

$$\text{Ketepatan klasifikasi} = 100\% - 19.35\% = 80.65\%$$

• *Breakdown point* 0.25

Koefisien diskriminan linier *robust*:

$$\beta_{s1} = -0.0990 \quad \beta_{s4} = -0.0690$$

$$\beta_{s2} = -0.9540 \quad \beta_{s5} = 0.4695$$

$$\beta_{s3} = 0.0540 \quad \beta_{s6} = 0.3206$$

$$\text{Cutting point} = 3.3404$$

Aktual	Prediksi		Total
	1	2	
1	47	9	56
2	4	2	6
Total	51	11	62

$$APER = \frac{(4+9)}{62} = 0.2097 = 20.97\%$$

$$\text{Ketepatan klasifikasi} = 100\% - 20.97\% = 79.03\%$$

Lampiran 9. (Lanjutan)

- *Breakdown point 0.50*

Koefisien diskriminan linier *robust*:

$$\beta_{s1} = -0.1346 \quad \beta_{s4} = 0.1407$$

$$\beta_{s2} = -0.5245 \quad \beta_{s5} = 0.5781$$

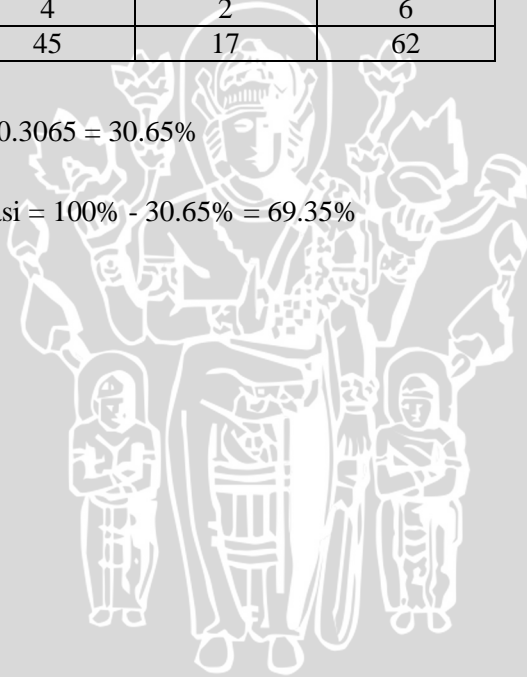
$$\beta_{s3} = -0.0457 \quad \beta_{s6} = 0.3845$$

Cutting point = 4.2996

Aktual	Prediksi		Total
	1	2	
1	41	15	56
2	4	2	6
Total	45	17	62

$$APER = \frac{(4+15)}{62} = 0.3065 = 30.65\%$$

$$\text{Ketepatan klasifikasi} = 100\% - 30.65\% = 69.35\%$$



**Lampiran 10. Nilai c , b , d_i^2 robust dan \hat{s} untuk Training set
Kelompok 1**

c	9.7392						
b	2.7559						
Robust Mahalanobis Distance							
Columns 1 through 7							
1.0787	2.2481	1.9144	3.1386	2.8441	3.4267	2.3330	
Columns 8 through 14							
1.9474	1.5283	2.3804	1.9426	3.4508	1.6789	2.3920	
Columns 15 through 21							
1.2177	3.6908	4.5875	2.7845	3.0902	6.7514	1.8679	
Columns 22 through 28							
1.9480	1.8464	1.6083	2.4020	1.9224	2.4617	1.1992	
Columns 29 through 35							
5.4729	0.9517	4.2388	3.2516	3.6753	1.7727	3.1681	
Columns 36 through 42							
2.6548	1.0927	8.0503	3.4237	1.4432	1.1712	2.4156	
Columns 43 through 49							
2.5363	2.2675	0.9796	2.0888	1.4147	3.3201	1.6466	
Columns 50 through 56							
2.9599	1.3041	1.1750	1.6158	3.0868	1.8217	1.9833	
Columns 57 through 63							
2.0477	2.1541	3.1199	2.6432	1.8106	1.3692	1.8345	
Columns 64 through 70							
2.5228	3.9996	1.6544	1.3482	2.5856	1.7223	1.9586	
Columns 71 through 77							
1.8317	1.3661	2.0579	1.6378	1.9628	7.5953	0.8635	
Columns 78 through 84							
2.2409	2.9632	0.9906	2.8128	1.3410	1.5231	3.5621	
Columns 85 through 91							
2.9836	1.6392	1.9902	1.9895	2.7133	2.6256	2.2755	
Columns 92 through 98							
2.5029	2.1938	1.1234	1.4682	2.5295	1.1102	2.1255	

Lampiran 10. (Lanjutan)

Columns 99 through 105	1.5734	4.1344	2.7728	1.6750	1.0445	1.8722	1.6636
Columns 106 through 112	1.0490	2.1507	1.8506	1.7404	1.7516	1.5736	1.7545
Columns 113 through 119	2.9917	1.6155	2.0348	2.8963	1.7118	2.3549	1.1720
Columns 120 through 126	1.1863	1.0976	1.3226	1.0337	1.9096	3.6106	3.4482
Columns 127 through 133	2.2389	2.4704	1.3275	1.1612	1.5706	2.3475	3.0206
Columns 134 through 140	1.1486	1.6512	1.8600	2.3017	3.9426	2.7868	2.3338
Columns 141 through 147	1.9292	1.1362	1.8709	1.5577	2.8182	2.1599	1.6366
Columns 148 through 154	2.2927	2.6840	1.5569	1.7648	2.1594	2.6153	1.2333
Columns 155 through 161	3.0784	3.2897	3.3499	2.1391	1.0243	2.3648	3.3333
Columns 162 through 168	1.7747	3.0769	4.7055	3.2844	3.9964	3.3189	2.2037
Columns 169 through 175	1.6839	1.0042	5.1890	1.8108	2.0985	5.3930	2.0025
Columns 176 through 182	2.8402	1.6099	2.3898	3.1432	3.0227	2.1446	1.1486
Columns 183 through 189	3.0694	2.3731	1.0080	2.2576	1.4945	4.6774	2.6687
Columns 190 through 196	1.2782	3.0698	3.8776	1.6317	1.3248	1.5958	2.5534
Columns 197 through 203	2.8716	1.9790	2.1500	2.3894	2.2504	0.9723	2.1713
Columns 204 through 210	1.7764	1.1550	1.3038	2.9428	2.2510	1.9521	1.9740
Columns 211 through 217	3.5824	3.5569	1.5482	1.2297	2.1429	1.7567	1.9466

Lampiran 10. (Lanjutan)

Columns 218 through 220
2.6734 2.4150 1.3836

Robust scale
1.9384

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**Lampiran 11. Fungsi Pengaruh $\psi(d_i)$ untuk *Training set*
Kelompok 1**

psi							
Columns 1 through 7	2.0399	3.9057	3.4296	4.8858	4.6130	5.0995	4.0181
Columns 8 through 14	3.4790	2.8184	4.0793	3.4719	5.1150	3.0638	4.0942
Columns 15 through 21	2.2872	5.2470	5.3842	4.5512	4.8446	3.5307	3.3593
Columns 22 through 28	3.4800	3.3265	2.9498	4.1069	3.4416	4.1815	2.2546
Columns 29 through 35	4.9667	1.8096	5.3985	4.9761	5.2396	3.2123	4.9102
Columns 36 through 42	4.4098	2.0650	1.5654	5.0976	2.6760	2.2050	4.1241
Columns 43 through 49	4.2721	3.9318	1.8607	3.6849	2.6277	5.0268	3.0120
Columns 50 through 56	4.7265	2.4380	2.2118	2.9620	4.8416	3.2884	3.5322
Columns 57 through 63	3.6260	3.7769	4.8702	4.3966	3.2713	2.5502	3.3081
Columns 64 through 70	4.2561	5.3583	3.0245	2.5141	4.3304	3.1329	3.4956
Columns 71 through 77	3.3038	2.5448	3.6408	2.9976	3.5019	2.2592	1.6476
Columns 78 through 84	3.8959	4.7297	1.8807	4.5807	2.5020	2.8098	5.1811
Columns 85 through 91	4.7488	3.0000	3.5423	3.5412	4.4748	4.3767	3.9425
Columns 92 through 98	4.2320	3.8319	2.1200	2.7180	4.2639	2.0965	3.7370
Columns 99 through 105	2.8929	5.3860	4.5387	3.0575	1.9784	3.3658	3.0393
Columns 106 through 112	1.9865	3.7723	3.3328	3.1615	3.1792	2.8930	3.1838

Lampiran 11. (Lanjutan)

Columns 113 through 119	4.7563	2.9615	3.6074	4.6651	3.1163	4.0467	2.2064
Columns 120 through 126	2.2319	2.0740	2.4700	1.9588	3.4224	5.2074	5.1133
Columns 127 through 133	3.8933	4.1923	2.4785	2.1874	2.8881	4.0371	4.7829
Columns 134 through 140	2.1650	3.0193	3.3473	3.9771	5.3428	4.5536	4.0192
Columns 141 through 147	3.4518	2.1430	3.3639	2.8669	4.5863	3.7850	2.9957
Columns 148 through 154	3.9652	4.4424	2.8658	3.1999	3.7846	4.3649	2.3145
Columns 155 through 161	4.8343	5.0047	5.0480	3.7560	1.9417	4.0595	5.0362
Columns 162 through 168	3.2154	4.8332	5.3598	5.0009	5.3575	5.0260	3.8455
Columns 169 through 175	3.0718	1.9054	5.1582	3.2715	3.6988	5.0258	3.5603
Columns 176 through 182	4.6088	2.9525	4.0913	4.8897	4.7848	3.7638	2.1650
Columns 183 through 189	4.8265	4.0700	1.9123	3.9185	2.7621	5.3666	4.4254
Columns 190 through 196	2.3929	4.8269	5.3223	2.9878	2.4738	2.9294	4.2924
Columns 197 through 203	4.6406	3.5259	3.7714	4.0908	3.9087	1.8473	3.8009
Columns 204 through 210	3.2181	2.1764	2.4374	4.7102	3.9096	3.4860	3.5185
Columns 211 through 217	5.1922	5.1781	2.8513	2.3084	3.7614	3.1874	3.4778
Columns 218 through 220	4.4307	4.1232	2.5748				

**Lampiran 12. Fungsi Pembobot $w(d_i)$ untuk *Training set*
Kelompok 1**

u							
Columns 1 through 7	0.9756	0.8963	0.9242	0.8031	0.8367	0.7677	0.8885
Columns 8 through 14	0.9216	0.9514	0.8841	0.9220	0.7647	0.9415	0.8830
Columns 15 through 21	0.9690	0.7334	0.6055	0.8432	0.8088	0.2698	0.9278
Columns 22 through 28	0.9216	0.9294	0.9462	0.8820	0.9236	0.8763	0.9699
Columns 29 through 35	0.4682	0.9810	0.6570	0.7895	0.7355	0.9348	0.7996
Columns 36 through 42	0.8569	0.9750	0.1003	0.7681	0.9566	0.9713	0.8807
Columns 43 through 49	0.8690	0.8945	0.9799	0.9101	0.9582	0.7811	0.9436
Columns 50 through 56	0.8238	0.9645	0.9711	0.9457	0.8092	0.9313	0.9188
Columns 57 through 63	0.9135	0.9046	0.8053	0.8581	0.9321	0.9609	0.9303
Columns 64 through 70	0.8703	0.6911	0.9431	0.9620	0.8640	0.9384	0.9208
Columns 71 through 77	0.9305	0.9610	0.9127	0.9442	0.9204	0.1534	0.9843
Columns 78 through 84	0.8969	0.8234	0.9794	0.8401	0.9624	0.9517	0.7503
Columns 85 through 91	0.8211	0.9441	0.9182	0.9183	0.8508	0.8599	0.8938
Columns 92 through 98	0.8723	0.9011	0.9736	0.9551	0.8696	0.9742	0.9070
Columns 99 through 105	0.9485	0.6721	0.8445	0.9417	0.9771	0.9275	0.9425
Columns 106 through 112	0.9769	0.9048	0.9291	0.9372	0.9364	0.9485	0.9361

Lampiran 12. (Lanjutan)

Columns 113 through 119	0.8202	0.9457	0.9146	0.8309	0.9392	0.8865	0.9712
Columns 120 through 126	0.9705	0.9748	0.9635	0.9776	0.9246	0.7440	0.7650
Columns 127 through 133	0.8971	0.8755	0.9632	0.9718	0.9487	0.8872	0.8169
Columns 134 through 140	0.9724	0.9433	0.9284	0.8914	0.6991	0.8429	0.8885
Columns 141 through 147	0.9231	0.9730	0.9276	0.9495	0.8395	0.9041	0.9443
Columns 148 through 154	0.8922	0.8539	0.9495	0.9354	0.9041	0.8610	0.9682
Columns 155 through 161	0.8102	0.7848	0.7774	0.9059	0.9780	0.8856	0.7794
Columns 162 through 168	0.9347	0.8103	0.5876	0.7855	0.6916	0.7812	0.9002
Columns 169 through 175	0.9411	0.9788	0.5128	0.9321	0.9093	0.4808	0.9172
Columns 176 through 182	0.8371	0.9461	0.8832	0.8025	0.8166	0.9054	0.9724
Columns 183 through 189	0.8112	0.8848	0.9787	0.8954	0.9535	0.5919	0.8555
Columns 190 through 196	0.9659	0.8112	0.7081	0.9447	0.9633	0.9470	0.8673
Columns 197 through 203	0.8337	0.9191	0.9049	0.8832	0.8961	0.9802	0.9031
Columns 204 through 210	0.9346	0.9721	0.9645	0.8257	0.8960	0.9213	0.9195
Columns 211 through 217	0.7477	0.7510	0.9501	0.9684	0.9055	0.9360	0.9217
Columns 218 through 220	0.8550	0.8808	0.9600				

Lampiran 13. Nilai c , b , d_i^2 robust dan \hat{s} untuk *Training set* Kelompok 2

c	9.7392
b	2.7559
Robust Mahalanobis Distance	
Columns 1 through 7	
2.1324	2.6149 0.8355 2.3046 2.5612 3.0685 3.8892
Columns 8 through 14	
1.4295	2.1738 1.4092 2.1490 3.2022 2.1529 2.4511
Columns 15 through 21	
2.9323	2.4511 2.3893 2.0401 2.4511 1.9336 2.6572
Columns 22 through 26	
1.4991	2.8042 1.9457 1.7103 3.8924
Robust scale	
2.0697	

**Lampiran 14. Fungsi Pengaruh $\psi(d_i)$ untuk *Training set*
Kelompok 2**

psi						
Columns 1 through 7						
4.0004	4.6599	1.7039	4.2505	4.5930	5.1526	5.6868
Columns 8 through 14						
2.8324	4.0619	2.7957	4.0252	5.2720	4.0309	4.4507
Columns 15 through 21						
5.0185	4.4507	4.3677	3.8600	4.4507	3.6927	4.7112
Columns 22 through 26						
2.9573	4.8815	3.7119	3.3249	5.6881		



**Lampiran 15. Fungsi Pembobot $w(d_i)$ untuk *Training set*
Kelompok 2**

u	Columns 1 through 7						
	0.9064	0.8610	0.9853	0.8912	0.8665	0.8113	0.7065
	Columns 8 through 14						
	0.9574	0.9028	0.9586	0.9050	0.7955	0.9047	0.8773
	Columns 15 through 21						
	0.8269	0.8773	0.8833	0.9142	0.8773	0.9227	0.8567
	Columns 22 through 26						
	0.9532	0.8411	0.9218	0.9393	0.7060		



Lampiran 16. Penduga Parameter *Robust* dan Koefisien Diskriminan Linier *Robust*

mu1	26.3114	0.8047	51.5504	25.0487	11.3170	2.5258
mu2	28.5494	1.4148	49.7353	24.8239	11.1682	2.5514
cov1	25.2319	3.6861	10.3459	2.8208	0.0760	11.0903
	3.6861	1.0606	2.4344	0.6309	-0.0039	2.3232
	10.3459	2.4344	88.2912	19.6887	-0.0021	5.3209
	2.8208	0.6309	19.6887	6.9146	-0.1404	1.6248
	0.0760	-0.0039	-0.0021	-0.1404	0.2489	0.0215
	11.0903	2.3232	5.3209	1.6248	0.0215	10.1335
cov2	42.5072	6.7775	1.2740	-0.7323	-1.5957	10.7098
	6.7775	2.8132	3.0274	0.6409	-0.2539	2.8126
	1.2740	3.0274	66.2531	13.6944	0.4465	-4.1972
	-0.7323	0.6409	13.6944	6.1490	0.0465	-0.5628
	-1.5957	-0.2539	0.4465	0.0465	-0.1819	-0.3804
	10.7098	2.8126	-4.1972	-0.5628	-0.3804	7.7449
sigma	27.0578	4.0128	9.3871	2.4453	-0.1007	11.0501
	4.0128	1.2458	2.4971	0.6320	-0.0304	2.3749
	9.3871	2.4971	85.9619	19.0552	0.0453	4.3149
	2.4453	0.6320	19.0552	6.8337	-0.1207	1.3936
	-0.1007	-0.0304	0.0453	-0.1207	0.2418	-0.0210
	11.0501	2.3749	4.3149	1.3936	-0.0210	9.8810
linear	: [-0.0878 -0.7887 0.0518 -0.0541 0.4668 0.2712]					
constant	: 3.9236					

Lampiran 17. Prediksi Pengklasifikasian Obyek pada *Testing set*

No.	X ₁	X ₂	X ₃	X ₄	X ₅	X ₆	Aktual	Skor	Prediksi
1	22	0	46	24	10.8	0	1	4.1942	1
2	24	0	45	24	11.4	0	1	4.2469	1
3	23	0	79	24	12.3	0	1	6.516	1
4	18	0	80	30	11.4	0	1	6.2621	1
5	31	1	55	26	12.5	5	1	5.1229	1
6	22	0	45	24	22.6	0	1	9.6507	1
7	26	2	49	25	10.8	1	1	2.6381	2
8	24	1	56	24	11.2	4	1	5.0195	1
9	38	3	52	29	10.8	8	1	2.6332	2
10	21	0	68	24	11.7	0	1	5.8418	1
11	25	1	50	23.5	11	2	1	4.0122	1
12	31	1	48	25	11	5	1	4.1142	1
13	20	0	51	24	11.8	0	1	5.0956	1
14	36	1	56	25.2	11.3	4	1	3.9476	1
15	26	2	45	23.5	11.3	1.5	1	2.8811	2
16	21	1	47	24	11	2.5	1	4.3165	1
17	24	0	50	24.5	11	0	1	4.2922	1
18	37	1	56	29	11	5	1	3.7854	2
19	35	1	47	24	11	8	1	4.5789	1
20	29	1	61	32	11.4	5	1	4.7712	1
21	24	0	47	23.5	10.8	0	1	4.0975	1
22	21	0	46	22.5	11.2	0	1	4.5499	1
23	36	2	42	24.1	11.8	11	1	4.625	1
24	24	1	70	31	11	4	1	5.2726	1
25	28	1	50	27	11	11	1	6.0002	1
26	25	1	50	23.5	11.2	4	1	4.6479	1
27	21	0	48	22.5	11.4	0	1	4.7469	1
28	34	2	47	23.6	11.5	6	1	3.5906	2

Lampiran 17. (Lanjutan)

No.	X ₁	X ₂	X ₃	X ₄	X ₅	X ₆	Aktual	Skor	Prediksi
29	29	1	59	26	11	6	1	5.0767	1
30	28	1	46	24	12	4	1	4.5237	1
31	22	0	45	25	11.6	0	1	4.4618	1
32	27	1	65	31	11.8	4	1	5.1236	1
33	18	0	42.5	23	10.2	0	1	4.1382	1
34	21	0	48	23.5	11	0	1	4.5061	1
35	23	1	51	22	11	0.7	1	3.9681	1
36	20	0	38	23.5	11	0	1	4.0759	1
37	28	1	49.5	24	11	6	1	4.7806	1
38	20	0	48.5	22.5	11	0	1	4.6739	1
39	27	1	52	24	11	5	1	4.7267	1
40	22	0	46	21	11.5	0	1	4.6833	1
41	24	1	44	22.5	10.8	6	1	4.8347	1
42	22	0	41	20	11.8	0	1	4.6184	1
43	21	1	52	23.5	11	0	1	3.9246	1
44	27	1	57	25	10.4	5	1	4.6515	1
45	32	0	55	28	11	0	1	3.6594	2
46	26	0	59	30	11.4	0	1	4.4719	1
47	30	2	45.5	24.5	11	3	1	2.7685	2
48	21	0	80	32	11.6	0	1	5.9839	1
49	21	0	50	24	11.8	0	1	4.956	1
50	32	2	48	23	11.4	4	1	3.2614	2
51	29	1	43	23.4	11.7	10	1	5.8001	1
52	32	2	54	25	11	7	1	4.0909	1
53	22	1	75	28	11.4	1.2	1	5.2969	1
54	24	1	70	27	11.4	4	1	5.6757	1
55	26	0	53	25	12	0	1	4.7117	1
56	30	2	40	24	11.2	10	1	4.5024	1

Lampiran 17. (Lanjutan)

No.	X ₁	X ₂	X ₃	X ₄	X ₅	X ₆	Aktual	Skor	Prediksi
57	26	0	38	22	11	0	2	3.6302	2
58	24	0	31	18	11	0	2	3.6596	2
59	24	0	47	24	11	0	2	4.1638	1
60	24	0	45.5	21	11.8	0	2	4.6218	1
61	25	0	50	25	12	0	2	4.6441	1
62	20	0	45	24	11	0	2	4.4114	1



Lampiran 18. Syntax Pengujian Sebaran Normal Multivariat

Source Code	Keterangan
<pre>d<-read.delim("e:\\syntax multivariate\\multivariate normal\\data.txt")</pre>	<p>Memanggil data dalam sub file “multivariate normal” dalam file “syntax multivariate” yang terletak pada Local Disk (E:).</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\input data.txt")</pre>	<p>Memanggil fungsi input data dalam bentuk matriks.</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\mu.txt")</pre>	<p>Memanggil fungsi perhitungan vektor rata-rata ($\underline{\mu}$).</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\input x.mu.txt")</pre>	<p>Memanggil fungsi perhitungan ($\underline{x}_i - \underline{\mu}$)</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\covariance.txt")</pre>	<p>Memanggil fungsi perhitungan matriks ragam peragam (Σ).</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\mahalanobis.txt")</pre>	<p>Memanggil fungsi perhitungan jarak <i>Mahalanobis</i> $d_i^2 = (\underline{x}_i - \underline{\mu})^T \Sigma^{-1} (\underline{x}_i - \underline{\mu})$</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\chis.txt")</pre>	<p>Memanggil fungsi perhitungan nilai $\chi_{p,\alpha}^2$</p>
<pre>source("e:\\syntax multivariate\\multivariate normal\\qqplot.txt")</pre>	<p>Memanggil fungsi Q-Q plot (plot antara d_i^2 dengan χ^2).</p>
<pre>data=input.data(d) mu=input.mu(data) x.mu=input.xmu(data,mu) cova=covariance(d) mahalanobis=mahalanobis(d,x.mu,cova) chi.sq=chi(d) qqplot=grafikqq(mahalanobis,chi.sq)</pre>	<p>Menjalankan semua fungsi yang telah dipanggil sebelumnya.</p>

Lampiran 18a. Fungsi input data dalam bentuk matriks

```
input.data=function(d)
{
n=nrow(d)
m=ncol(d)

d=t(t(d))
data=matrix(d,n,m)
}
```

Lampiran 18b. Fungsi perhitungan vektor rata-rata ($\underline{\mu}$)

```
input.mu=function(data)
{
m=ncol(data)
mu=array(c(1),m)
for (i in 1:m)
{
mu[i]=mean(data[,i])}
i=1:m
mu=mu[i]
mu=t(mu)
}
```

Lampiran 18c. Fungsi perhitungan ($\underline{x}_i - \underline{\mu}$)

```
input.xmu=function(d,mu)
{
n=nrow(d)
m=ncol(d)
DATA=matrix(t(data))
i=0
j=0
l=0
k=c()
M=c()
v=c()
z=matrix()
```

Lampiran 18c. (Lanjutan)

```
for (j in 1:n) {  
  a1=(1+m*(j-1))  
  a2= (m+m*(j-1))  
  v[[1+j]]=c(t(DATA[a1:a2]))-mu)  
}  
M=unlist(v)  
x.mu=matrix(M,m,n)  
x.mu=t(x.mu)  
}
```

Lampiran 18d. Fungsi perhitungan *inverse* dari matriks ragam peragam (Σ^{-1})

```
covariance=function(d)  
{  
  cova=cov(d)  
  cova.1=solve(cova)  
}
```

Lampiran 18e. Fungsi perhitungan jarak *Mahalanobis* (d_i^2)

```
mahalanobis=function(d, x.mu, cov.1)  
{  
  n=nrow(d)  
  for(i in 1:n)  
  {  
    x.mu[i,1:6]=x.mu[i,1:6]}  
  
  i=1:n  
  md.2=x.mu[i,1:6]%*%cov.1%*%t(x.mu[i,1:6])  
  md.2=t(t(sort(diag(md.2))))  
}
```

Lampiran 18f. Fungsi perhitungan nilai $\chi^2_{p,\alpha}$

```
chi=function(d)
{
  n=nrow(d)
  m=ncol(d)
  alpha=array(c(1),n)
  for (i in 1:n)
  {
    alpha[i]=(i-0.5)/n}
  i=1:n
  alpha=alpha[i]

  chi.sq=qchisq(c(alpha), df=m, lower.tail=FALSE)
  chi.sq=t(t(chi.sq))
}
```

Lampiran 18g. Fungsi Q-Q plot

```
grafikqq=function(md.2,chi.sq)
{
  qqplot(md.2,chi.sq,xlab="Mahalanobis
Distance",ylab="Chi_Square", main= "Normality Test -
QQ Plot")
}
```

Lampiran 19. Syntax Identifikasi Pencilan

Source Code	Keterangan
<pre>d<-read.delim("e:\\syntax multivariate\\multivariate outlier\\data.txt")</pre>	<p>Memanggil data dalam sub file “multivariate outlier” dalam file “syntax multivariate” yang terletak pada Local Disk (E:).</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\input data.txt")</pre>	<p>Memanggil fungsi input data dalam bentuk matriks.</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\mu.txt")</pre>	<p>Memanggil fungsi perhitungan vektor rata-rata ($\underline{\mu}$).</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\input x.mu.txt")</pre>	<p>Memanggil fungsi perhitungan ($\underline{x}_i - \underline{\mu}$)</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\covariance.txt")</pre>	<p>Memanggil fungsi perhitungan matriks ragam peragam (Σ).</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\mahalanobis.txt")</pre>	<p>Memanggil fungsi perhitungan jarak <i>Mahalanobis</i> $d_i^2 = (\underline{x}_i - \underline{\mu})^T \Sigma^{-1} (\underline{x}_i - \underline{\mu})$</p>
<pre>source("e:\\syntax multivariate\\multivariate outlier\\decision.txt")</pre>	<p>Memanggil fungsi perhitungan identifikasi pencilan (d_i^2 dibandingkan dengan χ^2).</p>
<pre>data=input.data(d) mu=input.mu(data) x.mu=input.xmu(data,mu) cova=covariance(d) mahalanobis=mahalanobis(d,x.mu,cova) decision=decision(mahalanobis,chi.sq)</pre>	<p>Menjalankan semua fungsi yang telah dipanggil sebelumnya.</p>

Lampiran 19a. Fungsi input data dalam bentuk matriks

```
input.data=function(d)
{
n=nrow(d)
m=ncol(d)

d=t(t(d))
data=matrix(d,n,m)
}
```

Lampiran 19b. Fungsi perhitungan vektor rata-rata ($\underline{\mu}$)

```
input.mu=function(data)
{
m=ncol(data)
mu=array(c(1),m)
for (i in 1:m)
{
mu[i]=mean(data[,i])}
i=1:m
mu=mu[i]
mu=t(mu)
}
```

Lampiran 19c. Fungsi perhitungan ($\underline{x}_i - \underline{\mu}$)

```
input.xmu=function(d,mu)
{
n=nrow(d)
m=ncol(d)
DATA=matrix(t(data))
i=0
j=0
l=0
k=c()
M=c()
v=c()
z=matrix()
for (j in 1:n)
```

Lampiran 19c. (Lanjutan)

```
{
a1=(1+m*(j-1))
a2= (m+m*(j-1))
v[[1+j]]=c(t(DATA[a1:a2])-mu)
}
M=unlist(v)
x.mu=matrix(M,m,n)
x.mu=t(x.mu)
}
```

Lampiran 19d. Fungsi perhitungan *inverse* dari matriks ragam peragam (Σ^{-1})

```
covariance=function(d)
{
cova=cov(d)
cova.1=solve(cova)
}
```

Lampiran 19e. Fungsi perhitungan jarak *Mahalanobis* (d_i^2)

```
mahalanobis=function(d,x.mu,cova.1)
{
n=nrow(d)
for(i in 1:n)
{
x.mu[i,1:6]=x.mu[i,1:6]}

i=1:n
md.2=x.mu[i,1:6]%%cova.1%%t(x.mu[i,1:6])
md.2=t(t(diag(md.2)))
}
```

Lampiran 19f. Fungsi identifikasi pencilan

```
decision=function(md.2,chi.sq)
{
N=nrow(md.2)
m=ncol(data)
chi.sq=qchisq(c(0.025), df=m, lower.tail=FALSE)

cat ("\n")
cat ("Chi.sq =",chi.sq,"\n")
cat ("\n")

for (i in 1:N)
{
if(md.2[i] < chi.sq)
cat ("x-",i,"=",md.2[i],"--> bukan pencilan\n") else
cat ("x-",i,"=",md.2[i],"--> pencilan\n")
}

cat ("\n")
}
```


Lampiran 20. *Syntax* Pendugaan Parameter *Robust* dengan Metode Penduga-S menggunakan Algoritma *SURREAL*

Source Code	Keterangan
<pre>function res = Sm(x,nsamp,bdp) tol=1e-5; s=10e10; [n,p] = size(x); c = Tbsc(bdp,p); b = (c/6)* Tbsb(c,p); la = 1; for loop=1:nsamp ranset=randomset(n,p+1); xj = x(ranset,:); mu=mean(xj); xjcenter = xj-repmat(mu,p+1,1); cov = (xjcenter'*xjcenter)/(p+1); determ = det(cov); if determ > 1e-15 if determ^(1/p)> 1e-5 cov = (determ^(-1/p)).*cov; if loop > ceil(nsamp/5) if loop == ceil(nsamp/2) la=2; elseif loop == ceil(nsamp*(0.8)) la=4; end random = rand(1)^la; mu = random*mu+(1-random)*mu_opt; end end end end</pre>	<p>Fungsi untuk menjalankan algoritma <i>SURREAL</i> penduga-S.</p> <p>Batas penduga parameter konsisten.</p> <p>Data dalam bentuk matriks X berukuran $n \times p$.</p> <p>Nilai c untuk mencapai <i>breakdown point</i> (bdp) yang diinginkan.</p> <p>b adalah nilai harapan dari $\rho(d_i)$ yang diasumsikan menyebar Multivariat Gaussian.</p> <p>Dilakukan iterasi/ perulangan hingga $nsamp$ kali.</p> <p>Memilih sub contoh acak $p+1$ dari data berukuran n.</p> <p>Sebanyak $p+1$ pengamatan yang diambil secara acak.</p> <p>Menghitung vektor rata-rata.</p> <p>Menghitung $(\underline{x}_i - \underline{\mu})$</p> <p>Menghitung matriks ragam peragam (Σ).</p> <p>Menghitung Σ</p> <p>Dilakukan iterasi/ perulangan hingga diperoleh Σ yang paling minimum</p>

Lampiran 20. (Lanjutan)

```

cov = random*cov+(1-random)*cov_opt;
end
determ = det(cov);
cov = (determ^(-1/p)).*cov;
md = mahalnobis(x,mu,cov,n,p);
md = md.^(1/2);

if mean(rhobiweight(md/s,c)) < b

if s < 5e10
s = sestck(md,s,c,b,tol);
else
s = sestck(md,0,c,b,tol);
end

mu_opt = mu;
cov_opt = cov;
md_opt = md;

psi = psibiweight(md,s*c);

u = psi./md;
ubig = repmat(u',1,p);

mu = mean(ubig.*x)./mean(u);

xcenter = x-repmat(mu,n,1);
cov = ((ubig.*xcenter)'*xcenter);
cov = (det(cov)^(-1/p)).*cov;
okay = 0;
jj = 1;
while ((jj<3) & (okay~=1))
jj = jj+1;

md =mahalanobis(x,mu,cov,n,p);
md = md.^(1/2);

if mean(rhobiweight(md/s,c))<b
mu_opt = mu;
cov_opt = cov;
md_opt = md;
okay = 1;
if s < 5e10

```

Menghitung jarak

Mahalanobis dengan
| Σ | minimum.

Batasan algoritma *SURREAL*

$$\frac{1}{n} \sum_{i=1}^n \rho(d_i) = b$$

Mencari nilai penduga skala
robust ($\hat{\delta}$) minimum.

Vektor rata-rata, matriks
ragam peragam, dan jarak
Mahalanobis optimal

Menghitung fungsi pengaruh
($\psi(d_i)$)

Menghitung fungsi pembobot
($w(d_i)$)

Menghitung penduga vektor
rata-rata *robust* setiap
kelompok, $k=1,2$ ($\hat{\mu}_{Sk}$)

Menghitung penduga matriks
ragam peragam *robust* setiap
kelompok, $k=1,2$ ($\hat{\Sigma}_{Sk}$)

Menghitung jarak

Mahalanobis yang *robust*

Jika $\frac{1}{n} \sum_{i=1}^n \rho(d_i/\hat{\delta}) < b$,

maka $\hat{\mu}_{Sk}$ = vektor rata-rata
optimal, $\hat{\Sigma}_{Sk}$ = matriks ragam
peragam optimal, d_{is}^2 = jarak
Mahalanobis optimal dengan

Lampiran 20. (Lanjutan)

```
s = sestck(md,s,c,k,tol);
else
s = sestck(md,0,c,k,tol);
end
else
mu = (mu+mu_opt)/2;
cov = (cov+cov_opt)./2;
cov = (determ^(-1/p)).*cov;
end
end
end
end
end
end
cov_opt=s^2*cov_opt;
md_opt=md_opt/s;

res.mean = mu_opt;
res.covariance = cov_opt;
res.distances = md_opt;
res.scale = s;

disp('c');
disp([c]);
disp('k');
disp([k]);
disp('psi');
disp([psi]);
disp('u');
disp([u]);
fprintf('\nScale = %8.3f\n',s);
disp('Robust Mahalanobis Distance');
disp([md_opt]);
disp('Robust scale');
disp([s]);
```

nilai penduga skala *robust* (\hat{s}) minimal.

Jarak *Mahalanobis* dengan nilai penduga skala *robust* (\hat{s}) minimal.

Keluaran hasil perhitungan algoritma *SURREAL* yaitu $\underline{\mu}_{sk}$, $\underline{\Sigma}_{sk}$, d_{is}^2 , dan \hat{s} .

Menampilkan nilai-nilai yang ingin diketahui selain keluaran hasil perhitungan algoritma *SURREAL*.

Lampiran 20a. Fungsi perhitungan jarak Mahalanobis

```
function mah = mahalnobis(dat,meanvct,covmat,n,p)
for k=1:p
    d = covmat(k,k);
    covmat(k,:) = covmat(k,+)/d;
    rows = setdiff(1:p,k);
    b = covmat(rows,k);
    covmat(rows,:) = covmat(rows,)-b*covmat(k,);
    covmat(rows,k) = -b/d;
    covmat(k,k) = 1/d;
end

hlp = dat-repmat(meanvct,n,1);
mah = sum(hlp*covmat.*hlp,2)';
```

Lampiran 20b. Fungsi perhitungan $\psi(d_i)$ dengan c konstan untuk semua

```
function psi = psibiweight(x,c)
hulp = x-2.*x.^3/(c^2)+x.^5/(c^4);
psi = hulp.*(abs(x)<c);
```

Lampiran 20c. Fungsi untuk pengambilan sub contoh secara acak sebanyak $p+1$ dari data berukuran n .

```
function ranset = randomset(tot,nel)
ranper=randperm(tot);
ranset=ranper(1:nel);
```

Lampiran 20d. Fungsi perhitungan $\rho(d_i)$ dengan c konstan untuk semua

```
function rho = rhobiweight(x,c)

hulp = x.^2/2-x.^4/(2*c^2)+x.^6/(6*c^4);
rho = hulp.*(abs(x)<c)+c^2/6.*(abs(x)>=c);
```

Lampiran 20e. Fungsi perhitungan penduga skala *robust* (\hat{s})

```
function scale = sestck(x,start,c,k,tol)

% Computes Tukey's biweight objectief function (scale)
% corresponding
% with the mahalanobis distances x.

if start>0
    s = start;
else y=abs(x);
    [n,p]=size(x);
    if ((n==1) & (p>1))
        x = x'; [n,p] = size(x);
    end
    x = sort(x);
    if floor(n/2) == n/2
        s = (x(n/2,:) + x((n+2)/2,:))/2;
    else
        s = x((n+1)/2,:);
    end
    s = s/0.6745;
end
crit = 2*tol;
rhoold = mean(rhobiweight(x/s,c))-k;
while crit >= tol
    delta =
rhoold/mean(psibiweight(x/s,c).*(x/(s^2)));
    isqu = 1; okay = 0;
    while ((isqu<10) & (okay~=1))
        rhonew = mean(rhobiweight(x/(s+delta),c))-k;
        if abs(rhonew) < abs(rhoold)
            s = s+delta;
            okay = 1;
        else
```

Lampiran 20e. (Lanjutan)

```
        delta = delta/2;
        isqu = isqu+1;
    end
end
if isqu == 10
    crit = 0;
else
    crit = (abs(rhoold)-
abs(rhonew))/(max([abs(rhonew),tol]));
end
    rhoold = rhonew;
end
scale = abs(s);
```

Lampiran 20f. Fungsi perhitungan nilai b dengan asumsi sebaran Multivariat Gaussian

```
function res = Tbsb(c,p);
y1 = ksiint(c,1,p)*3/c-
ksiint(c,2,p)*3/(c^3)+ksiint(c,3,p)/(c^5);
y2 = c*(1-chi2cdf(c^2,p));
res = y1+y2;
```

Lampiran 20g. Fungsi perhitungan konstanta c

```
function res = Tbsc(alpha,p);
% constant for Tukey Biweight S
talpha = sqrt(chi2inv(1-alpha,p));
maxit = 13;
eps = 1e-8;
diff = 1e6;
ctest = talpha;
iter = 1;
while ((diff>eps) & iter<maxit);
    c = ctest;
    ctest = Tbsb(c,p)/alpha;
    diff = abs(c-ctest);
    iter = iter+1;
end;
res = (ctest);
```

Lampiran 21. Syntax Klasifikasi Ulang Obyek

Source Code	Keterangan
<pre>function res = da(data,'s','l') nsamp=800; bdp=0.15; [n,p] = size(data); dim = p-1; X1 = data(find(data(:,p))==1,1:dim); X2 = data(find(data(:,p))==2,1:dim); n1 = size(X1,1); if strcmp(option1,'c') mu1 = mean(X1); mu2 = mean(X2); cov1 = cov(X1); cov2 = cov(X2); elseif strcmp(option1,'s'); S1=Sm(X1,nsamp,bdp); S2=Sm(X2,nsamp,bdp); mu1 = S1.mean; mu2 = S2.mean; cov1 = S1.covariance; cov2 = S2.covariance; else error('Option1 must be 'c' or 's'.'); end if option2 == 'l' sigma = (n1*cov1+(n-n1)*cov2)/n; res.linear = (mu1-mu2)*inv(sigma); res.constant = 1/2*res.linear*(mu1+mu2)'; res.scores = res.linear*data(1:n,1:dim)' - res.constant ; elseif option2 == 'q' inverscov1 = inv(cov1); inverscov2=inv(cov2);</pre>	<p>Fungsi untuk melakukan klasifikasi obyek dengan analisis diskriminan linier <i>robust</i>.</p> <p>Menetapkan banyak iterasi/ perulangan. Memasukkan besar <i>breakdown point</i> yang diinginkan. Input data dalam bentuk matriks berukuran $n \times p$.</p> <p>Membagi data kelompok 1 dan kelompok 2.</p> <p>Perhitungan penduga parameter menggunakan MLE.</p> <p>Perhitungan penduga parameter menggunakan penduga-S.</p> <p>Memilih salah satu untuk menjalankan fungsi klasifikasi.</p> <p>Perhitungan klasifikasi menggunakan analisis diskriminan linier.</p> <p>Perhitungan klasifikasi menggunakan</p>

Lampiran 21. (Lanjutan)

```
res.quadratic = -1/2*(inverscov1-  
inverscov2);  
res.linear = mu1*inverscov1-  
mu2*inverscov2;  
res.constant = 1/2*log(det(cov1)/det(cov2))  
+...1/2*(mu1*inverscov1*mu1'-mu2*inverscov2  
*mu2');  
Z = (data(1:n,1:dim)*res.quadratic).*data  
(1:n,1:dim);  
Z = sum(Z');  
res.scores = Z+res.linear*data(1:n,1:dim)'+  
res.constant;  
else  
error('Option2 must be ''l'' (linear) or  
''q'' (quadratic).');  
end  
  
res.group = (res.scores < 0) + 1;  
res.miscl = mean(res.group ~= data(:,p));  
  
disp('mu1');  
disp([mu1]);  
disp('mu2');  
disp([mu2]);  
disp('cov1');  
disp([cov1]);  
disp('cov2');  
disp([cov2]);  
disp('sigma');  
disp([sigma]);
```

analisis diskriminan
kuadrat.

Memilih salah satu
untuk menjalankan
fungsi klasifikasi.

Keluaran hasil
klasifikasi ulang
menggunakan
analisis diskriminan
linier *robust*.

Menampilkan nilai-
nilai yang ingin
diketahui selain
keluaran hasil
klasifikasi ulang.