

01월 13일 과제 발표

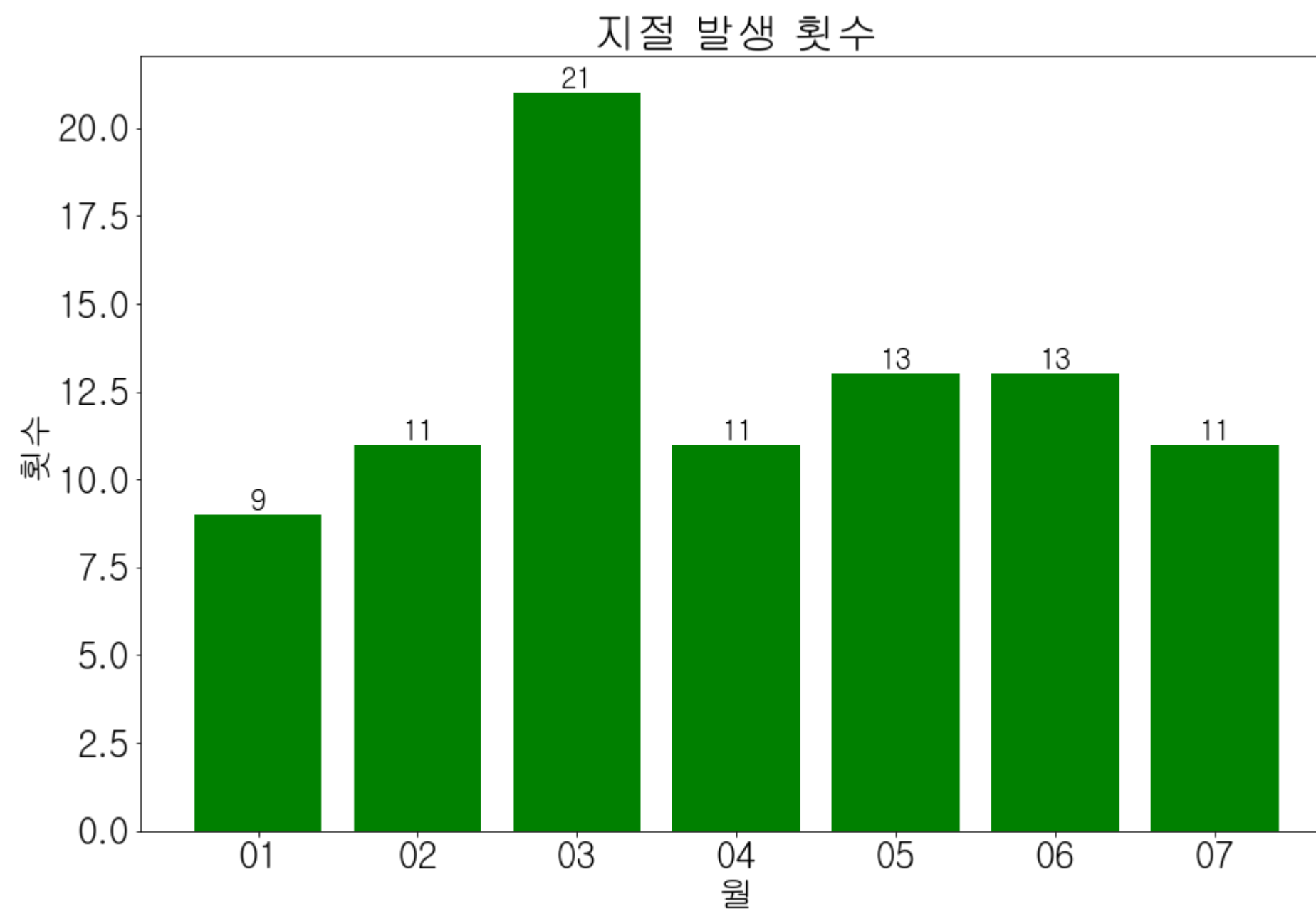
공정 시스템 에너지 절감을 위한 SVM과 t-SNE를 이용한 제지 데이터 분류

이 관 영



1.데이터 전처리

01





1.데이터 전처리

| | 작업시작시간 | 지절 |
|----|---------------------|----|
| 0 | 2022-03-05 19:24:00 | 1 |
| 1 | 2022-03-07 01:52:00 | 1 |
| 2 | 2022-03-07 02:12:00 | 1 |
| 3 | 2022-03-07 04:16:00 | 1 |
| 4 | 2022-03-09 21:30:00 | 1 |
| 5 | 2022-03-09 21:40:00 | 1 |
| 6 | 2022-03-10 20:00:00 | 1 |
| 7 | 2022-03-10 20:24:00 | 1 |
| 8 | 2022-03-11 01:37:00 | 1 |
| 9 | 2022-03-11 04:25:00 | 1 |
| 10 | 2022-03-11 05:17:00 | 1 |
| 11 | 2022-03-12 05:16:00 | 1 |
| 12 | 2022-03-12 05:31:00 | 1 |
| 13 | 2022-03-12 06:36:00 | 1 |
| 14 | 2022-03-12 06:41:00 | 1 |
| 15 | 2022-03-13 18:04:00 | 1 |
| 16 | 2022-03-13 18:36:00 | 1 |
| 17 | 2022-03-13 21:13:00 | 1 |
| 18 | 2022-03-13 21:59:00 | 1 |
| 19 | 2022-03-14 02:37:00 | 1 |
| 20 | 2022-03-18 17:05:00 | 1 |

MES

- 작업시작시간, 지종, 평량, 지절 유무

DCS/QCS

- Sensor values

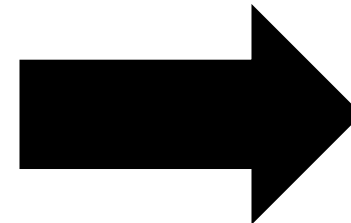
Power

- 공정에서 사용한 전력 에너지



1.데이터 전처리

| 329-GZC9969:av | |
|---------------------|---------|
| 2022-03-01 00:00:00 | 39692.2 |
| 2022-03-01 00:00:01 | 39692.2 |
| 2022-03-01 00:00:02 | NaN |
| 2022-03-01 00:00:03 | 39725.6 |
| 2022-03-01 00:00:04 | NaN |
| 2022-03-01 00:00:05 | NaN |
| 2022-03-01 00:00:06 | 39775.8 |
| 2022-03-01 00:00:07 | 39792.6 |
| 2022-03-01 00:00:08 | NaN |
| 2022-03-01 00:00:09 | NaN |
| 2022-03-01 00:00:10 | 39842.8 |
| 2022-03-01 00:00:11 | NaN |
| 2022-03-01 00:00:12 | 39876.3 |
| 2022-03-01 00:00:13 | 39876.3 |
| 2022-03-01 00:00:14 | NaN |
| 2022-03-01 00:00:15 | NaN |
| 2022-03-01 00:00:16 | NaN |
| 2022-03-01 00:00:17 | NaN |
| 2022-03-01 00:00:18 | NaN |
| 2022-03-01 00:00:19 | NaN |



| 329-GZC9969:av | |
|---------------------|--------------|
| 2022-03-01 00:00:00 | 39692.200000 |
| 2022-03-01 00:00:01 | 39692.200000 |
| 2022-03-01 00:00:02 | 39708.900000 |
| 2022-03-01 00:00:03 | 39725.600000 |
| 2022-03-01 00:00:04 | 39742.333333 |
| 2022-03-01 00:00:05 | 39759.066667 |
| 2022-03-01 00:00:06 | 39775.800000 |
| 2022-03-01 00:00:07 | 39792.600000 |
| 2022-03-01 00:00:08 | 39809.333333 |
| 2022-03-01 00:00:09 | 39826.066667 |
| 2022-03-01 00:00:10 | 39842.800000 |
| 2022-03-01 00:00:11 | 39859.550000 |
| 2022-03-01 00:00:12 | 39876.300000 |
| 2022-03-01 00:00:13 | 39876.300000 |
| 2022-03-01 00:00:14 | 39876.300000 |
| 2022-03-01 00:00:15 | 39876.300000 |
| 2022-03-01 00:00:16 | 39876.300000 |
| 2022-03-01 00:00:17 | 39876.300000 |
| 2022-03-01 00:00:18 | 39876.300000 |
| 2022-03-01 00:00:19 | 39876.300000 |



2.스피어만 상관 계수

| | Corr | P-val | Corr_abs |
|----------------------------------|-----------|----------|----------|
| 지중 | -0.111548 | 0.001101 | 0.111548 |
| HFEMS.MRPAP.01.SH01.PL003.04.PF | -0.108407 | 0.001520 | 0.108407 |
| HFEMS.MRPAP.01.SH01.PL003.03.VA | 0.102661 | 0.002683 | 0.102661 |
| 320PIC7513:me | 0.101311 | 0.003055 | 0.101311 |
| PM3-S5SC.opr:me | 0.100617 | 0.003263 | 0.100617 |
| HFEMS.MRPAP.01.SH01.PL003.03.KW | 0.099899 | 0.003493 | 0.099899 |
| HFEMS.MRPAP.01.SH01.PL003.02.PF | -0.099835 | 0.003514 | 0.099835 |
| 320PIC7544:me | 0.099337 | 0.003682 | 0.099337 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_T | 0.098862 | 0.003850 | 0.098862 |
| 320PIC7508:me | -0.095678 | 0.005163 | 0.095678 |
| 320PDC7516:me | 0.095290 | 0.005348 | 0.095290 |
| 320PIC7505:me | -0.092373 | 0.006941 | 0.092373 |
| HFEMS.MRPAP.01.SH01.PL003.03.VAR | 0.077378 | 0.023822 | 0.077378 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_S | 0.074490 | 0.029600 | 0.074490 |
| 320PIC7514:me | 0.074195 | 0.030253 | 0.074195 |
| 320PDC7520:me | -0.073109 | 0.032763 | 0.073109 |
| HFEMS.MRPAP.01.SH01.PL003.02.KW | 0.071375 | 0.037143 | 0.071375 |
| 320PIC7509:me | -0.069676 | 0.041906 | 0.069676 |
| PM3_ASH_PV | 0.067169 | 0.049869 | 0.067169 |

| | 지중 | 횟수 |
|---|-------------------|----|
| 1 | 네오★백상(100) | 80 |
| 2 | 네오★스노우화이트기지(73) | 53 |
| 3 | 네오★스노우화이트기지(77) | 39 |
| 4 | 네오★스노우화이트기지(62) | 26 |
| 5 | 네오★아트 R10기지(77) | 22 |
| 6 | 네오★라벨기지(67) | 11 |
| 7 | 네오★스노우화이트R10기(67) | 1 |
| 8 | 네오★아트기지(62) | 1 |
| 9 | 네오★아트기지(73) | 1 |

2.스피어만 상관 계수

| | Corr | P-val | Corr_abs |
|----------------------------------|-----------|----------|----------|
| 지중 | -0.111548 | 0.001101 | 0.111548 |
| HFEMS.MRPAP.01.SH01.PL003.04.PF | -0.108407 | 0.001520 | 0.108407 |
| HFEMS.MRPAP.01.SH01.PL003.03.VA | 0.102661 | 0.002683 | 0.102661 |
| 320PIC7513:me | 0.101311 | 0.003055 | 0.101311 |
| PM3-S5SC.opr:me | 0.100617 | 0.003263 | 0.100617 |
| HFEMS.MRPAP.01.SH01.PL003.03.KW | 0.099899 | 0.003493 | 0.099899 |
| HFEMS.MRPAP.01.SH01.PL003.02.PF | -0.099835 | 0.003514 | 0.099835 |
| 320PIC7544:me | 0.099337 | 0.003682 | 0.099337 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_T | 0.098862 | 0.003850 | 0.098862 |
| 320PIC7508:me | -0.095678 | 0.005163 | 0.095678 |
| 320PDC7516:me | 0.095290 | 0.005348 | 0.095290 |
| 320PIC7505:me | -0.092373 | 0.006941 | 0.092373 |
| HFEMS.MRPAP.01.SH01.PL003.03.VAR | 0.077378 | 0.023822 | 0.077378 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_S | 0.074490 | 0.029600 | 0.074490 |
| 320PIC7514:me | 0.074195 | 0.030253 | 0.074195 |
| 320PDC7520:me | -0.073109 | 0.032763 | 0.073109 |
| HFEMS.MRPAP.01.SH01.PL003.02.KW | 0.071375 | 0.037143 | 0.071375 |
| 320PIC7509:me | -0.069676 | 0.041906 | 0.069676 |
| PM3_ASH_PV | 0.067169 | 0.049869 | 0.067169 |

Sensor

| | |
|-----------------|---------------------------|
| 320PIC7513:me | 4nd pre-dry group |
| PM3-S5SC.opr:me | 5G steam pressure |
| 320PIC7544:me | Steam box pressure |
| 320PIC7508:me | 3rd dry cylinder |
| 320PDC7516:me | 1st dry group |
| 320PIC7505:me | 1st dry cylinder pressure |
| 320PIC7514:me | 5th bottom dry group |
| 320PDC7520:me | 4th dry group |
| 320PIC7509:me | 1st dry group |
| PM3_ASH_PV | 회분량 |

2.스피어만 상관 계수

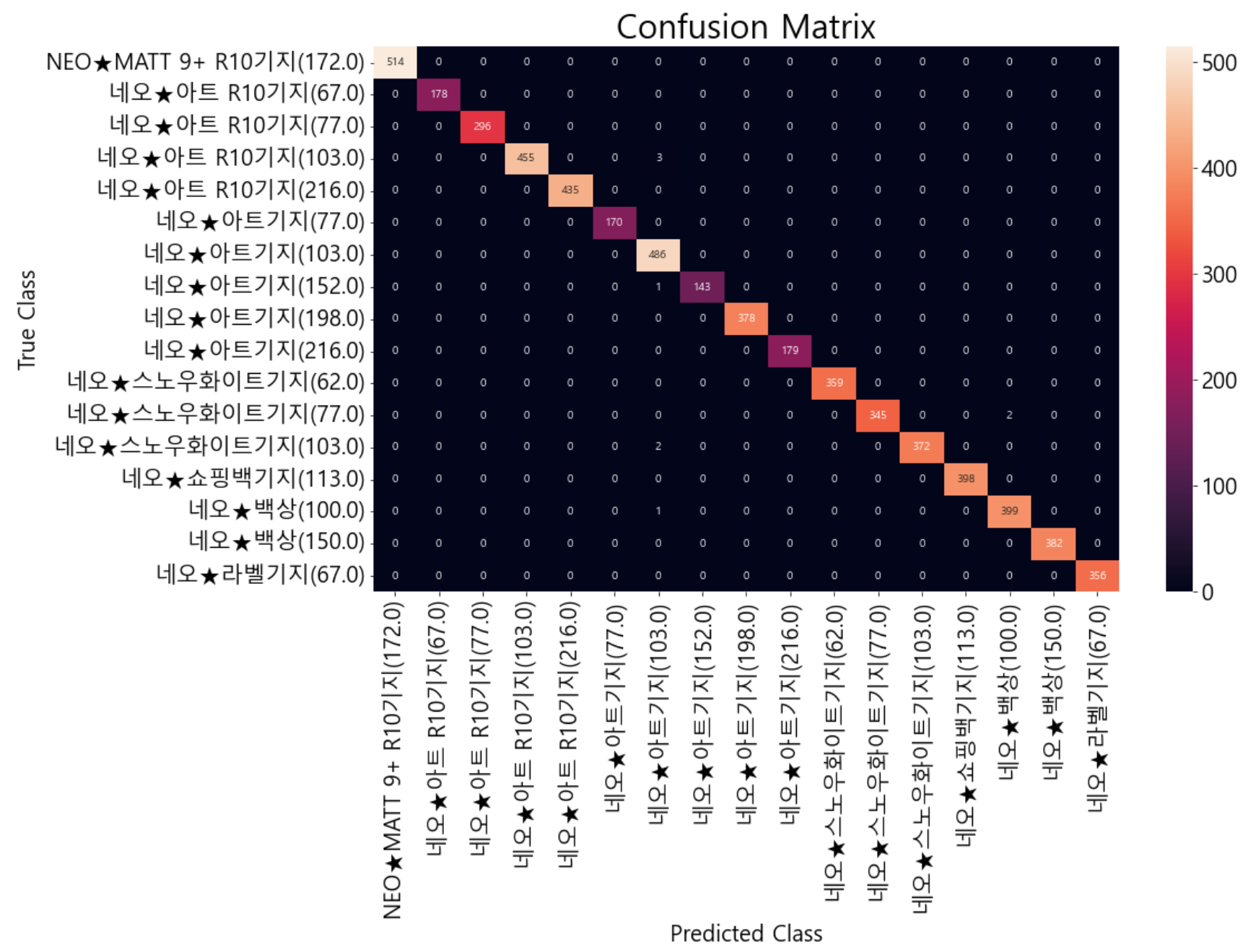
| | Corr | P-val | Corr_abs |
|----------------------------------|-----------|----------|----------|
| 지중 | -0.111548 | 0.001101 | 0.111548 |
| HFEMS.MRPAP.01.SH01.PL003.04.PF | -0.108407 | 0.001520 | 0.108407 |
| HFEMS.MRPAP.01.SH01.PL003.03.VA | 0.102661 | 0.002683 | 0.102661 |
| 320PIC7513:me | 0.101311 | 0.003055 | 0.101311 |
| PM3-S5SC.opr:me | 0.100617 | 0.003263 | 0.100617 |
| HFEMS.MRPAP.01.SH01.PL003.03.KW | 0.099899 | 0.003493 | 0.099899 |
| HFEMS.MRPAP.01.SH01.PL003.02.PF | -0.099835 | 0.003514 | 0.099835 |
| 320PIC7544:me | 0.099337 | 0.003682 | 0.099337 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_T | 0.098862 | 0.003850 | 0.098862 |
| 320PIC7508:me | -0.095678 | 0.005163 | 0.095678 |
| 320PDC7516:me | 0.095290 | 0.005348 | 0.095290 |
| 320PIC7505:me | -0.092373 | 0.006941 | 0.092373 |
| HFEMS.MRPAP.01.SH01.PL003.03.VAR | 0.077378 | 0.023822 | 0.077378 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_S | 0.074490 | 0.029600 | 0.074490 |
| 320PIC7514:me | 0.074195 | 0.030253 | 0.074195 |
| 320PDC7520:me | -0.073109 | 0.032763 | 0.073109 |
| HFEMS.MRPAP.01.SH01.PL003.02.KW | 0.071375 | 0.037143 | 0.071375 |
| 320PIC7509:me | -0.069676 | 0.041906 | 0.069676 |
| PM3_ASH_PV | 0.067169 | 0.049869 | 0.067169 |

Power

| | |
|----------------------------------|-----------------------|
| HFEMS.MRPAP.01.SH01.PL003.04.PF | DRIVE #1,2 역률 |
| HFEMS.MRPAP.01.SH01.PL003.03.VA | 초지저압 2 피상전력 |
| HFEMS.MRPAP.01.SH01.PL003.03.KW | 초지저압 2 유효전력 |
| HFEMS.MRPAP.01.SH01.PL003.02.PF | 초지저압 1,3 CONTROL역률 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_T | 초지저압 2 전류_T |
| HFEMS.MRPAP.01.SH01.PL003.03.VAR | 초지저압 2 무효전력 |
| HFEMS.MRPAP.01.SH01.PL003.03.A_S | 초지저압 2 전류_S |
| HFEMS.MRPAP.01.SH01.PL003.02.KW | 초지저압 1,3 CONTROL 유효전력 |



3.SVM 모델링 분류



MES

Sensor

Power

지종
평량
지절 유무

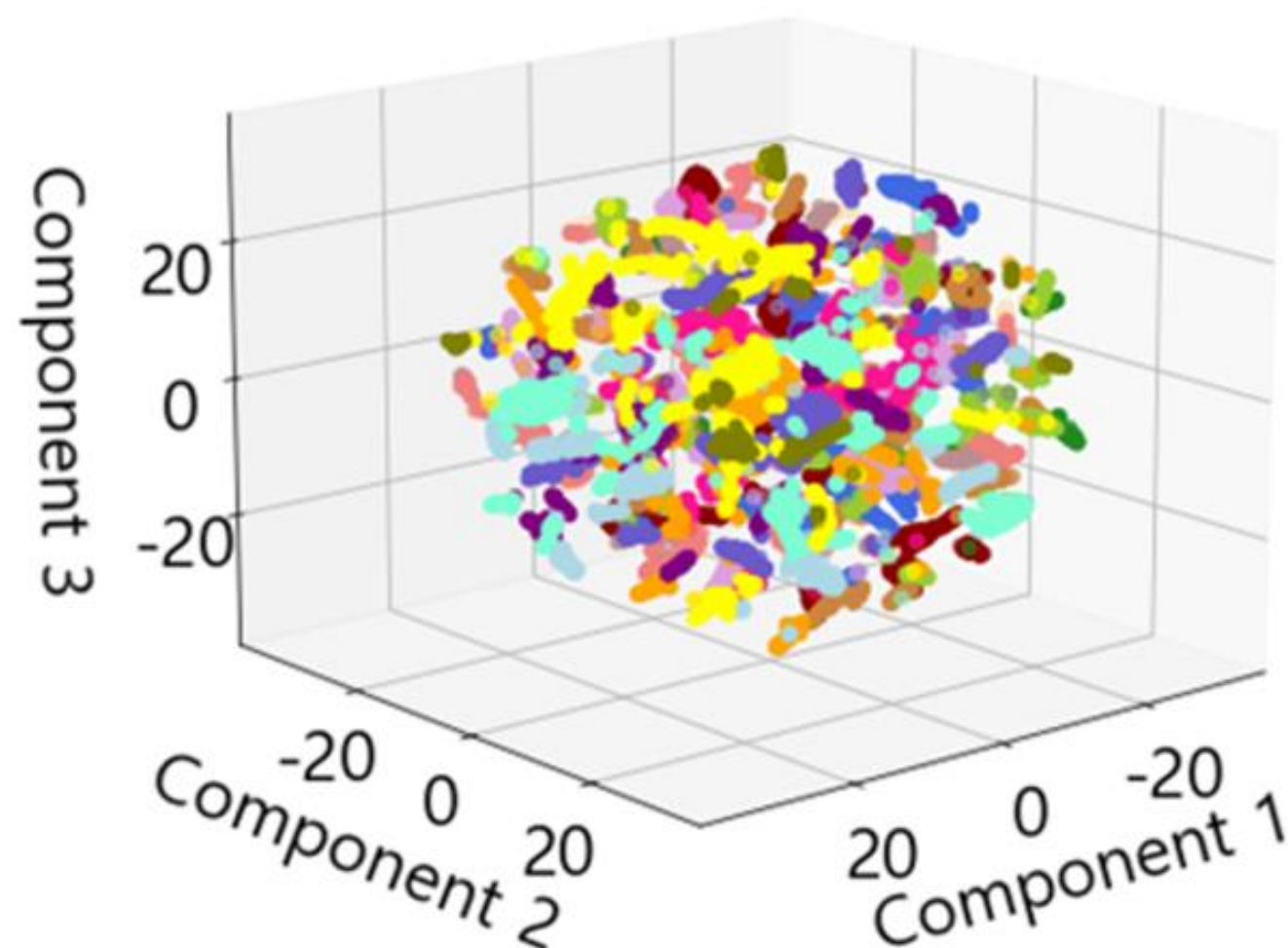
320PIC7513:me
PM3-S5SC.opr:me
320PIC7544:me
320PIC7508:me
320PDC7516:me
320PIC7505:me
320PIC7514:me
320PDC7520:me
320PIC7509:me
PM3_ASH_PV

HFEMS.MRPAP.01.SH01.PL003.04.PF
HFEMS.MRPAP.01.SH01.PL003.03.VA
HFEMS.MRPAP.01.SH01.PL003.03.KW
HFEMS.MRPAP.01.SH01.PL003.02.PF
HFEMS.MRPAP.01.SH01.PL003.03.A_T
HFEMS.MRPAP.01.SH01.PL003.03.VAR
HFEMS.MRPAP.01.SH01.PL003.03.A_S
HFEMS.MRPAP.01.SH01.PL003.02.KW

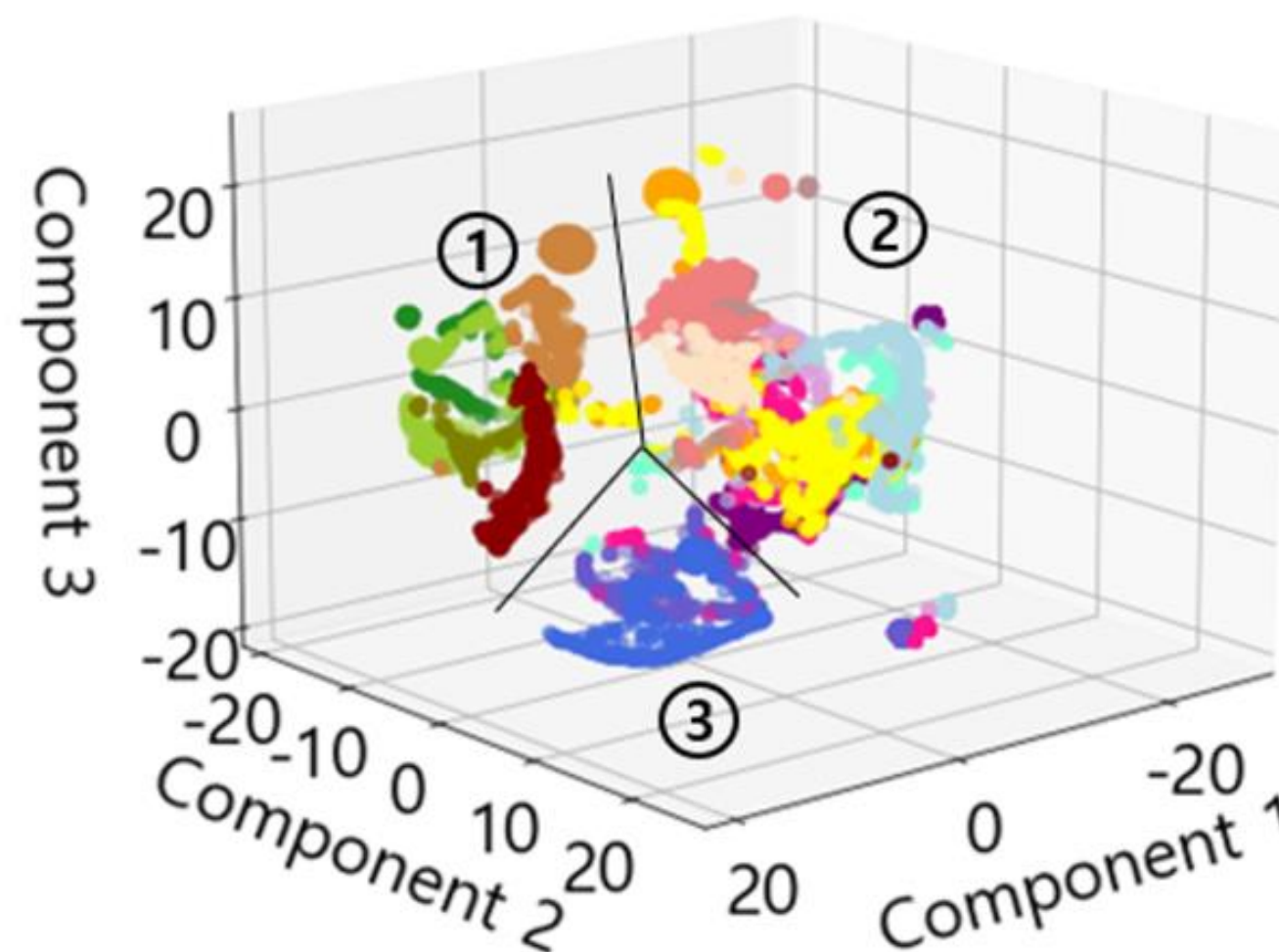
Accuracy(정확도) ≙ 0.98

4.t-SNE

Original

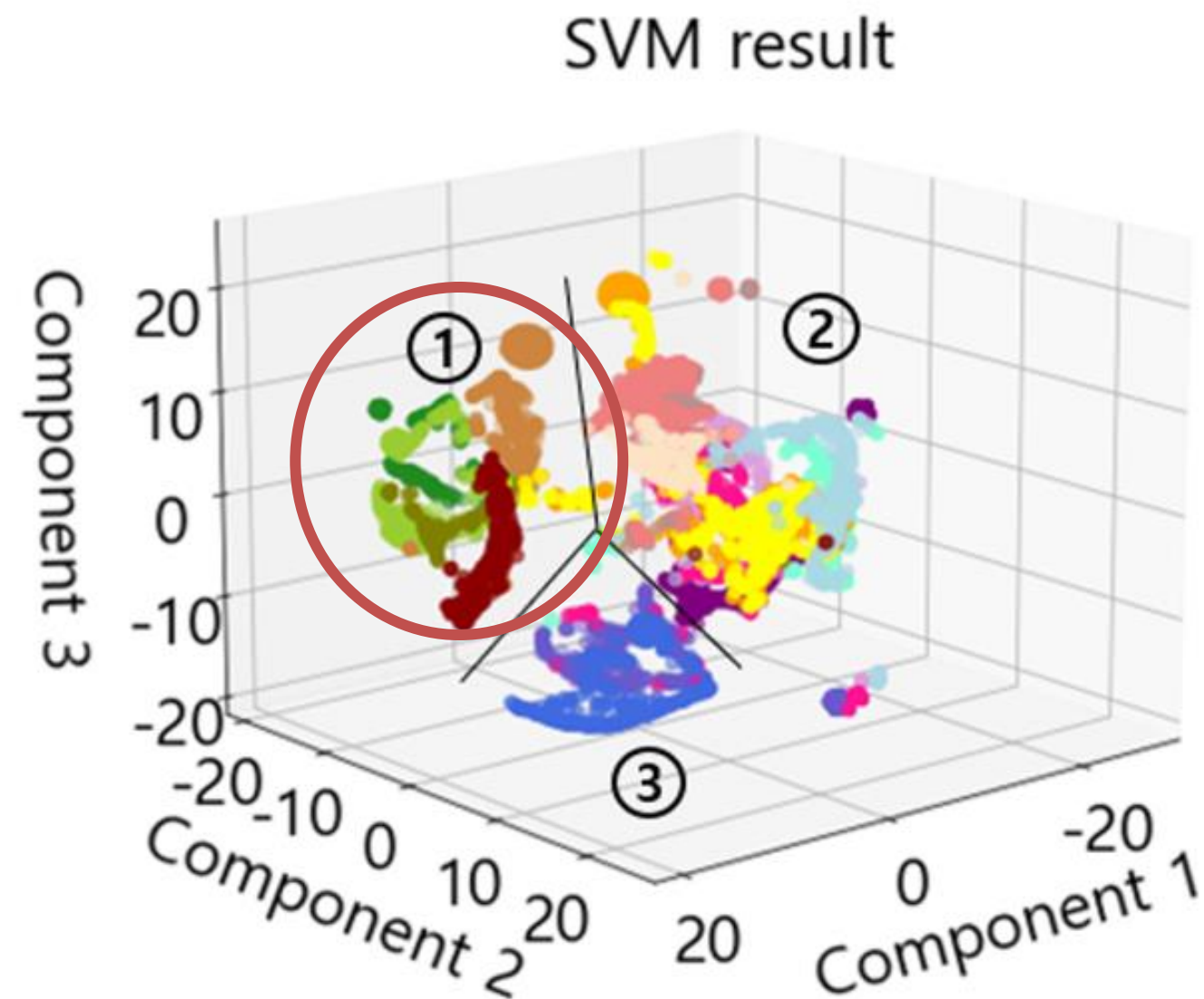


SVM result



- NEO★MATT 9+ R10기지(172.0)
- 네오★아트 R10기지(67.0)
- 네오★아트 R10기지(77.0)
- 네오★아트 R10기지(103.0)
- 네오★아트 R10기지(216.0)
- 네오★아트기지(77.0)
- 네오★아트기지(103.0)
- 네오★아트기지(152.0)
- 네오★아트기지(198.0)
- 네오★아트기지(216.0)
- 네오★스노우화이트기지(62.0)
- 네오★스노우화이트기지(77.0)
- 네오★스노우화이트기지(103.0)
- 네오★쇼핑백기지(113.0)
- 네오★백상(100.0)
- 네오★백상(150.0)
- 네오★백상(180.0)

4.t-SNE

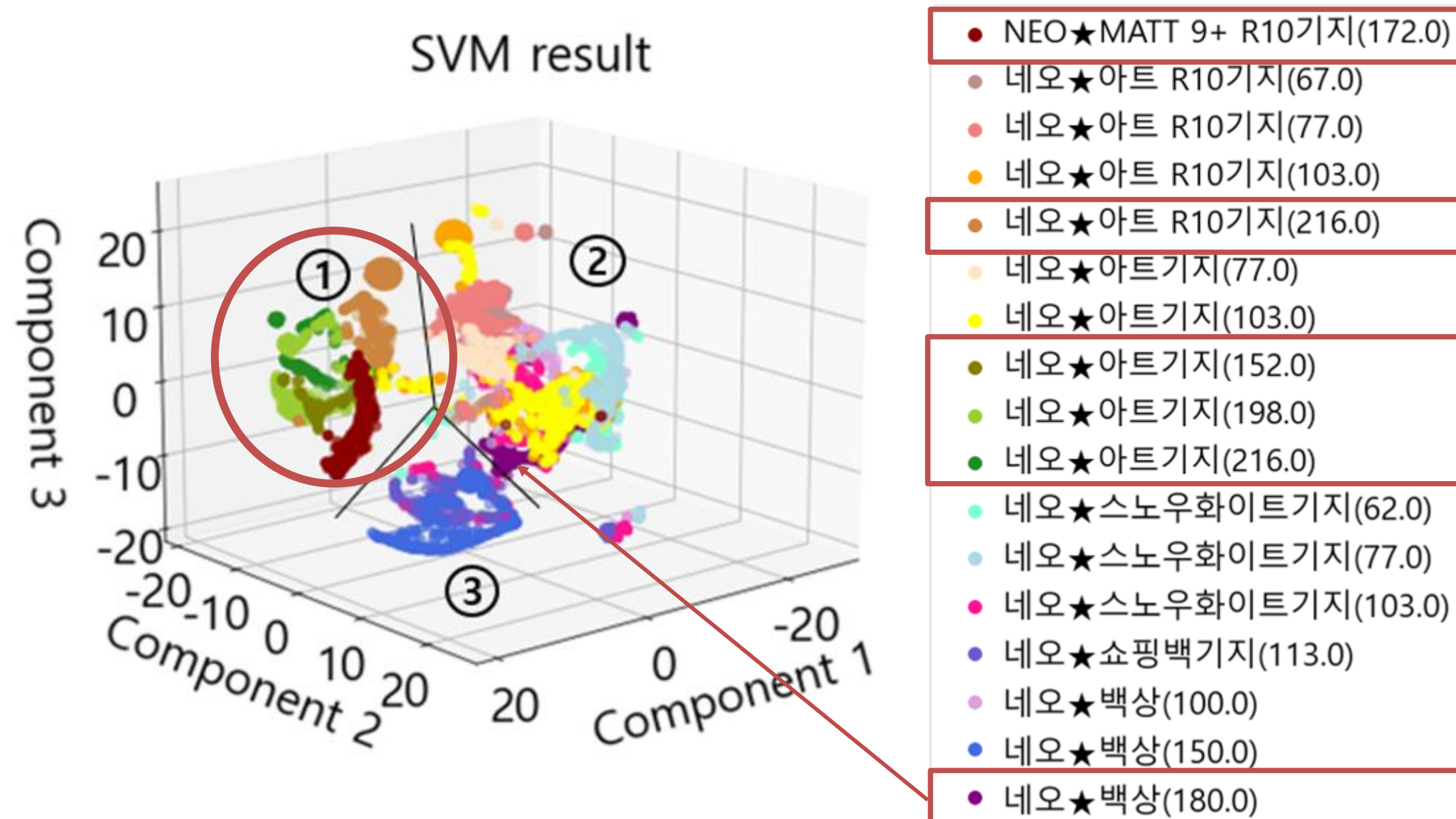


- NEO★MATT 9+ R10기지(172.0)
- 네오★아트 R10기지(67.0)
- 네오★아트 R10기지(77.0)
- 네오★아트 R10기지(103.0)
- 네오★아트 R10기지(216.0)
- 네오★아트기지(77.0)
- 네오★아트기지(103.0)
- 네오★아트기지(152.0)
- 네오★아트기지(198.0)
- 네오★아트기지(216.0)
- 네오★스노우화이트기지(62.0)
- 네오★스노우화이트기지(77.0)
- 네오★스노우화이트기지(103.0)
- 네오★쇼핑백기지(113.0)
- 네오★백상(100.0)
- 네오★백상(150.0)
- 네오★백상(180.0)

고평량

-216
-198
-180
-172
-152

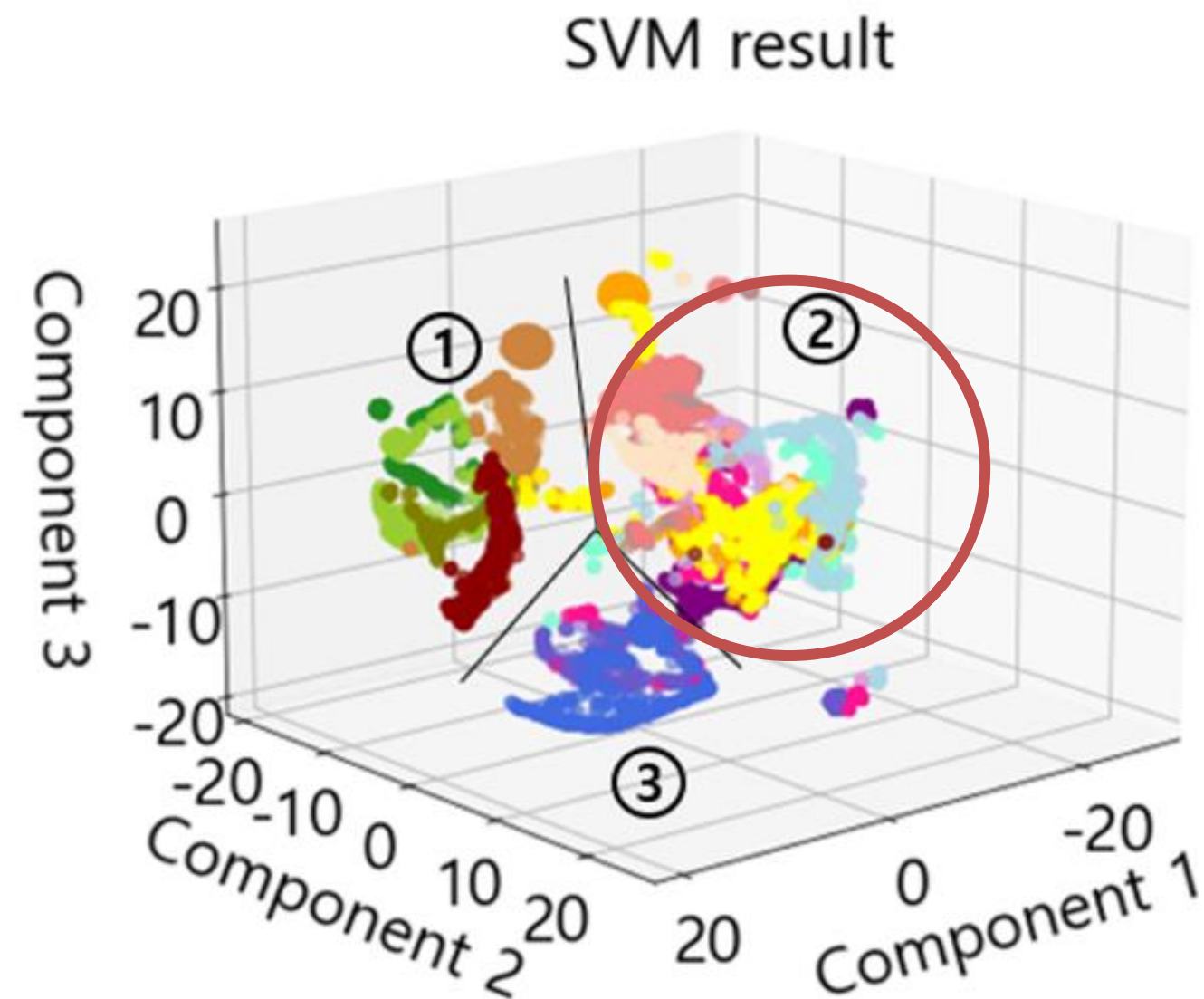
4.t-SNE



고평량

-216
-198
-180
-172
-152

4.t-SNE

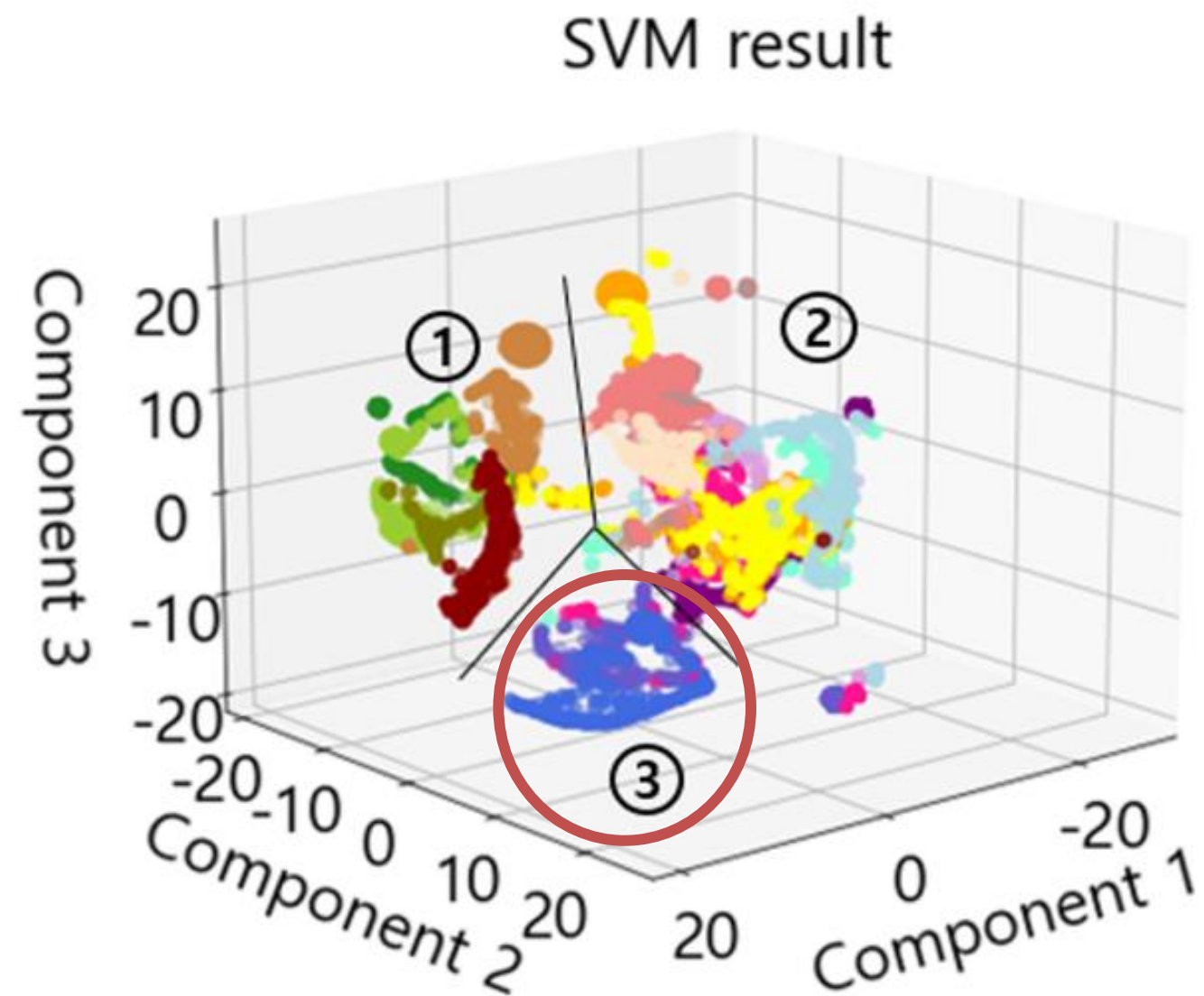


- NEO★MATT 9+ R10기지(172.0)
- 네오★아트 R10기지(67.0)
- 네오★아트 R10기지(77.0)
- 네오★아트 R10기지(103.0)
- 네오★아트 R10기지(216.0)
- 네오★아트기지(77.0)
- 네오★아트기지(103.0)
- 네오★아트기지(152.0)
- 네오★아트기지(198.0)
- 네오★아트기지(216.0)
- 네오★스노우화이트기지(62.0)
- 네오★스노우화이트기지(77.0)
- 네오★스노우화이트기지(103.0)
- 네오★쇼핑백기지(113.0)
- 네오★백상(100.0)
- 네오★백상(150.0)
- 네오★백상(180.0)

저평량

- 103
- 100
- 77
- 67
- 62

4.t-SNE

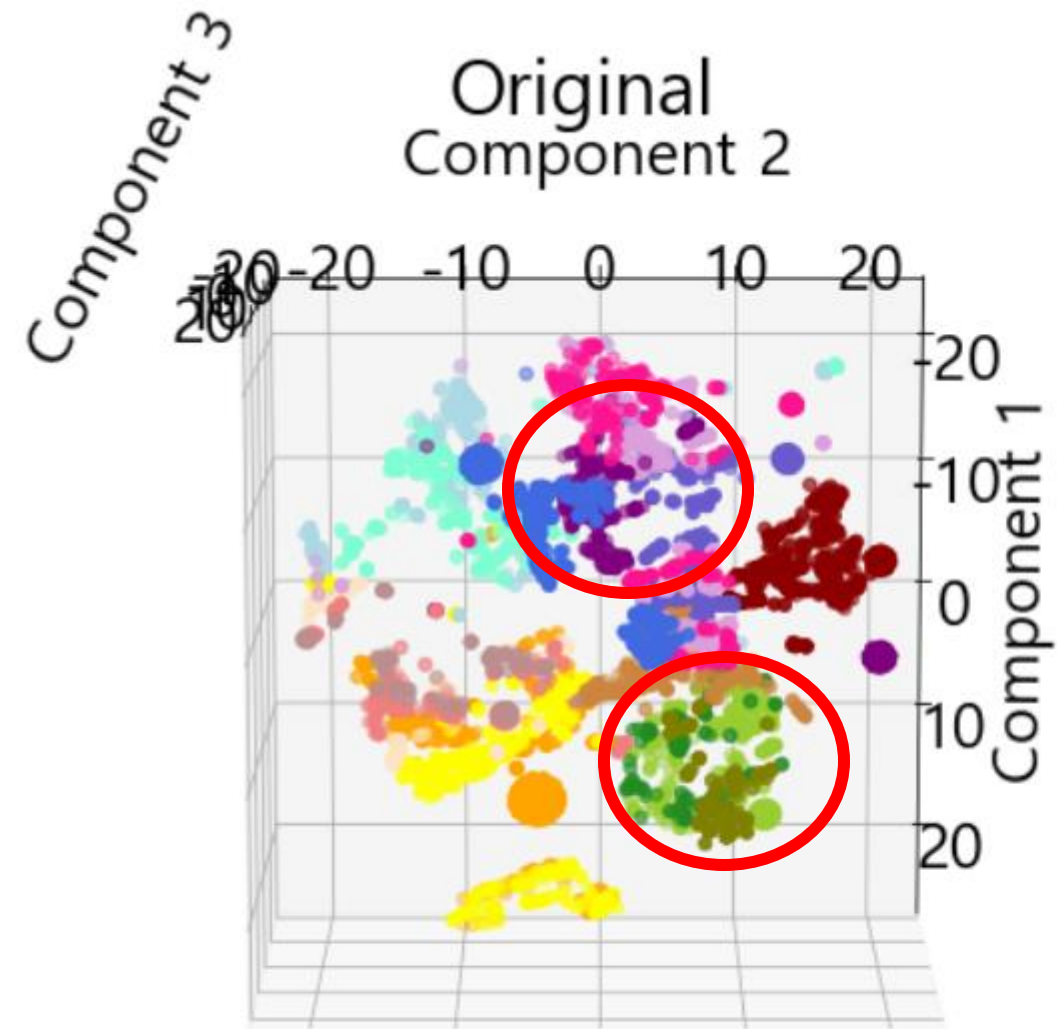


- NEO★MATT 9+ R10기지(172.0)
- 네오★아트 R10기지(67.0)
- 네오★아트 R10기지(77.0)
- 네오★아트 R10기지(103.0)
- 네오★아트 R10기지(216.0)
- 네오★아트기지(77.0)
- 네오★아트기지(103.0)
- 네오★아트기지(152.0)
- 네오★아트기지(198.0)
- 네오★아트기지(216.0)
- 네오★스노우화이트기지(62.0)
- 네오★스노우화이트기지(77.0)
- 네오★스노우화이트기지(103.0)
- 네오★쇼핑백기지(113.0)
- 네오★백상(100.0)
- 네오★백상(150.0)
- 네오★백상(180.0)

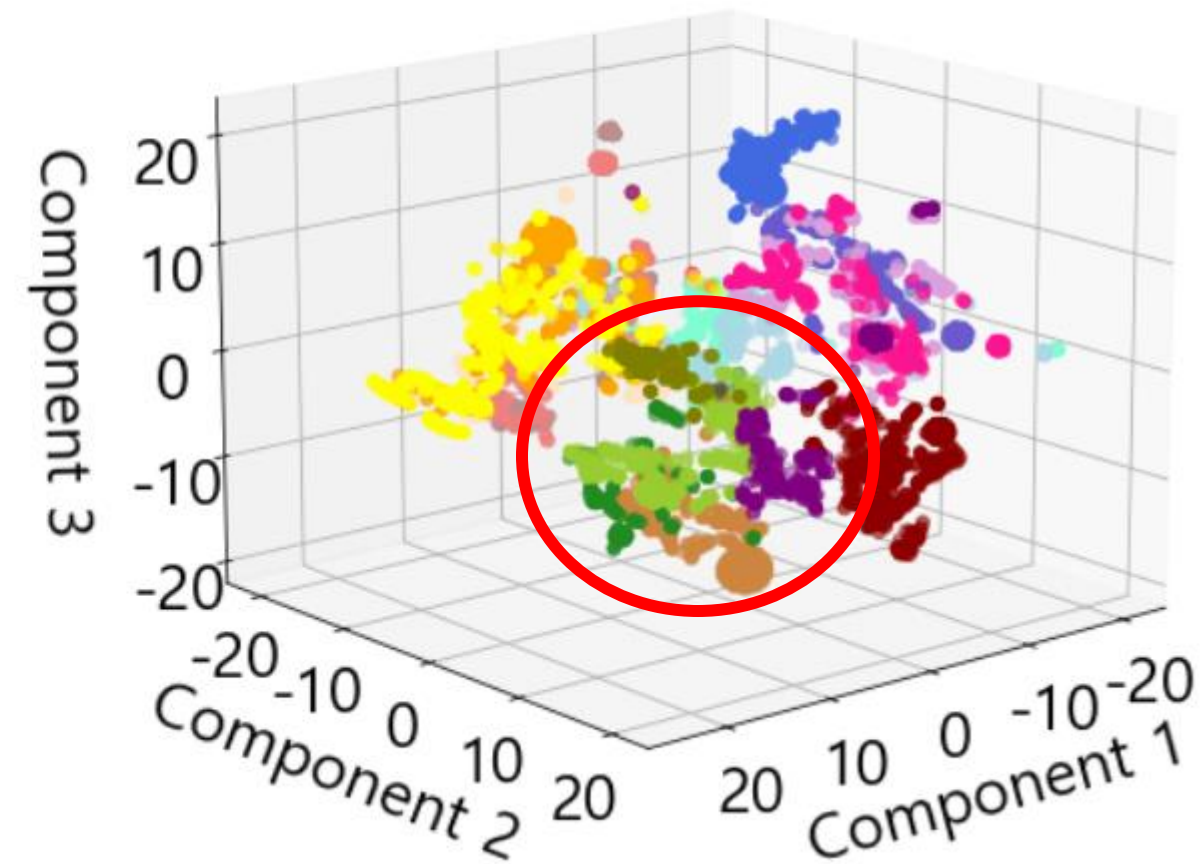
중평량

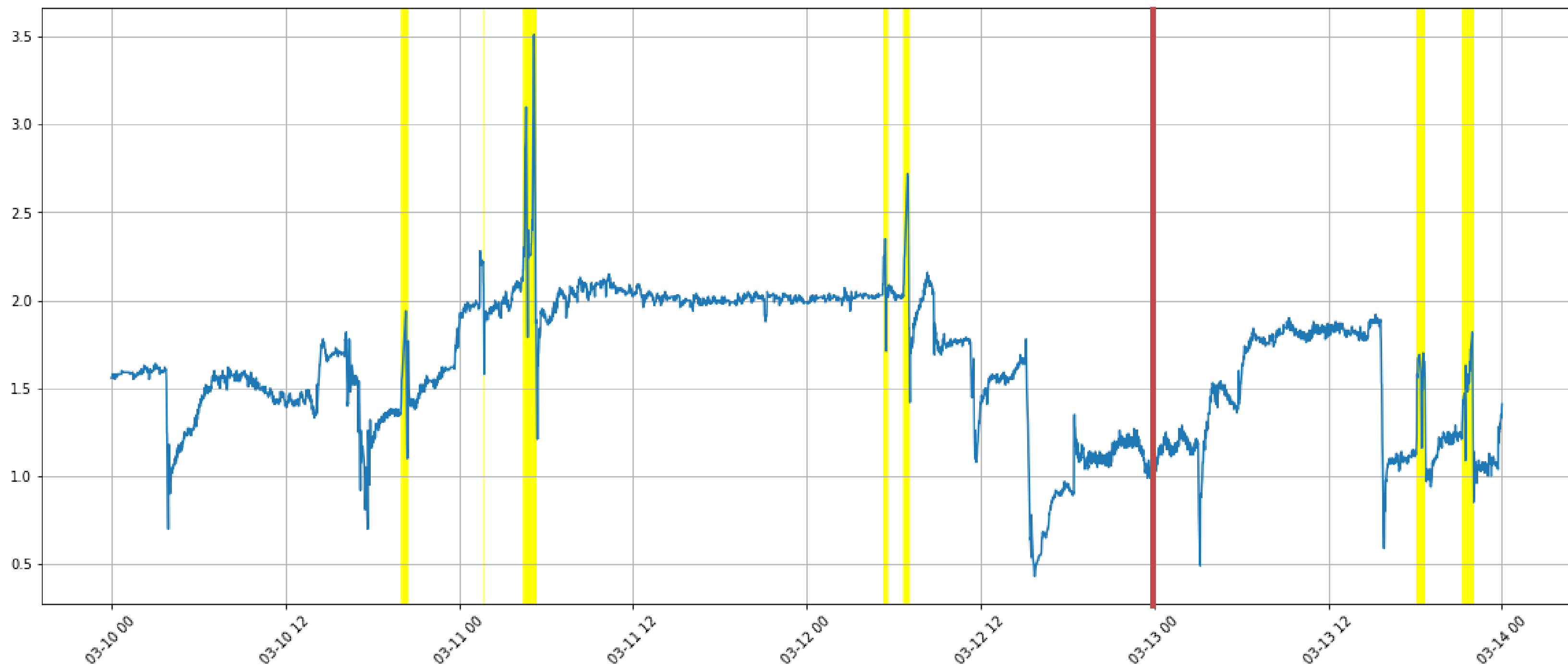
- 103
- 100
- 77
- 67
- 62

4.t-SNE

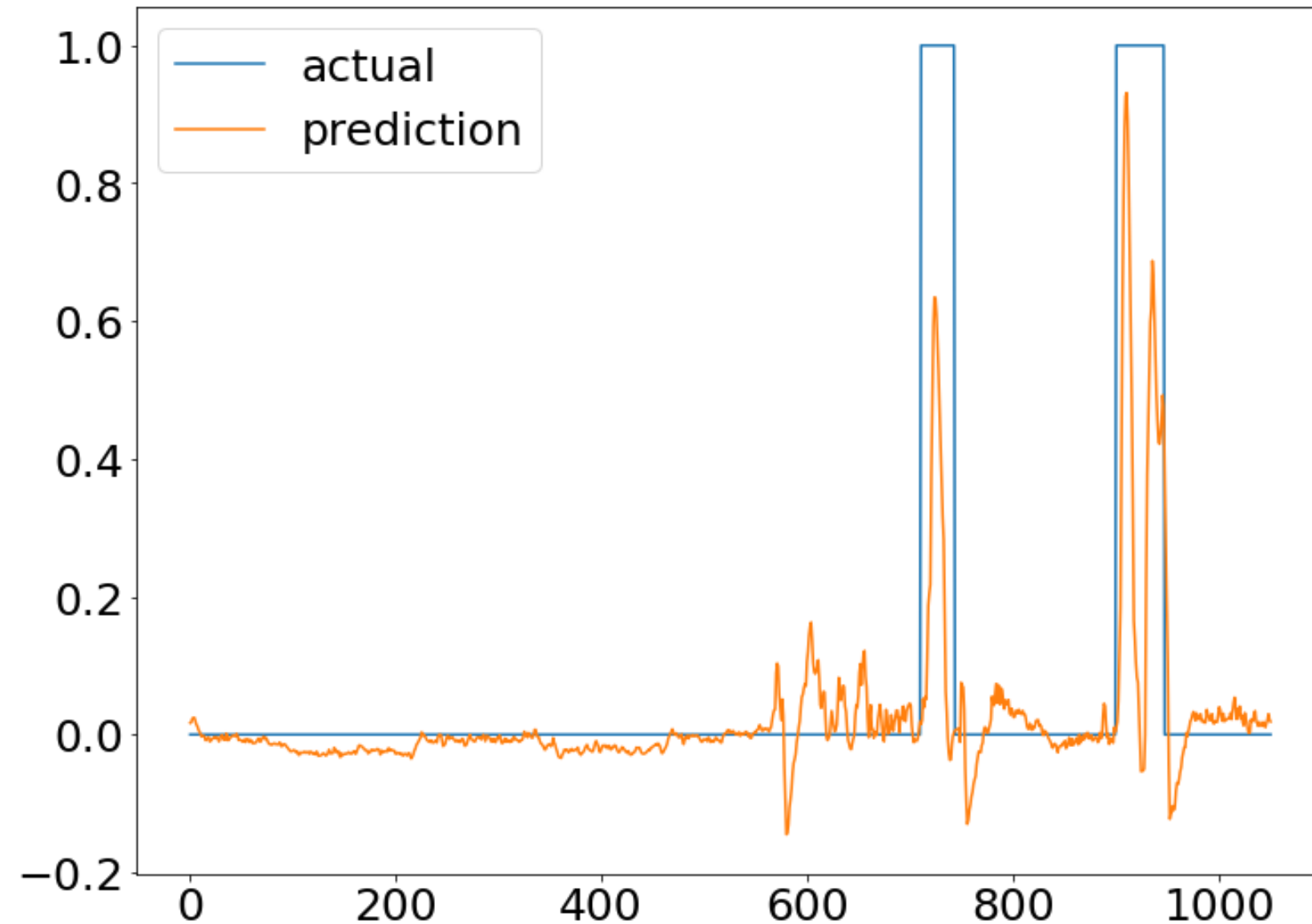


SVM result





5.LSTM



Sensor

| | |
|-----------------|---------------------------|
| 320PIC7513:me | 4nd pre-dry group |
| PM3-S5SC.opr:me | 5G steam pressure |
| 320PIC7544:me | Steam box pressure |
| 320PIC7508:me | 3rd dry cylinder |
| 320PDC7516:me | 1st dry group |
| 320PIC7505:me | 1st dry cylinder pressure |
| 320PIC7514:me | 5th bottom dry group |
| 320PDC7520:me | 4th dry group |
| 320PIC7509:me | 1st dry group |
| PM3_ASH_PV | 회분량 |

Power

| | |
|---------------------------------|--------------------|
| HFEMS.MRPAP.01.SH01.PL003.04.PF | DRIVE #1,2 역률 |
| HFEMS.MRPAP.01.SH01.PL003.02.PF | 초지저압 1,3 CONTROL역률 |

...

01월 13일 과제 발표

THANK YOU

FEMS DATA ANALYSIS