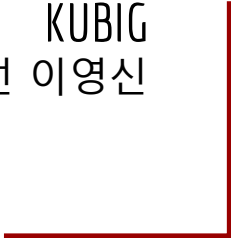




CHICAGO CRIME DATA

KUBIG
박소현 김효익 조송현 조규선 이영신



Imbalanced Data

Problems with Imbalanced Data

| Category | Type of Crime |
|----------|--|
| Violent | "ASSAULT", "BATTERY", "HOMICIDE", "INTIMIDATION", "KIDNAPPING", "CONCEALED CARRY LICENSE VIOLATION", "WEAPONS VIOLATION" |
| Property | "ARSON", "BURGLARY", "CRIMINAL DAMAGE", "CRIMINAL TRESPASS", "MOTOR VEHICLE THEFT", "ROBBERY", "THEFT" |
| Sex | "CRIM SEXUAL ASSAULT", "OFFENSE INVOLVING CHILDREN", "PROSTITUTION", "SEX OFFENSE", "STALKING" |
| White | "DECEPTIVE PRACTICE", "GAMBLING" |
| Public | "INTERFERENCE WITH PUBLIC OFFICER", "OBSCENITY", "PUBLIC INDECENCY", "PUBLIC PEACE VIOLATION" |
| Drug | "LIQUOR LAW VIOLATION", "NARCOTICS", "OTHER NARCOTIC VIOLATION" |
| Others | "NON - CRIMINAL", "NON - CRIMINAL", "OTHER OFFENSE" |

```
> table(crime$Primary.Type)
```

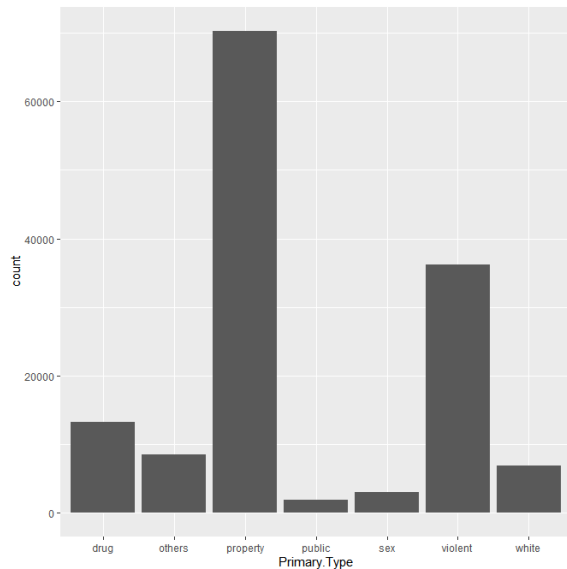
| | | | | | | |
|-------|--------|----------|--------|------|---------|-------|
| drug | others | property | public | sex | violent | white |
| 13158 | 8476 | 70297 | 1874 | 2959 | 36216 | 6906 |

Problems with Imbalanced Data

| Category | Type of Crime |
|----------|--|
| Violent | "ASSAULT", "BATTERY", "HOMICIDE", "INTIMIDATION", "KIDNAPPING", "CONCEALED CARRY LICENSE VIOLATION", "WEAPONS VIOLATION" |
| Property | "ARSON", "BURGLARY", "CRIMINAL DAMAGE", "CRIMINAL TRESPASS", "MOTOR VEHICLE THEFT", "ROBBERY", "THEFT" |
| Sex | "CRIM SEXUAL ASSAULT", "OFFENSE INVOLVING CHILDREN", "PROSTITUTION", "SEX OFFENSE", "STALKING" |
| White | "DECEPTIVE PRACTICE", "GAMBLING" |
| Public | "INTERFERENCE WITH PUBLIC OFFICER", "OBSCENITY", "PUBLIC INDECENCY", "PUBLIC PEACE VIOLATION" |
| Drug | "LIQUOR LAW VIOLATION", "NARCOTICS", "OTHER NARCOTIC VIOLATION" |
| Others | "NON - CRIMINAL", "NON - CRIMINAL", "OTHER OFFENSE" |

```
> table(crime$Primary.Type)
```

| | | | | | | |
|-------|--------|----------|--------|------|---------|-------|
| drug | others | property | public | sex | violent | white |
| 13158 | 8476 | 70297 | 1874 | 2959 | 36216 | 6906 |



Problems with Imbalanced Data

```
> crimes_ctree <- ctree(Primary.Type~., data=crimes)
> table(predict(crimes_ctree, train), train$Primary.Type)
```

| | drug | others | property | public | sex | violent | white |
|----------|------|--------|----------|--------|-----|---------|-------|
| drug | 8138 | 844 | 3883 | 884 | 601 | 3131 | 600 |
| others | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| property | 694 | 3210 | 43132 | 355 | 939 | 11539 | 4162 |
| public | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| sex | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| violent | 230 | 1947 | 2265 | 81 | 559 | 10669 | 57 |
| white | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

```
> table(predict(crimes_ctree, test), test$Primary.Type)
```

| | drug | others | property | public | sex | violent | white |
|----------|------|--------|----------|--------|-----|---------|-------|
| drug | 3682 | 366 | 1651 | 373 | 221 | 1378 | 252 |
| others | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| property | 314 | 1328 | 18378 | 134 | 401 | 4942 | 1799 |
| public | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| sex | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| violent | 100 | 781 | 988 | 47 | 238 | 4557 | 36 |
| white | 0 | 0 | 0 | 0 | 0 | 0 | 0 |



Oversampling vs Undersampling



Oversampling vs Undersampling

Undersampling

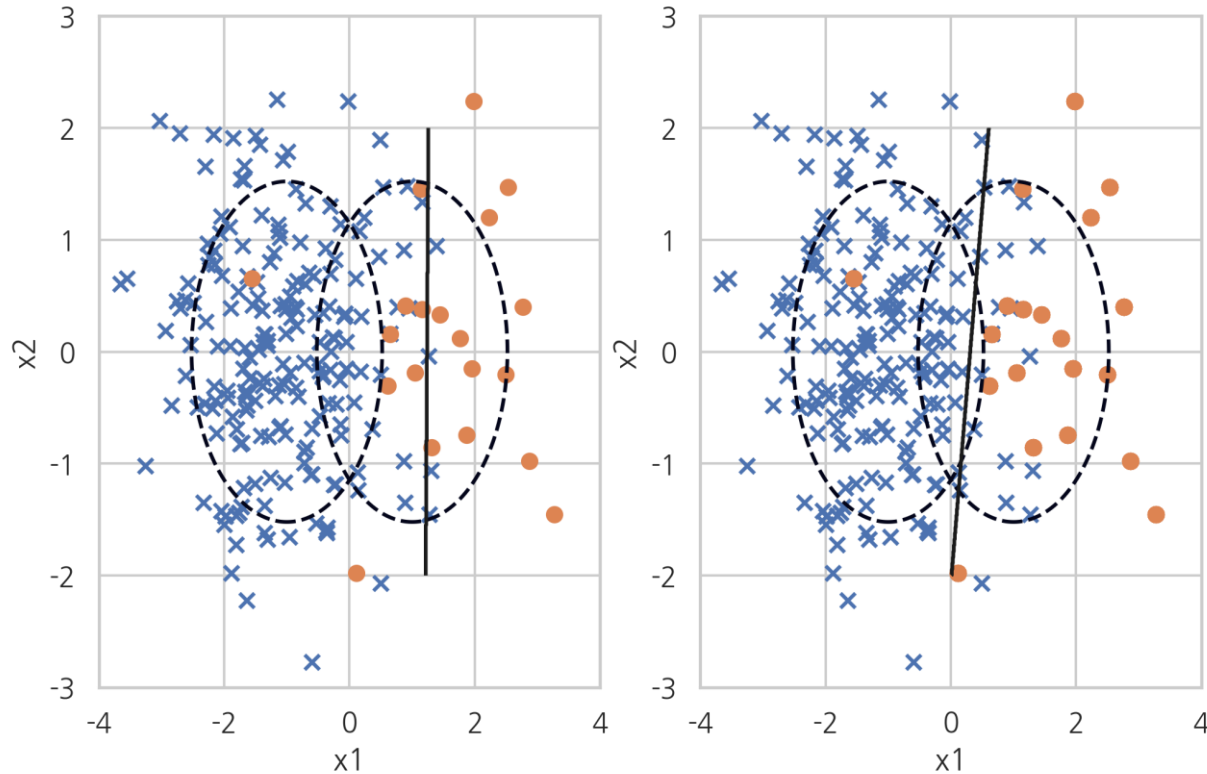


Oversampling

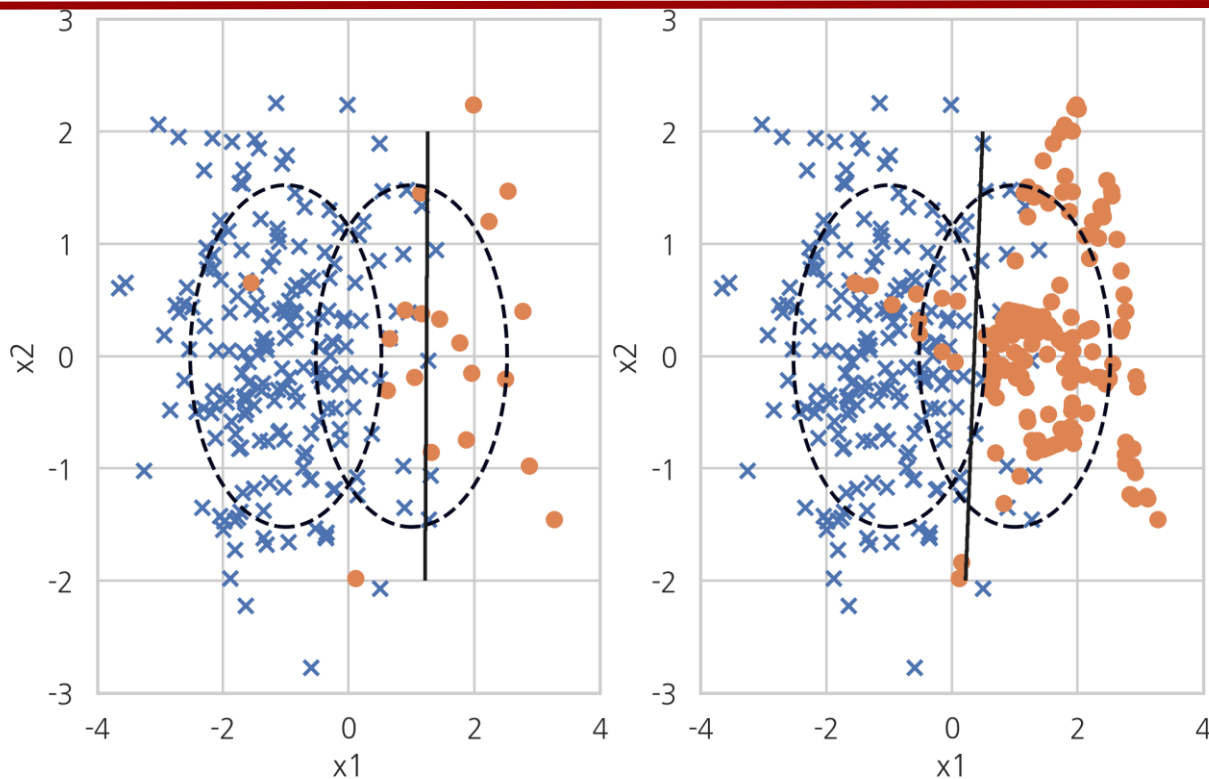


Oversampling

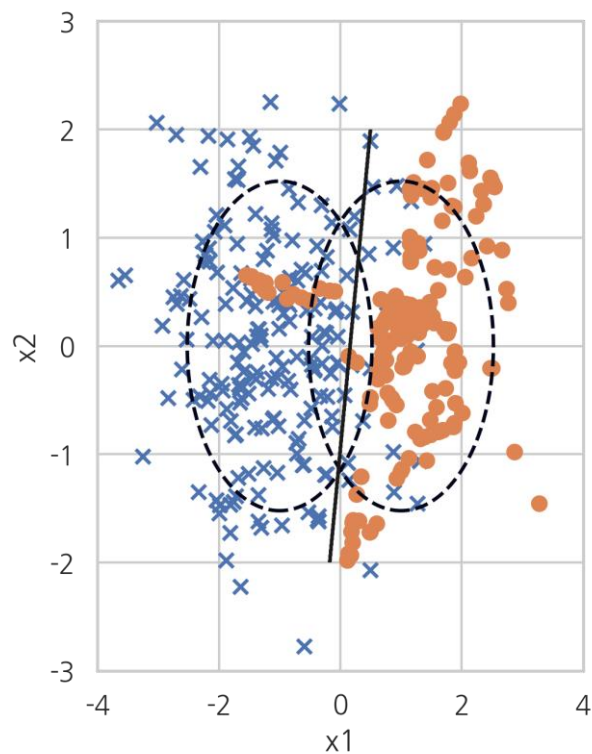
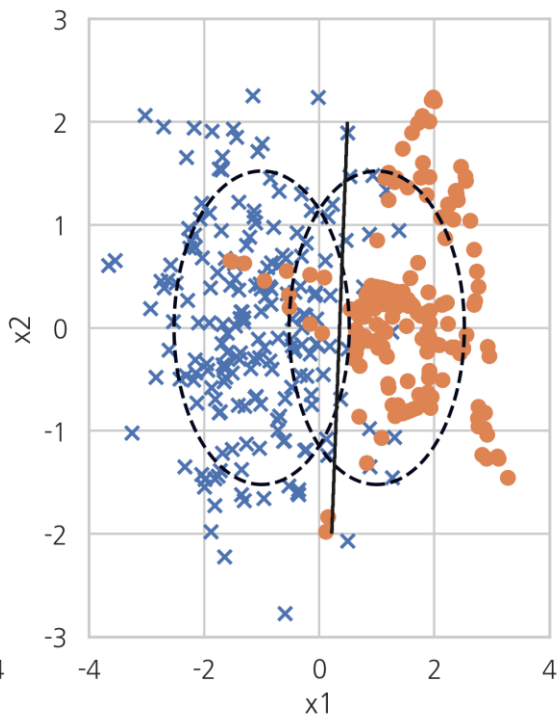
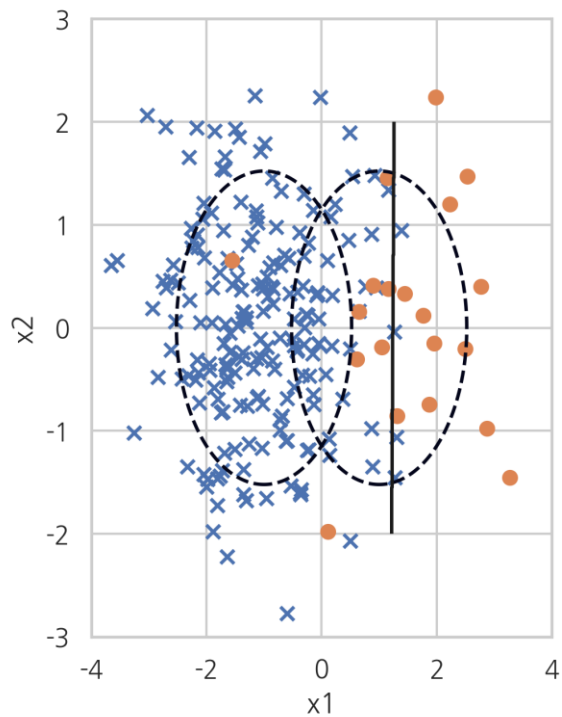
Random Oversampling



SMOTE (Synthetic Minority Oversampling Technique)



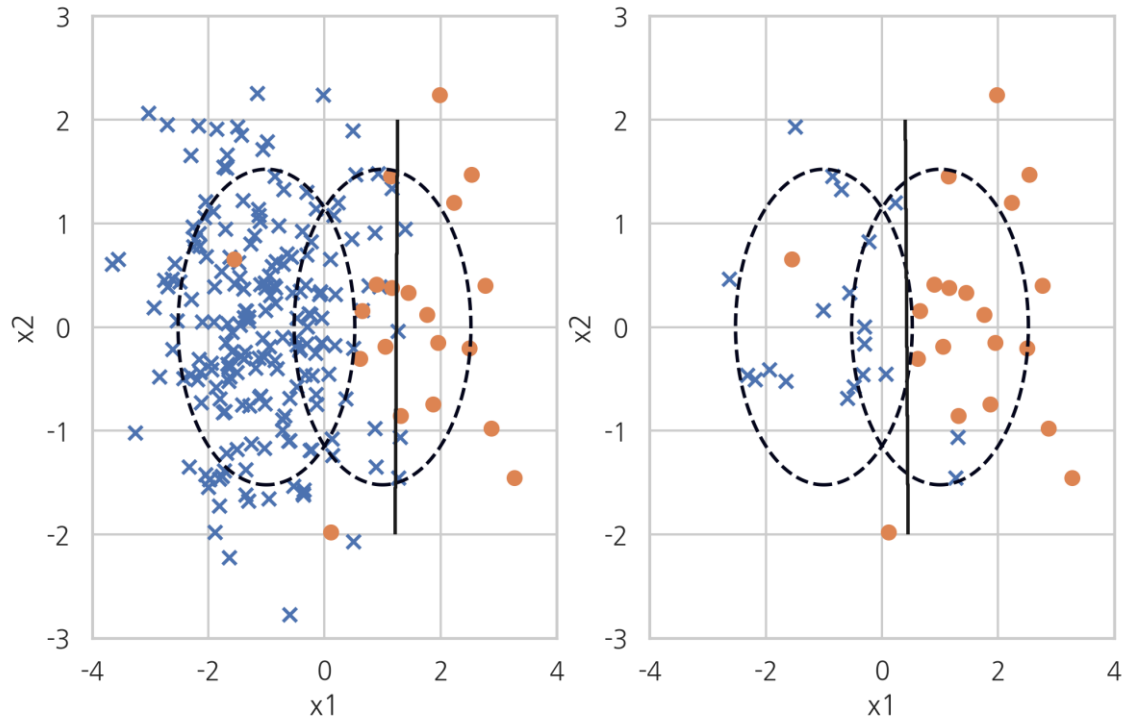
ADASYN



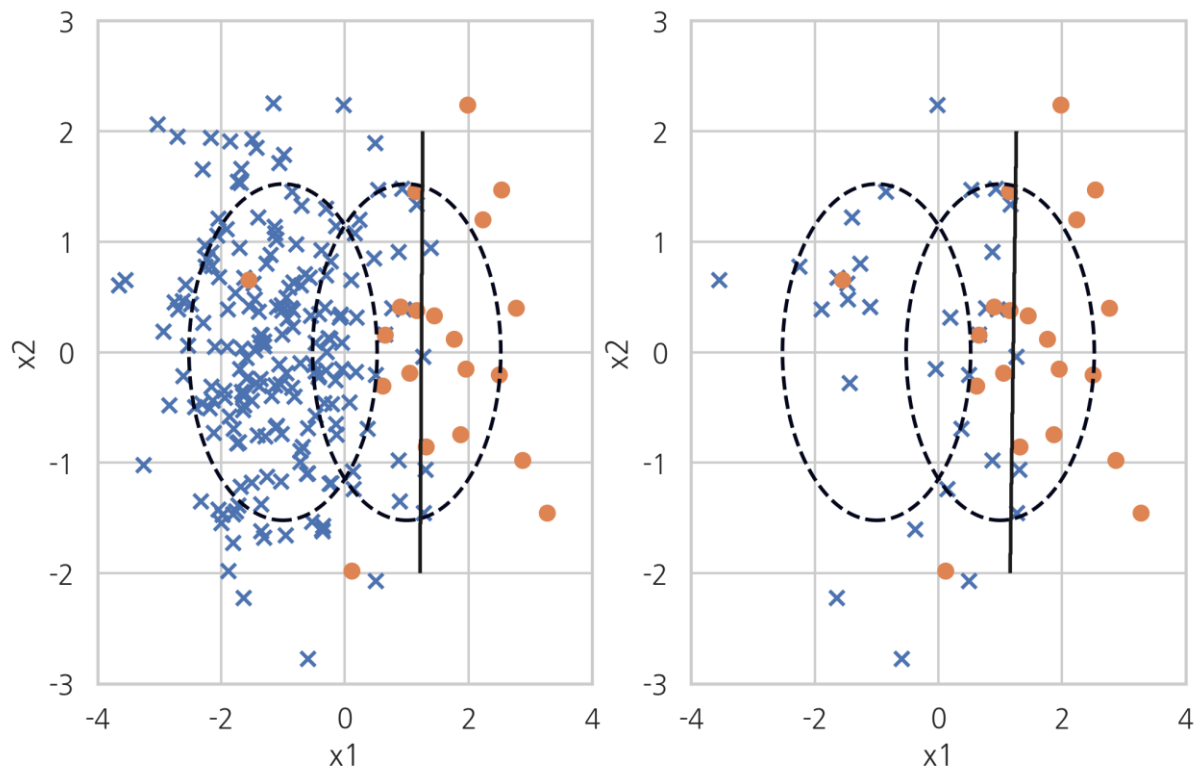
$11/n$

Undersampling

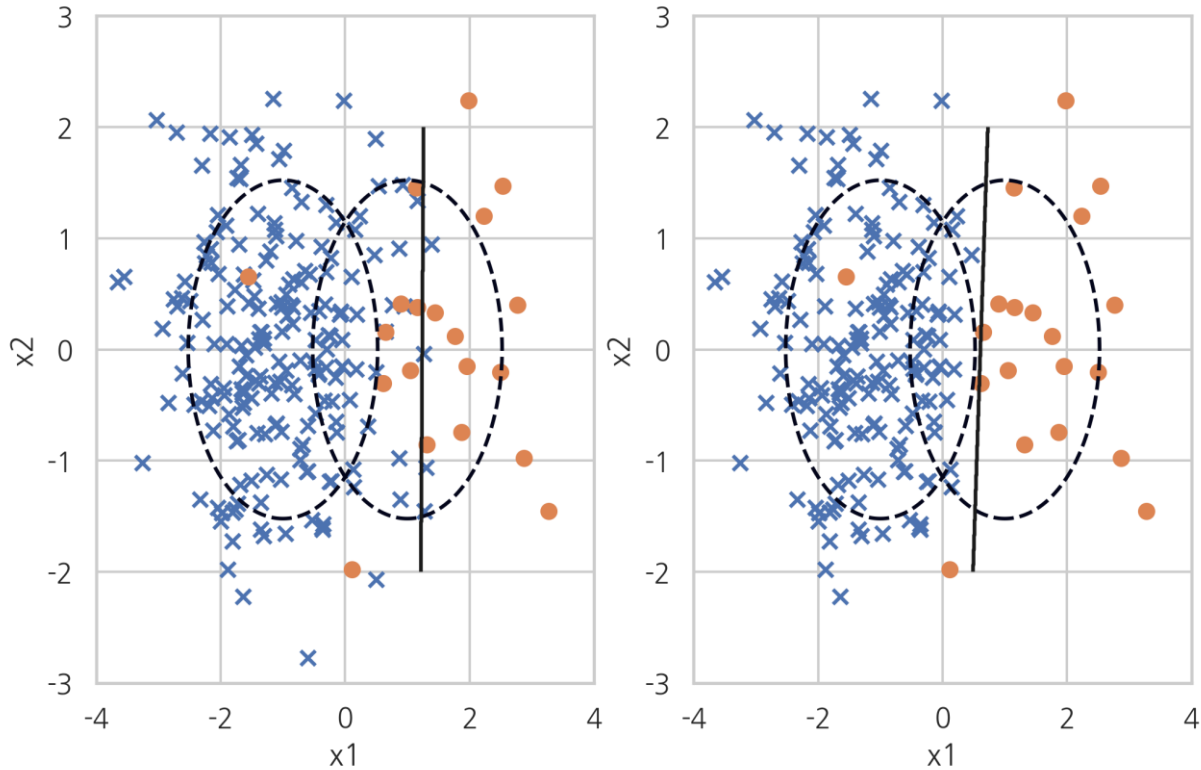
Random Under-Sampling



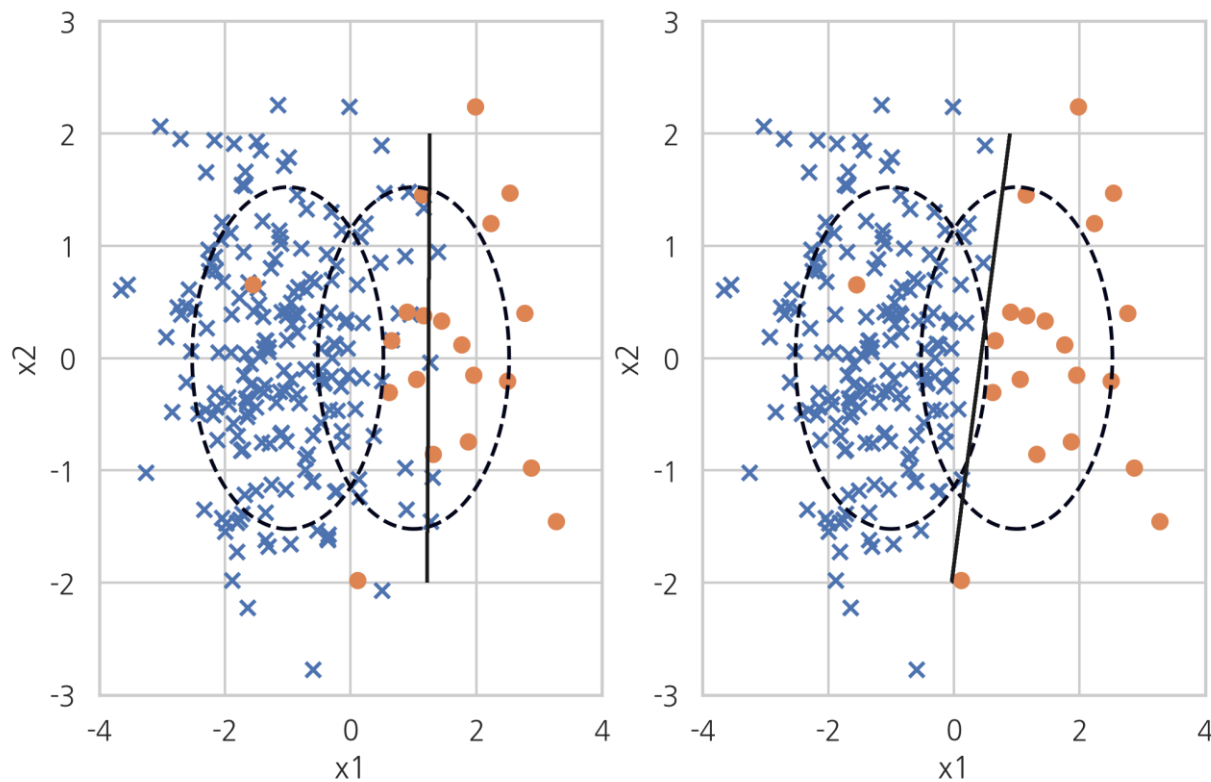
CNN(Condensed Nearest Neighbor)



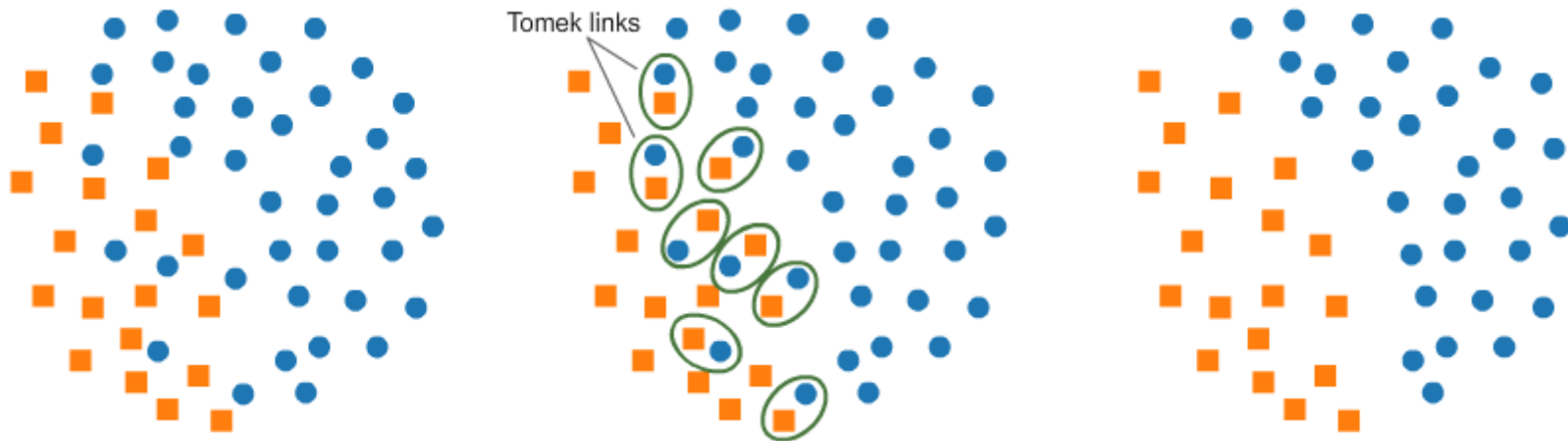
ENN(Edited Nearest Neighbor)



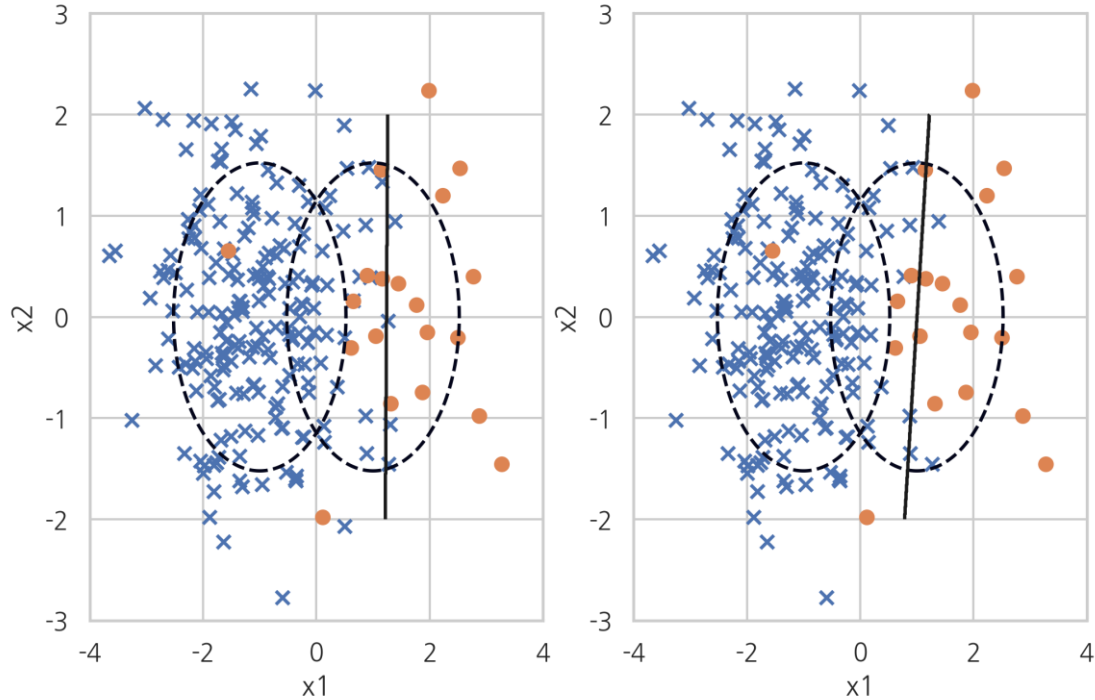
NCL (Neighborhood Cleansing Rule)



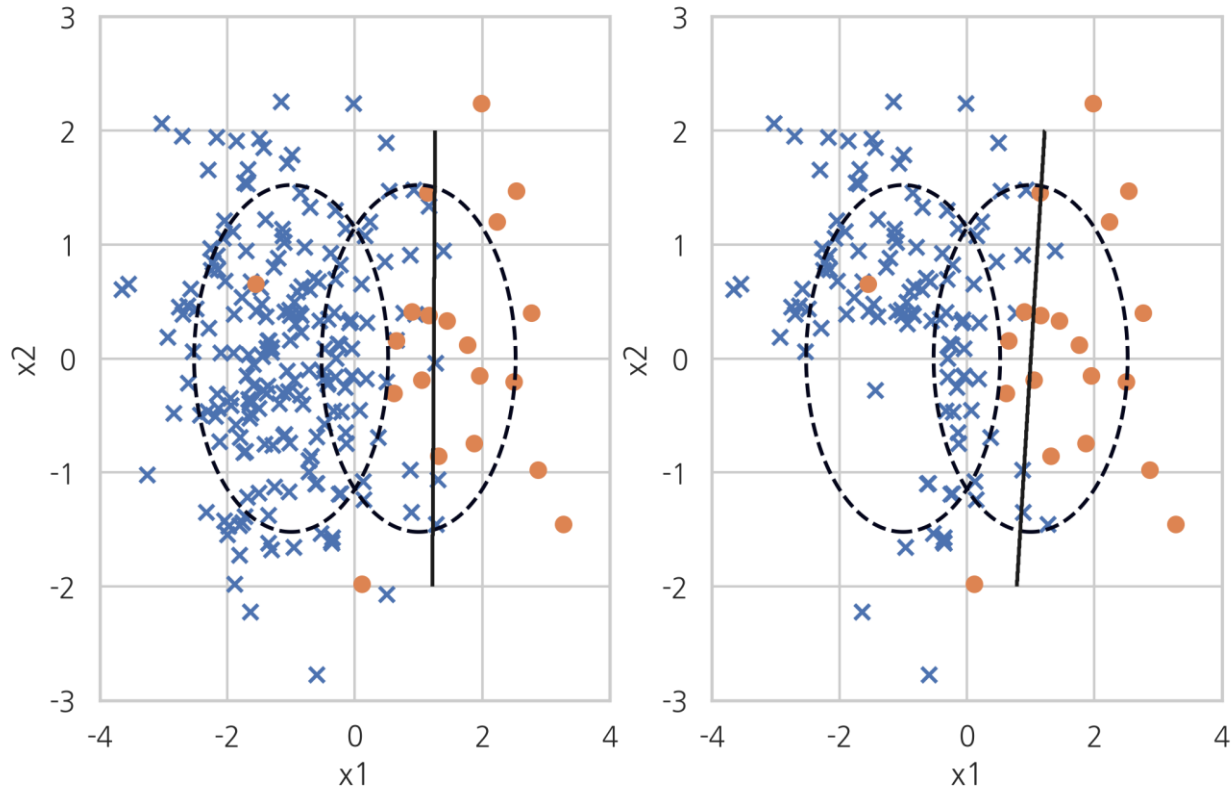
Tomek link Method



Tomek link Method



One Sided Selection





THANK YOU

