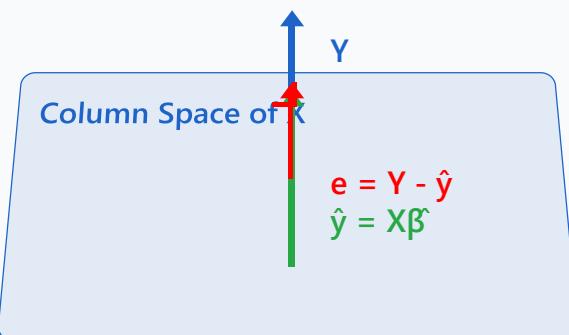


## Geometric Interpretation

### Projection onto Column Space



### Column Space

All possible linear combinations of predictors

### Prediction $\hat{y}$

Projection of Y onto column space of X

### Residual e

Orthogonal to column space (perpendicular)

### Projection Matrix

$$P = X(X^T X)^{-1} X^T$$

$$\hat{Y} = PY$$

### Residual Maker

$$M = I - P$$

$$e = MY$$

### Orthogonality

$$\langle e, X_j \rangle = 0$$

for all predictors

$\hat{y}$  is the closest point in column space to  $Y$

Unifies Linear Algebra  
and Statistics