

S: gender, race, etc.

W: credit, employment, etc.

Y: actual repayment

R<sub>Y</sub>: missing indicator of Y

Y\*: observed repayment