

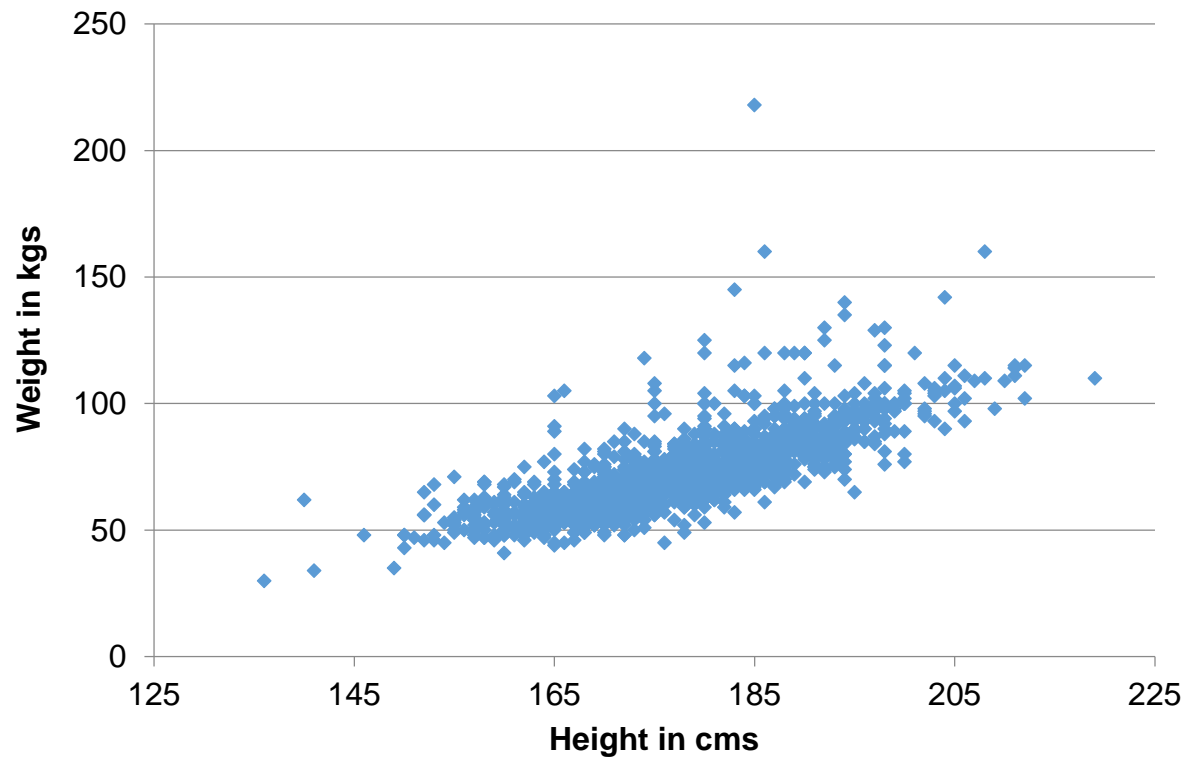
# Measures of Association

Covariance

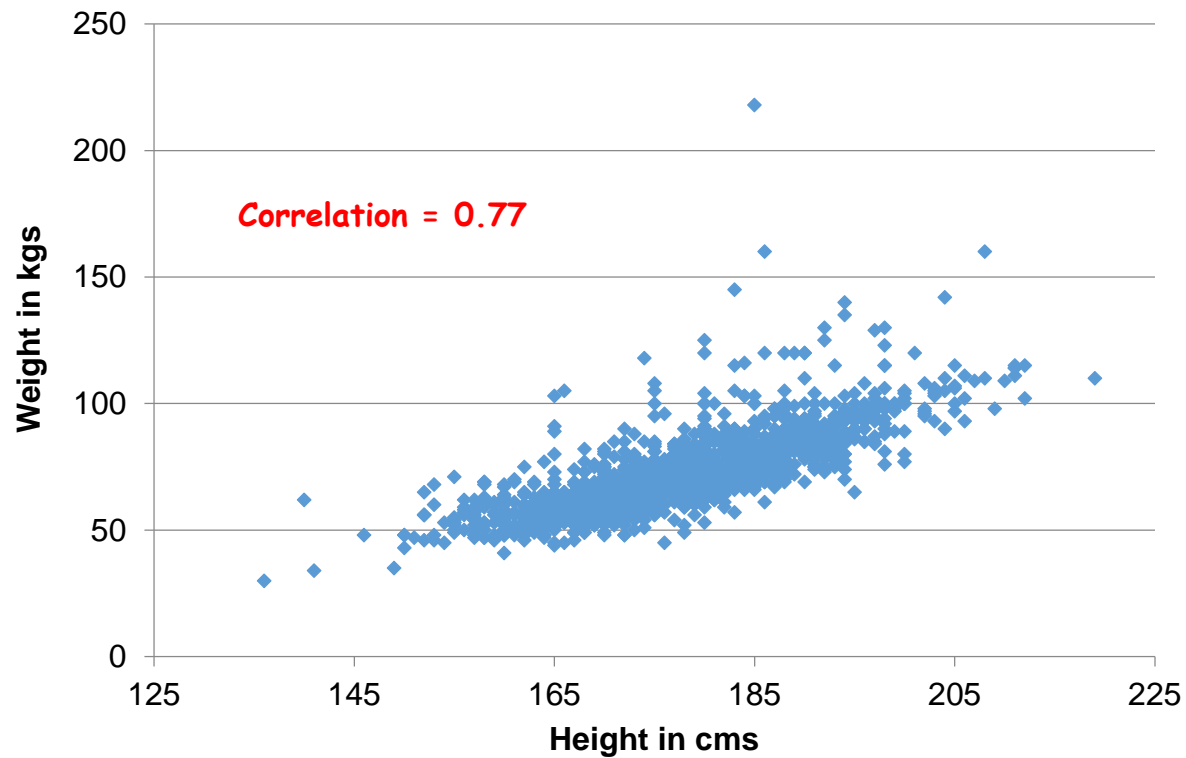
Correlation



## Heights and Weights of Athletes



## Heights and Weights of Athletes





Does Weight cause Height ?

Does Height cause Weight ?



# Causation versus Correlation

# Causation versus Correlation

What is Causation and how do we establish it?

# Causation versus Correlation

What is Causation and how do we establish it?

- Correlation

# Causation versus Correlation

What is Causation and how do we establish it?

- Correlation
- Temporal distinction between the ***caused*** and the ***causing*** variable



# Causation versus Correlation

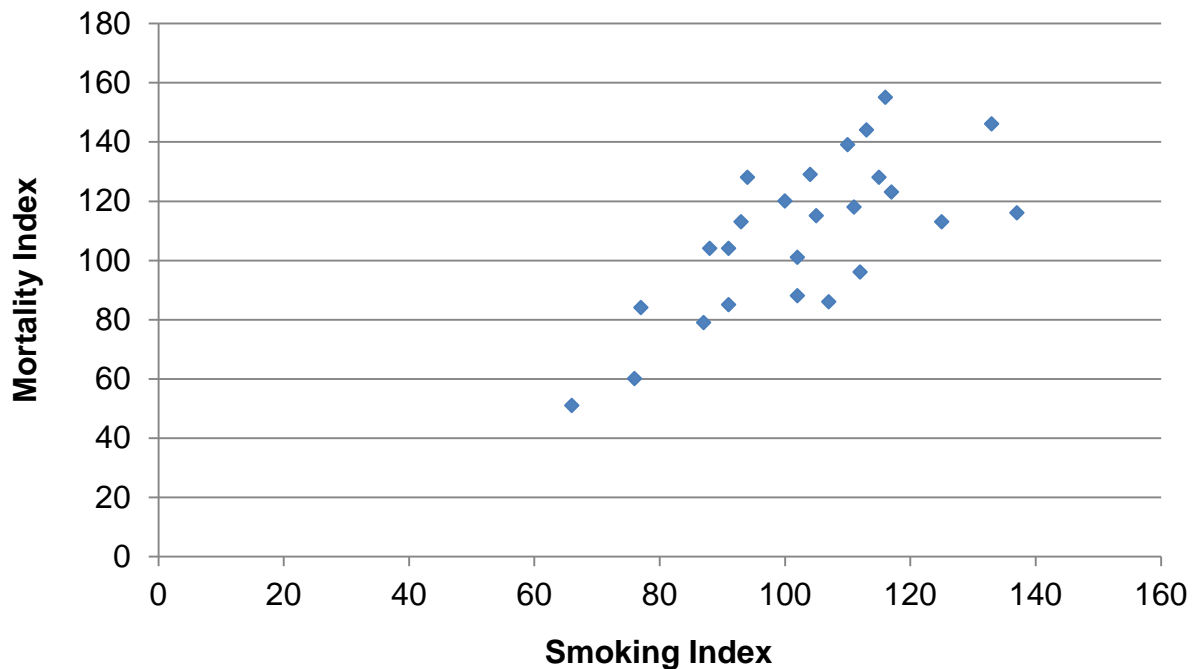
What is Causation and how do we establish it?

- Correlation
- Temporal distinction between the ***caused*** and the ***causing*** variable
- Control for other variables that may cause the focal variable

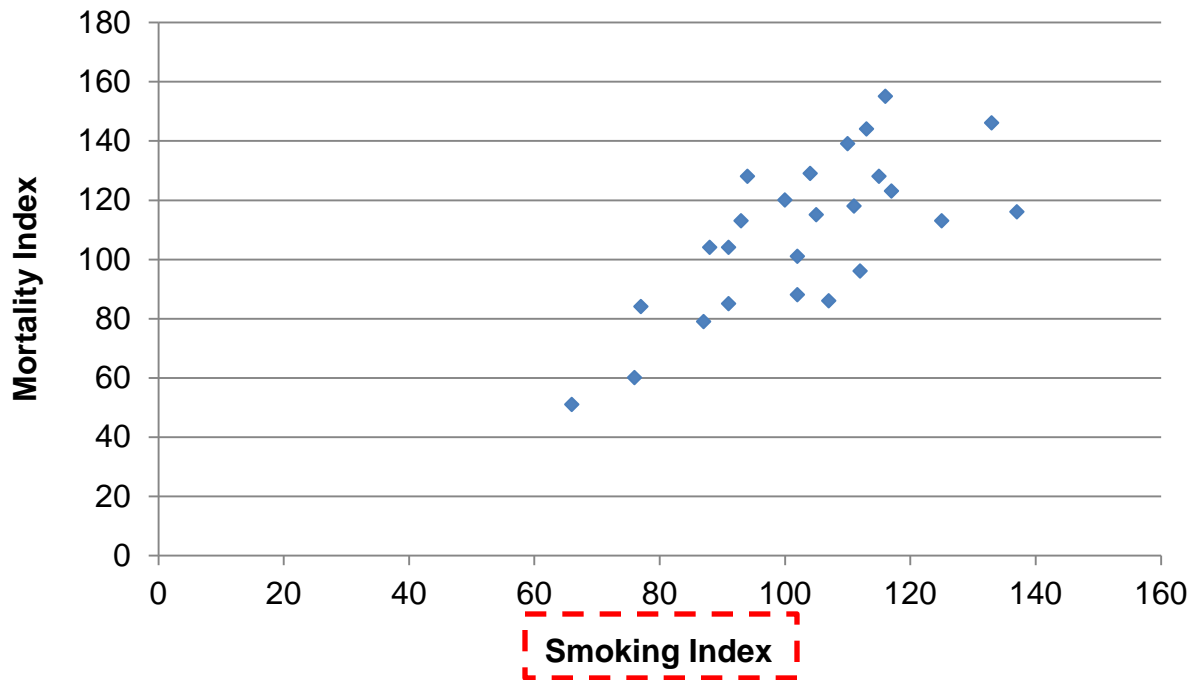


# Smoking and Cancer

## Smoking and Lung Cancer

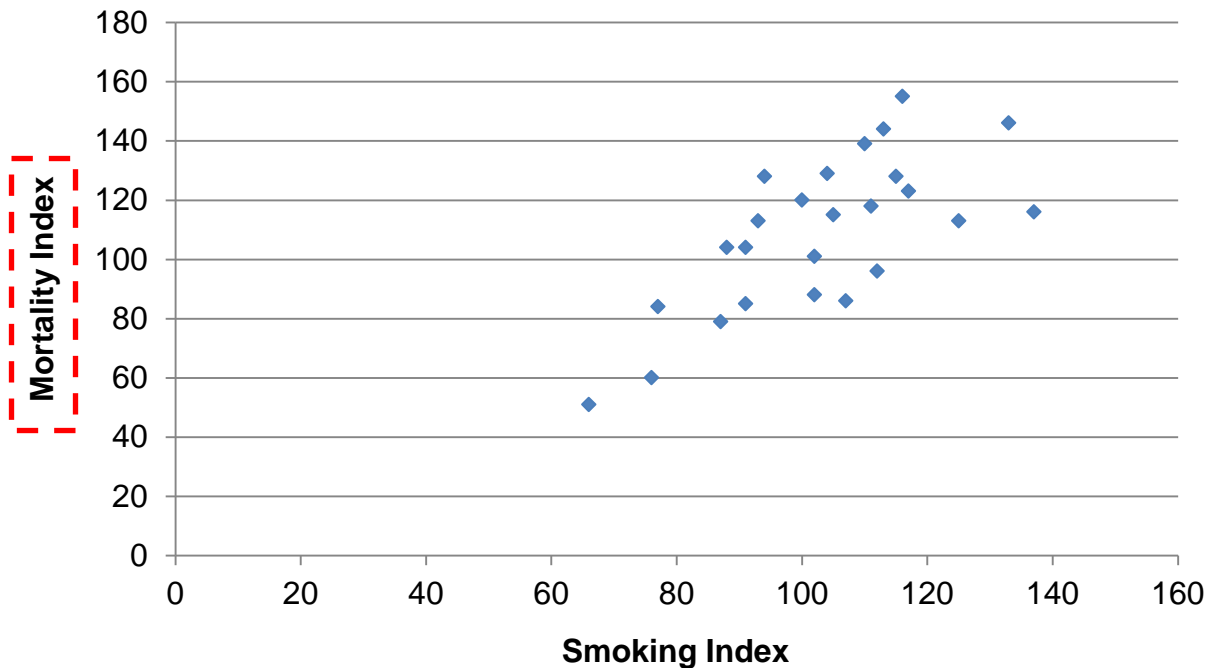


## Smoking and Lung Cancer

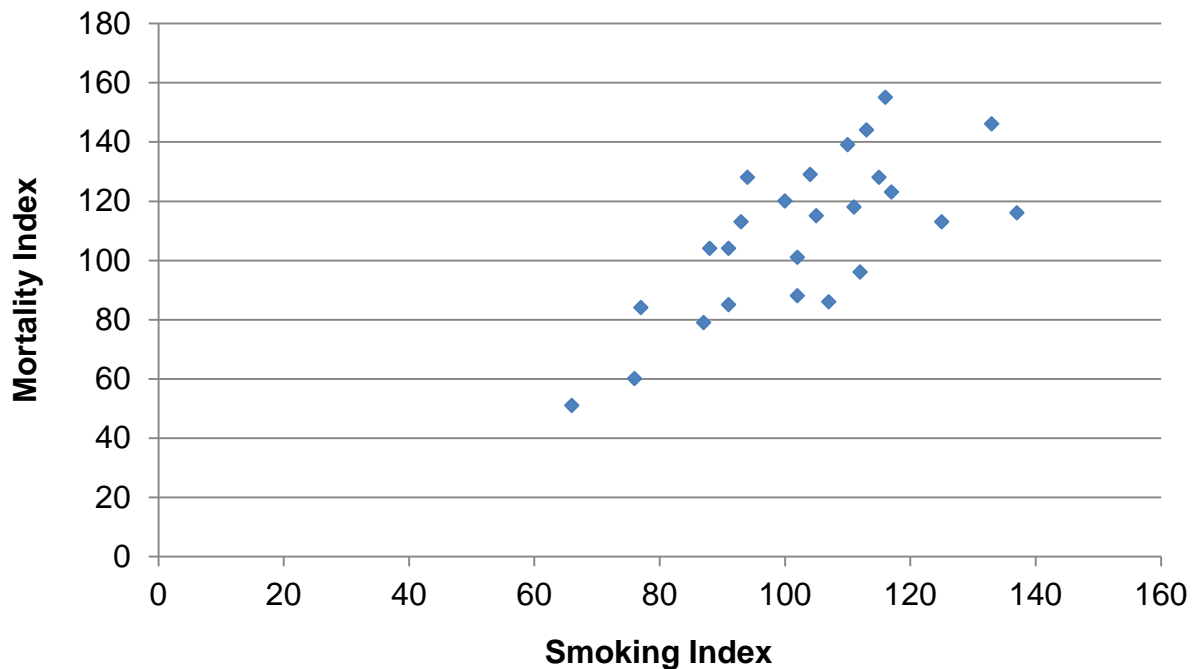




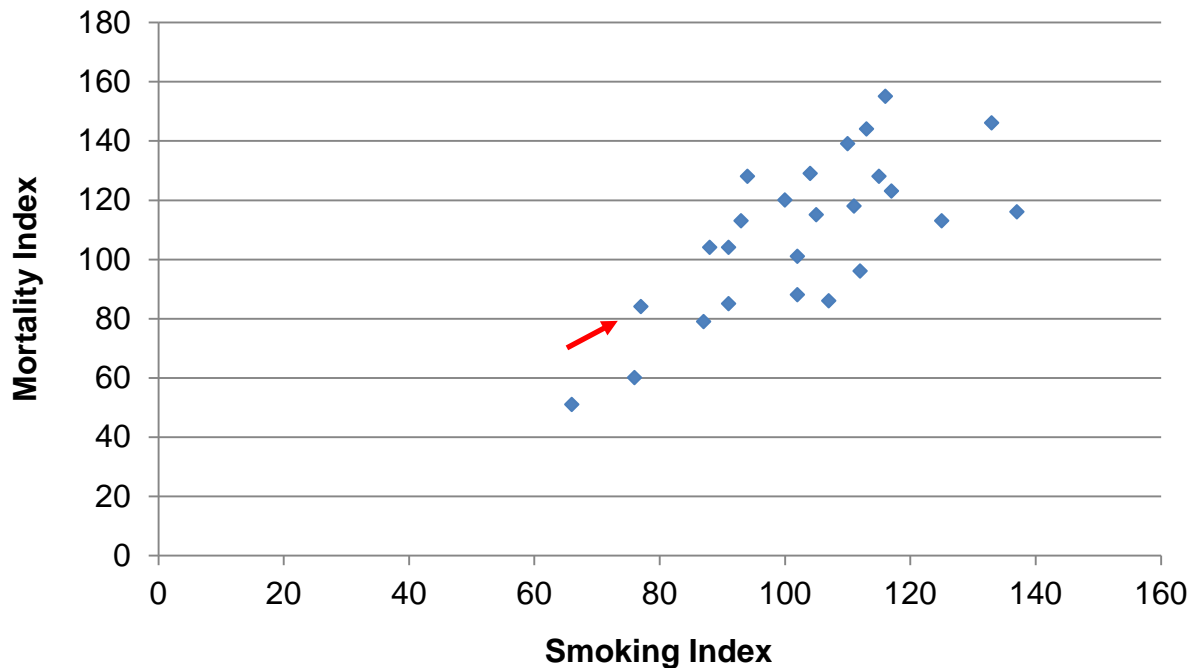
## Smoking and Lung Cancer



## Smoking and Lung Cancer

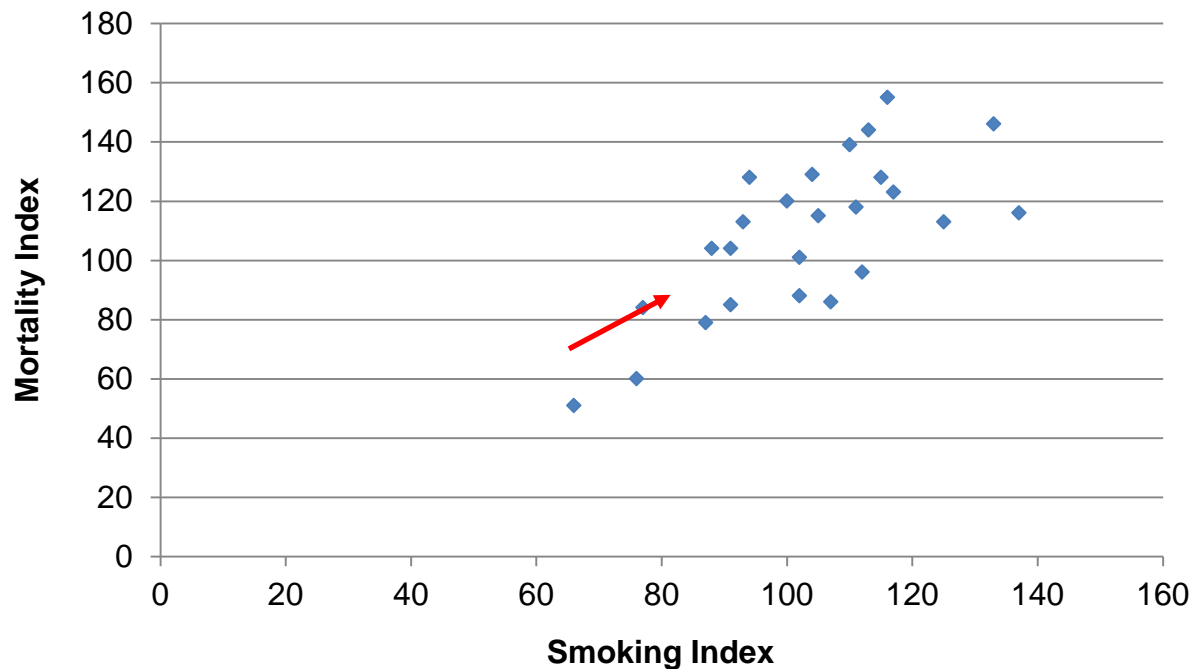


## Smoking and Lung Cancer



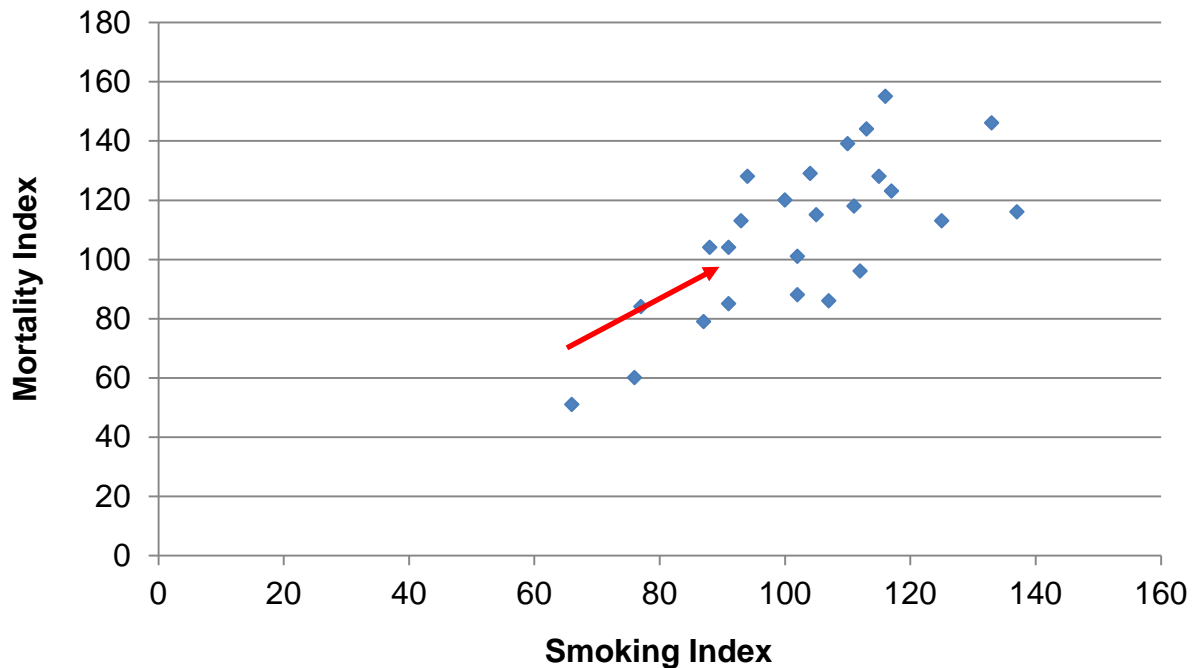


## Smoking and Lung Cancer

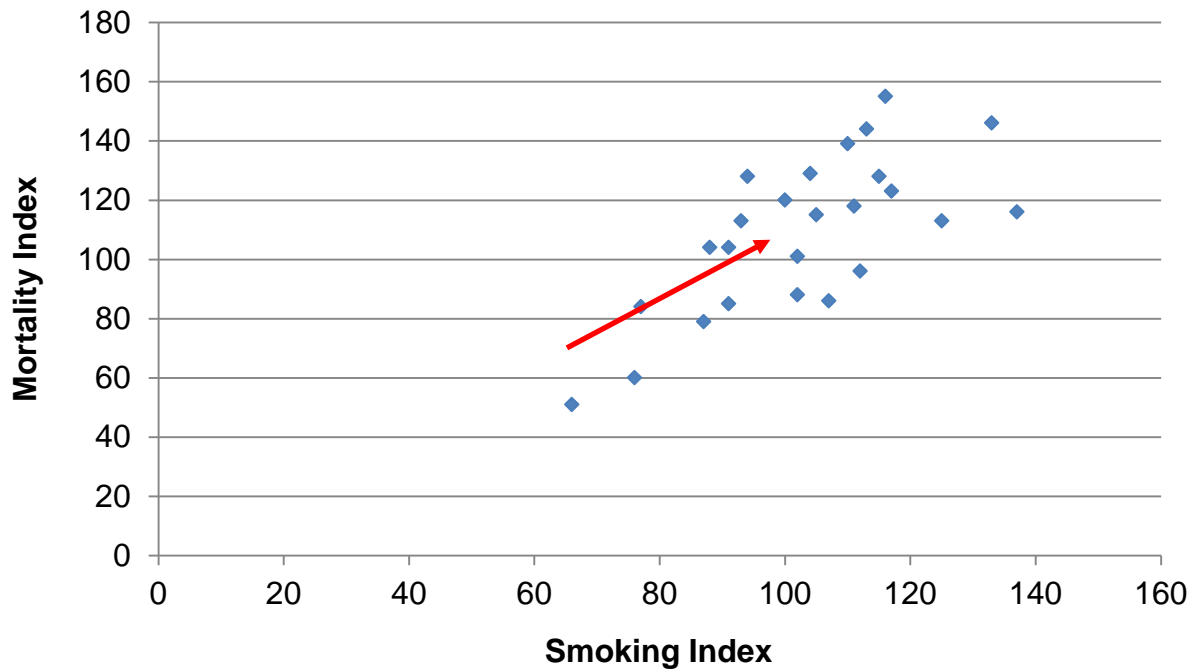




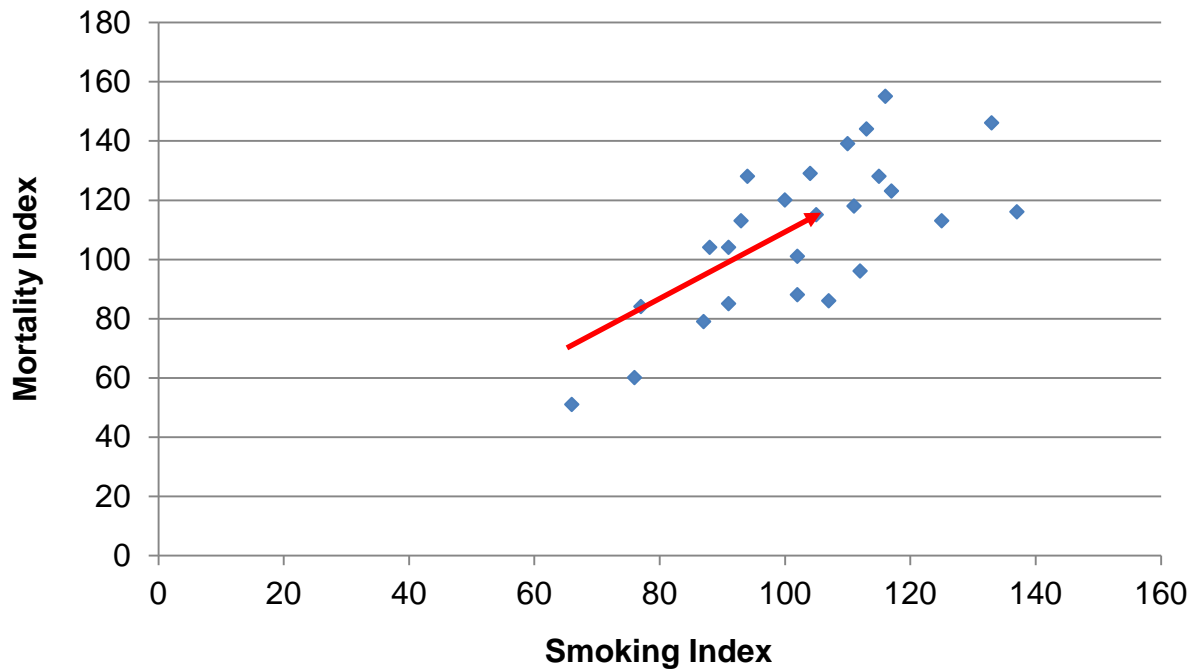
## Smoking and Lung Cancer



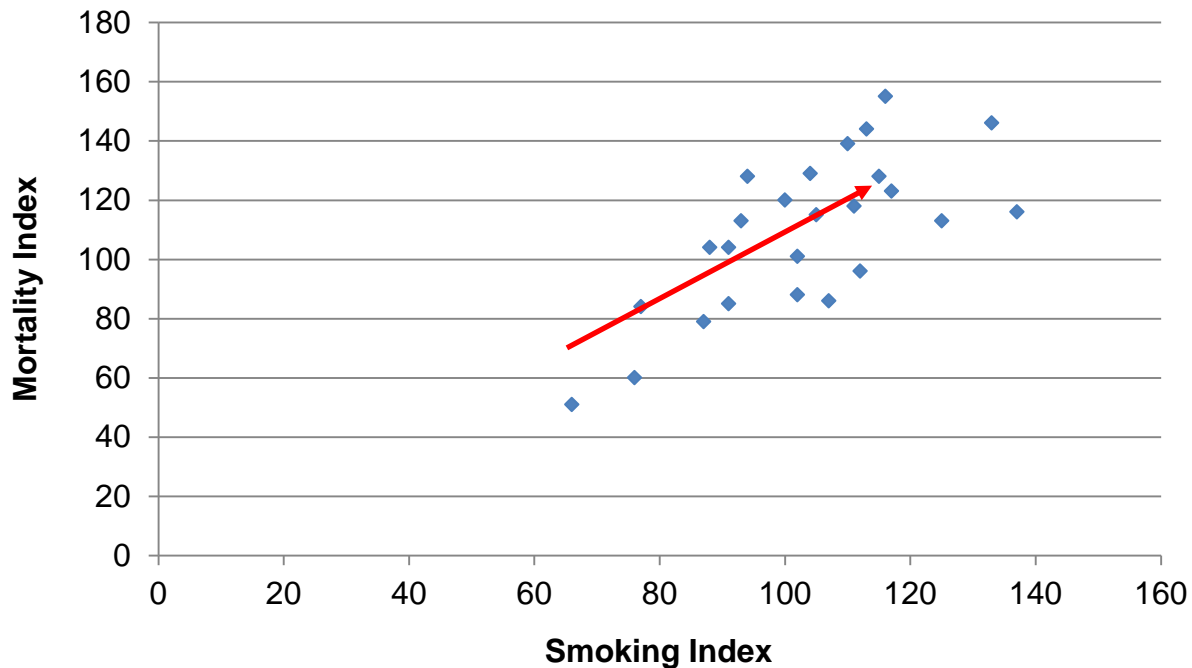
## Smoking and Lung Cancer



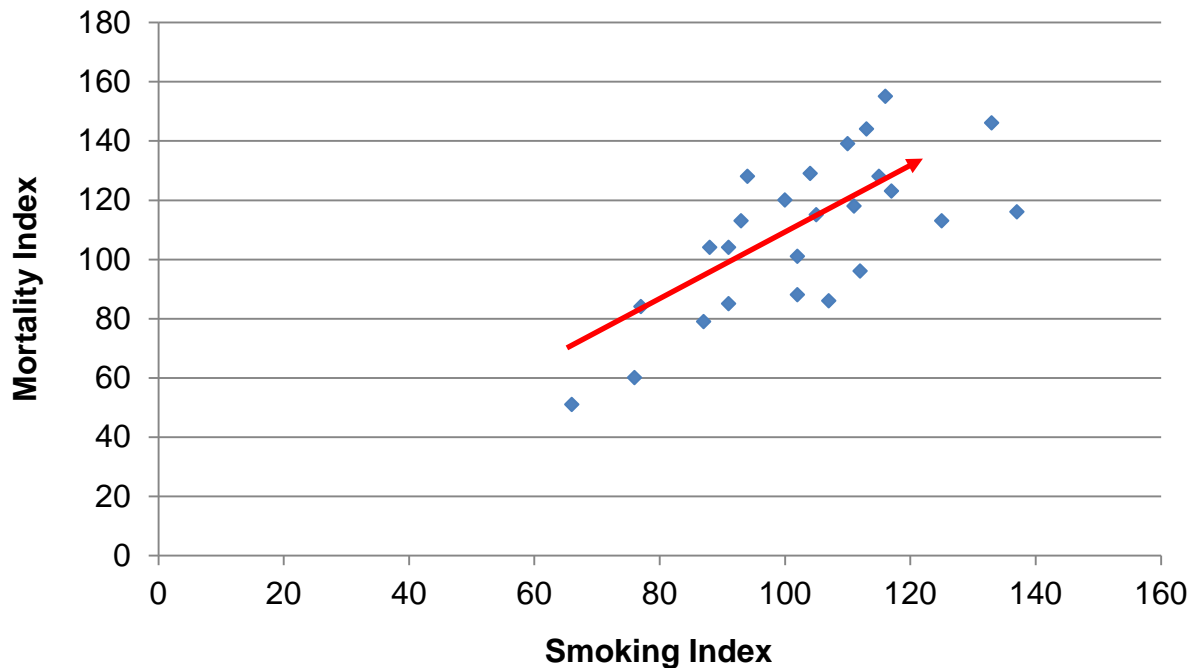
## Smoking and Lung Cancer



## Smoking and Lung Cancer

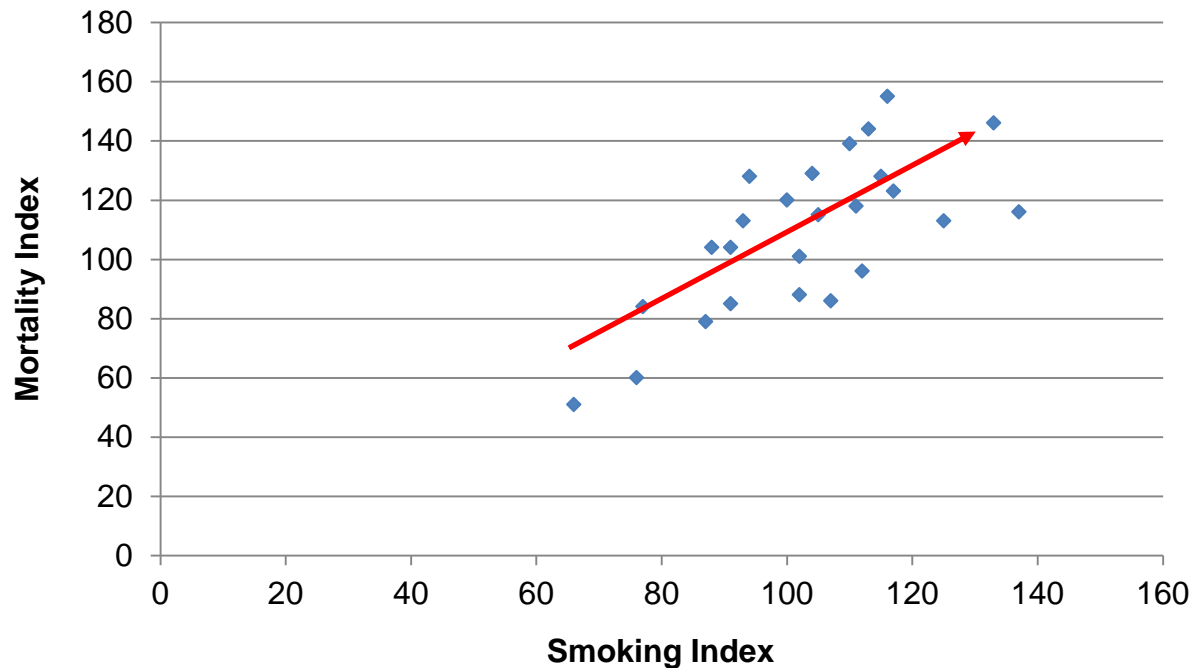


## Smoking and Lung Cancer



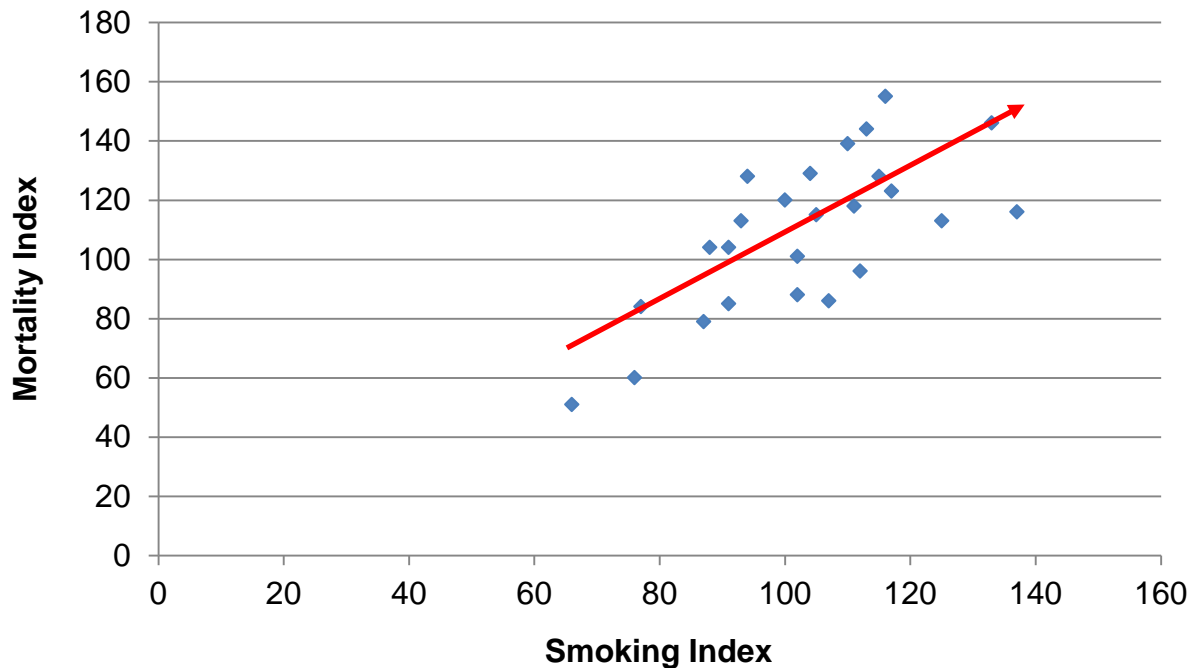


## Smoking and Lung Cancer



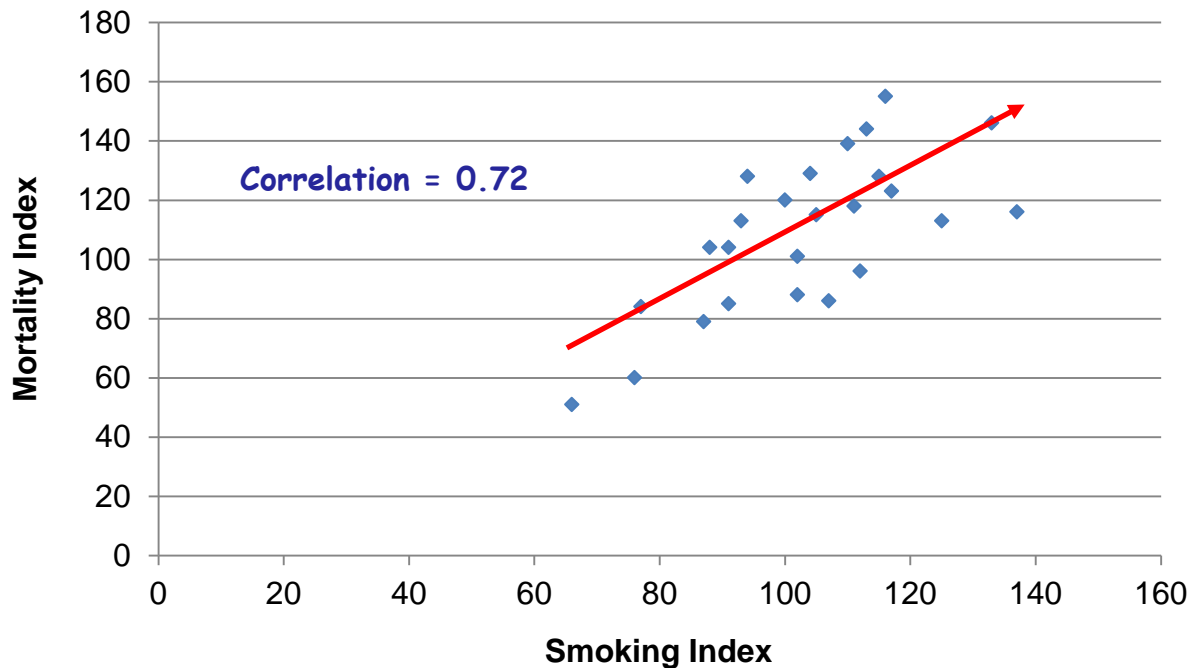


## Smoking and Lung Cancer





## Smoking and Lung Cancer



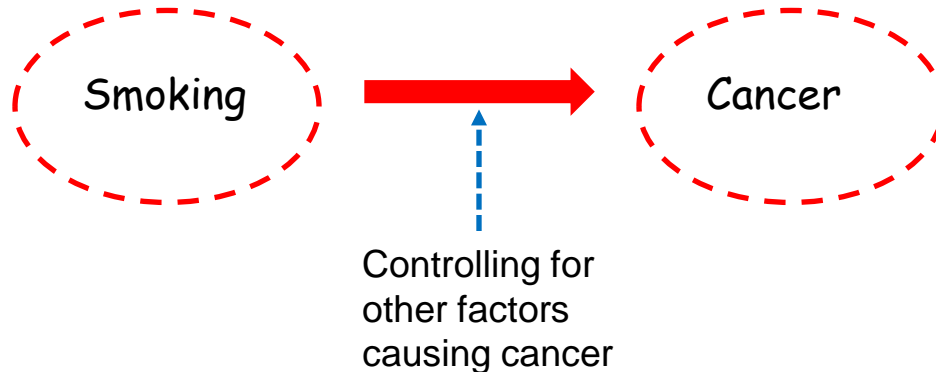


# Causation versus Correlation

Studies have firmly established that smoking  
causes cancer

# Causation versus Correlation

Studies have firmly established that smoking **causes** cancer



# Causation versus Correlation

It is important to distinguish between  
Causation and Correlation