

# Estimation of overweight-attributable deaths

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National Center for Health Statistics**

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## Allison et al, 1999

- Allison, JAMA 1999 calculated deaths attributable to overweight and obesity in 1991,
  - using relative risks from six cohort studies
  - combined with overweight and obesity prevalence from NHANES III
  - and with mortality statistics for 1991.

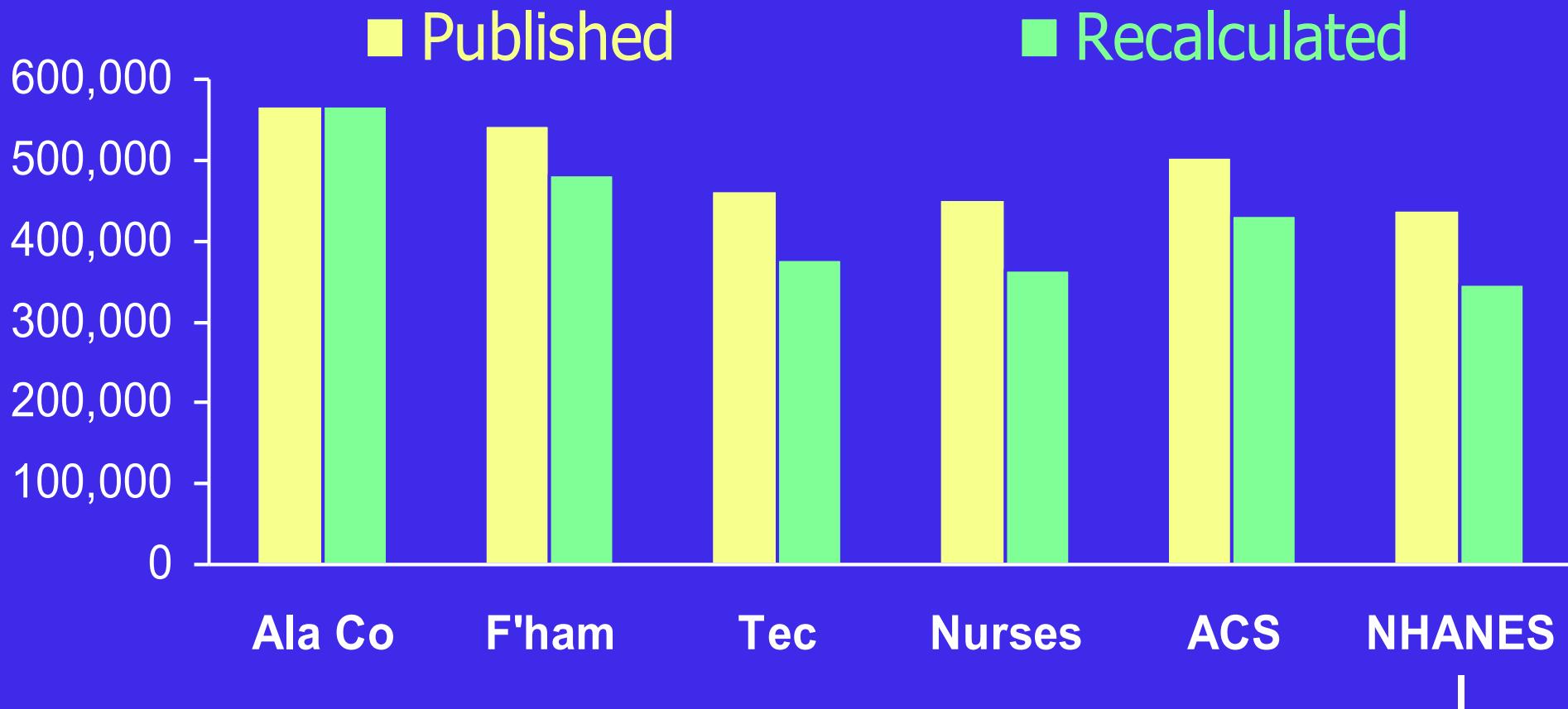
# Actual causes of death paper, 2004

- Actual causes of death, JAMA 2004 calculated deaths attributable to overweight and obesity in 2000
  - using the same relative risks from the same six cohort studies as Allison
  - combined with overweight and obesity prevalence from NHANES 1999-2000
  - and with mortality statistics for 2000.

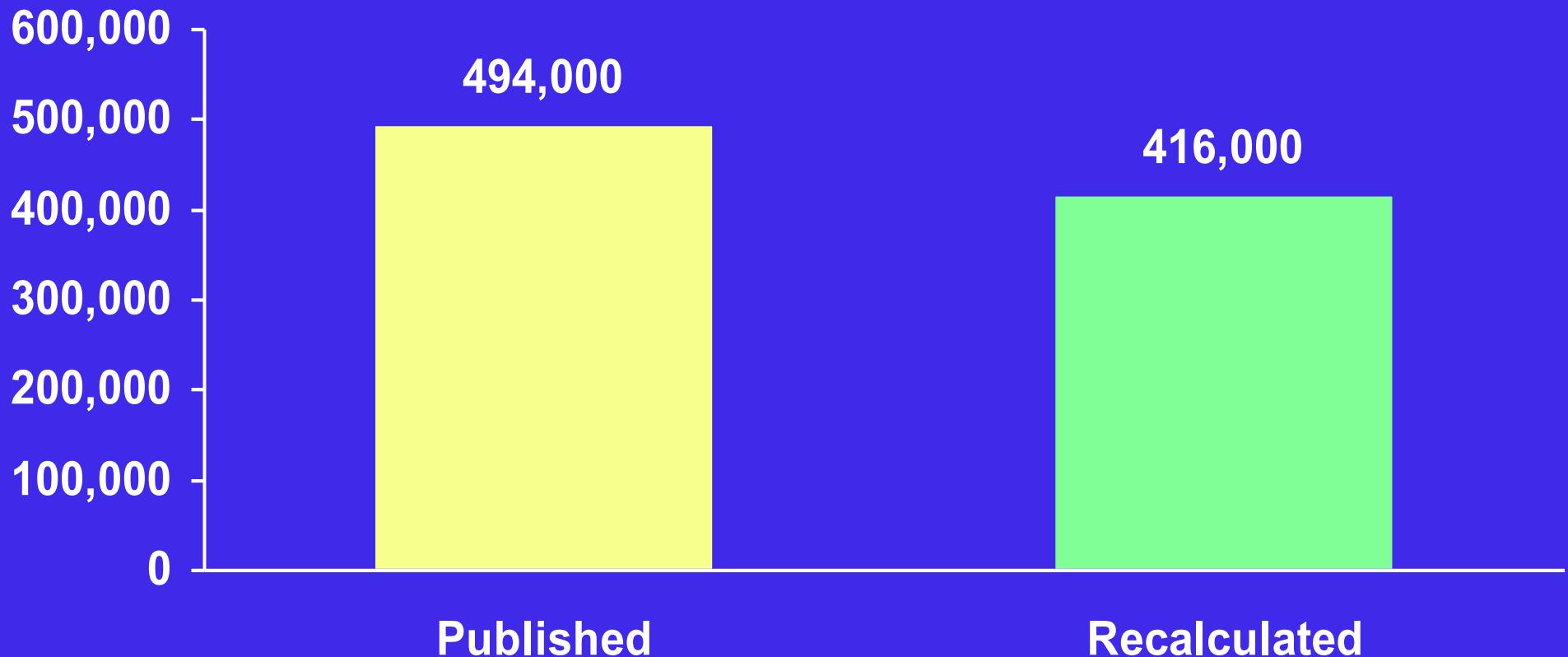
# Calculation errors in Actual Causes of Death paper

- For five of the six cohorts, the number of deaths in 1991 was used instead of the number of deaths in 2000
- For five of the six cohorts, the prevalence of  $\text{BMI} < 25$  was taken from NHANES III but the prevalence of higher BMI categories was taken from NHANES 99-00

# Published and recalculated numbers of overweight-attributable deaths



# Mean overweight-attributable deaths over six cohorts



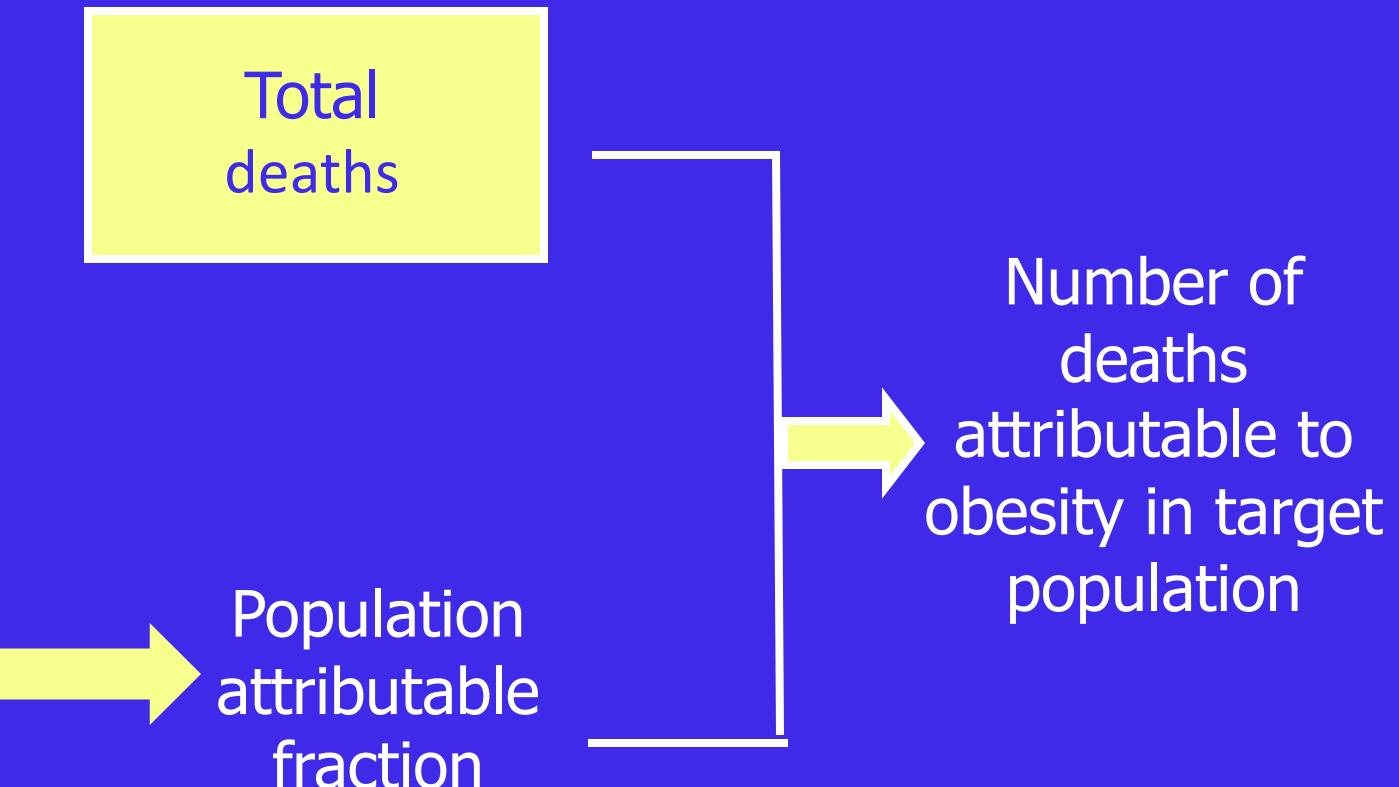
## Issues - 2

- Allison 1999 used a method of calculating attributable fractions – the “partially adjusted” method - that does not fully account for confounding or effect modification

Target population –  
the US:

Derivation Cohort:  
e.g. Framingham

Relative risk  
Prevalence of  
exposure



Derivation Cohort:  
e.g. Framingham

Relative  
risk

Target population –  
the US:

Prevalence  
of obesity

Target population –  
the US:

Total  
deaths

Population  
attributable  
fraction

Number of  
deaths  
attributable to  
obesity in target  
population

# Population Attributable Fraction (PAF)

$$\text{PAF} = \frac{P(E) * (RR-1)}{1 + (P(E) * (RR-1))}$$

$P(E)$  = prevalence of obesity

$RR$  = unadjusted relative risk of mortality associated with obesity

# Calculating PAF when there is confounding of the exposure-outcome relation

- Weighted sum method
- “Partially-adjusted” method

# Weighted sum method

Group	N	P(E)	RR	No. of deaths	PAF	Excess deaths
A	1000	.5	2	150	.333	50
B	500	.1	2	165	.0909	15
Sum						65

# “Partially adjusted” method

Group	N	P(E)	RR	No. of deaths	PAF	Excess deaths
A	1000	.5	2	150	.333	50
B	500	.1	2	165	.0909	15
Sum						65
Total	1500	.37	2	315	.2683	84.5

# Rockhill et al, 1998

- 1998, Rockhill B, Newman B, Weinberg C. Use and misuse of population attributable fractions, Am J Pub Hlth

“..Errors in estimation are common. Probably the most common error is the use of adjusted relative risks in formula 3 [formula for unadjusted RR]. The magnitude of the bias resulting from this error will depend on the degree of confounding.” P. 16

# “Partially-adjusted” method

- Annual deaths attributable to obesity in the United States. *JAMA*. 1999; 282:1530-8.
- A simple estimate of mortality attributable to excess weight in the European Union. *Eur J Clin Nutr*. 2003;57:201-8.
- Actual causes of death in the United States, 2000. *JAMA*. 2004;291:1238-45
- Overweight, obesity, and mortality from cancer in a prospectively studied cohort of U.S. adults. *N Engl J Med*. 2003;348:1625-38.

## Benichou, 2001

- 2001, Benichou J, , A review of adjusted estimators of attributable risk, Stat Med

“Another natural approach based on using equation (2) [formula for unadjusted RR] and plugging in a common adjusted relative risk estimate...has been advocated but it too has been shown to yield inconsistent estimates. and accordingly, severe bias was exhibited in simulations...” p. 200

# “Partially-adjusted” method

- Calculate adjusted relative risks
- Use a PAF formula appropriate only for unadjusted relative risks
- Treat the population as a single group (no stratification)
- In general, when there is confounding, gives biased results, but degree of bias not often quantified



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## Methods of Calculating Deaths Attributable to Obesity

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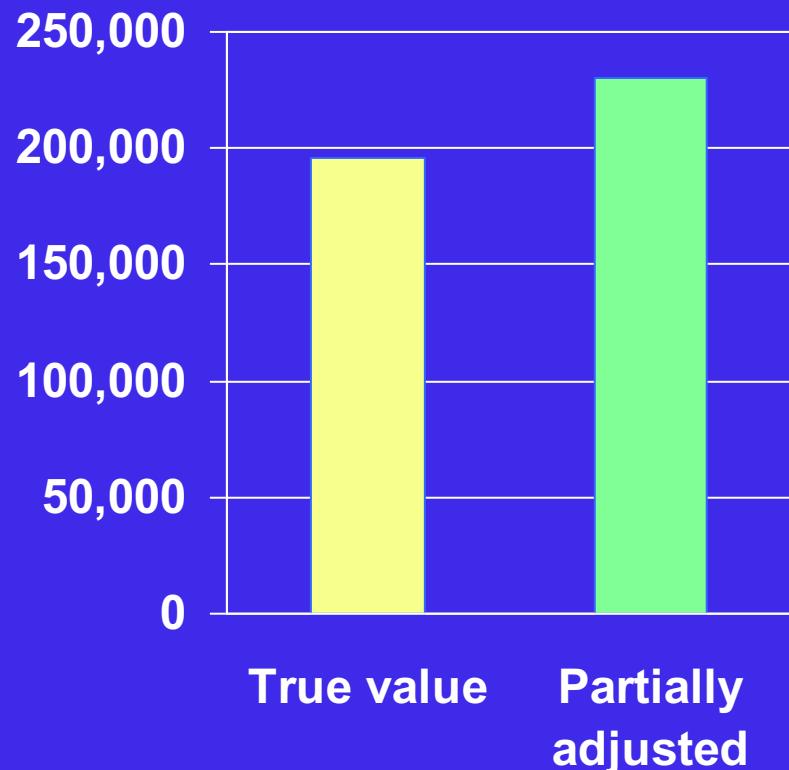
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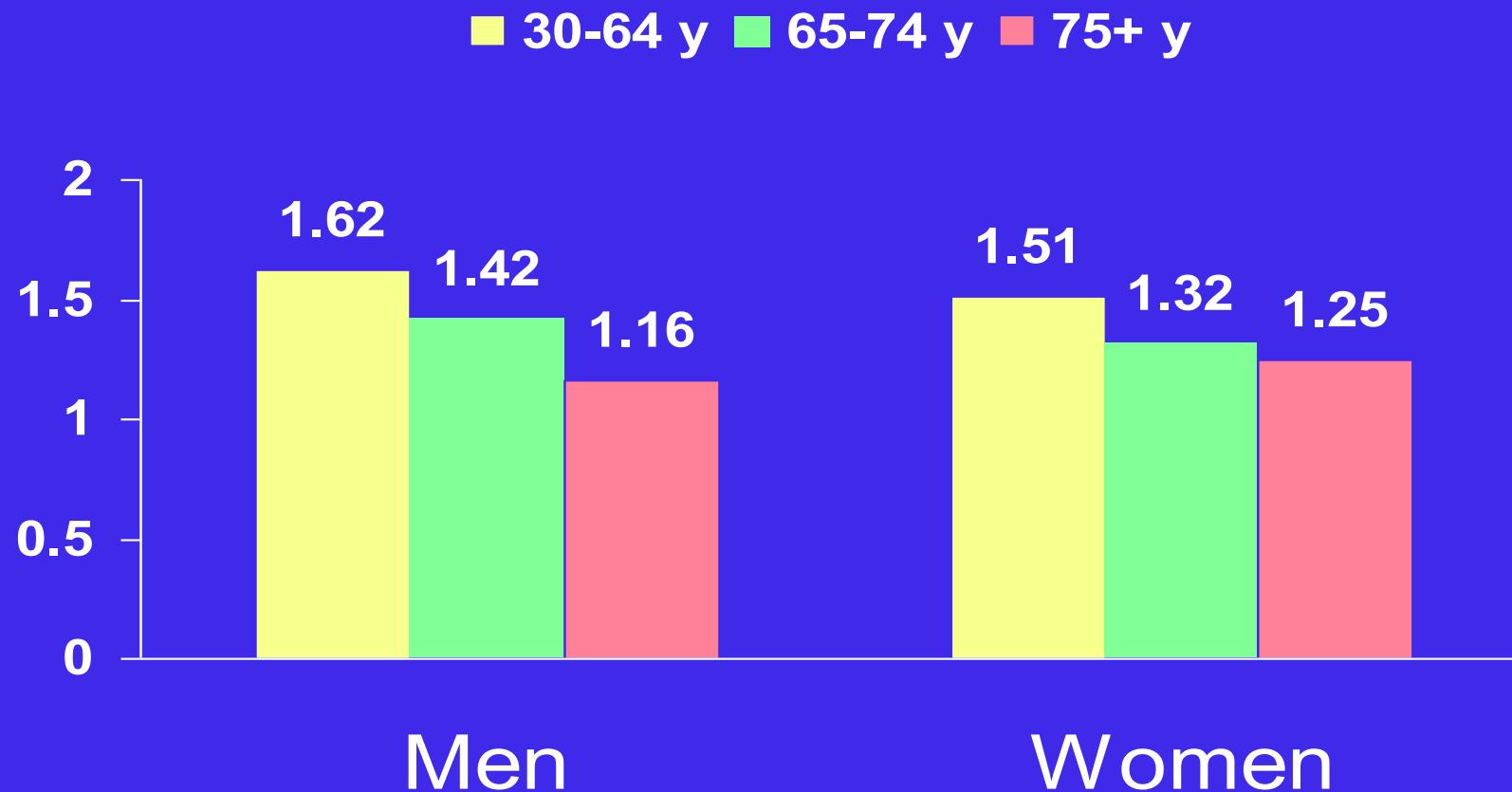
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# Bias arising from ignoring confounding by age and sex

- Partially adjusted method overestimated excess deaths due to obesity by 17% in this hypothetical example using published relative risks, NHANES III prevalence estimates and 1991 mortality data



# Relative risks of mortality associated with obesity decrease with age



Source: Calle et al NEJM, 1999

Derivation Cohort:  
e.g. Framingham

Relative  
risk

Target population –  
the US:

Prevalence  
of obesity

Target population –  
the US:

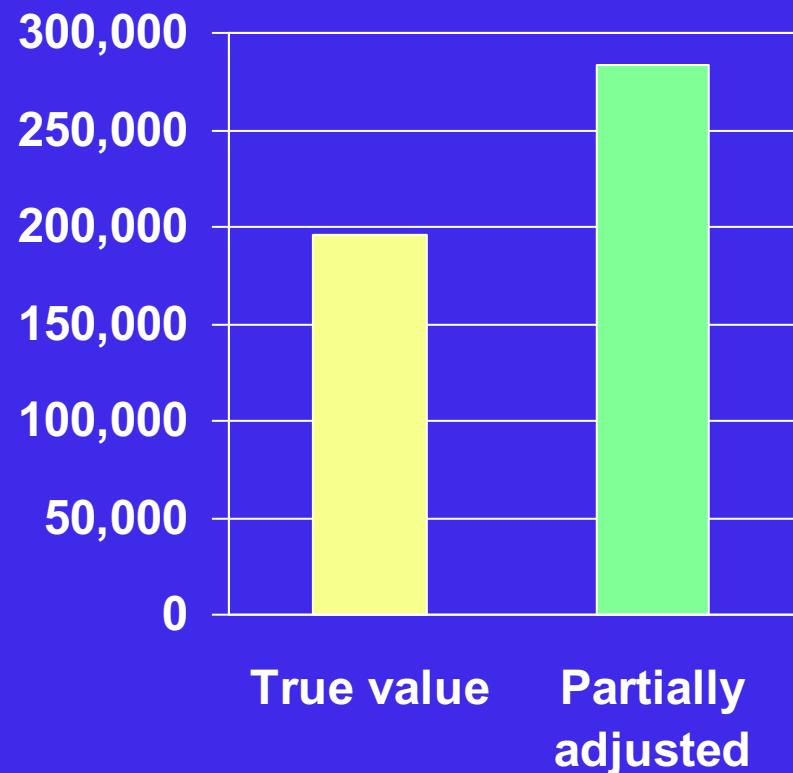
Total  
deaths

Population  
attributable  
fraction

Number of  
deaths  
attributable to  
obesity in target  
population

# Bias arising from ignoring confounding and effect modification

- Partially adjusted method overestimated excess deaths by 42% in this example when the derivation cohort had 0.4% elderly (80+ y) and the target population had 3.4% elderly



# Derivation cohort and the target population

- If there is effect modification, additional bias may result from using the 'partially adjusted method' when the derivation cohort differs from the target population in:
  - Relative proportion of subgroups
  - Probability of mortality in the non-obese
  - Prevalence of obesity

# The “partially adjusted” method

- Commonly used and intuitively appealing
- Statistical literature has already documented that the partially adjusted method gives rise to bias
- Our hypothetical examples suggest bias upwards for deaths associated with obesity
- Even when this method shows little bias in a derivation cohort, the results may be biased when applied to a different population

# Why not just use the weighted sum method?

- Age and sex are not the only confounders.
- The weighted sum method requires information on the number of deaths within each subgroup – information not generally available.
- An alternative PAF approach when there is confounding would require knowledge of the proportion of decedents who were obese – also information not generally available

# The “partially adjusted” method

- Attempts to solve the problem of having relative risks from one cohort combined with exposure data from a different source
- This method has already been shown in the statistical literature to lead to bias
- A different approach is needed to account for confounding and for effect modification