

# Accounting for Differences in Health Spending and Health Outcomes Among OECD Countries

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## Big Picture

- Health care expenditure in the United States, in year 2010 was
  - \$ 8233 per capita (17.6 percent of GDP),  
two-and-a-half times larger than the OECD average (\$3268)
  
- Life expectancy at birth in the United States, in year 2010 was
  - 78.7 years,  
one year below the OECD average

## Questions

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2. Why the life expectancy is so low despite this high spending?

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Candidate Answers:

- US has one of the highest per capita GDP among OECD countries.  
Higher income means higher spending – including health care.
- US has on of the highest obesity rate among OECD countries.  
Obese population have higher mortality.

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How important are these answers, quantitatively?

## What We Ask?

1. How much would the US spend on health care if it had GDP per capita of Japan?
2. What would be the life expectancy in the US (at that level of spending) with obesity rate of Japan?

## What We Do?

- We use a model with the following key features
  - Use of health care improves survival rate.
  - There are two types of individuals: obese and non-obese.
  - Types are different in how usage of health care affects survival.
  - Countries differ only in GPD per capita and obesity rate.

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  - Use of health care improves survival rate.
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  - Types are different in how usage of health care affects survival.
  - Countries differ only in GDP per capita and obesity rate.
- We focus on efficient allocation – there is no friction in the model.
- We calibrate this model to match the US aggregate observations.
- Use model to predict allocations for other countries.



## What We Find?

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  - 62% lower per capita health spending, and
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  - 56% lower per capita health spending, and
  - 0.7% higher life expectancy,if the GDP per capita and obesity rate was same as other countries.
- This implies that that, on average
  - Roughly 90% of the gap in health care spending, and
  - Roughly 43% of the gap in life expectancycan be accounted for by the gap in GDP per capita and obesity rate

## Related Literature

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- **Horenstein and Santos (2013)**: Differences in relative price of medical care and institutions.
- Many empirical studies on determinants of health case spending.
- Many empirical studies on the effect of obesity on health care spending and life expectancy.

# Outline of the Talk

1. OECD Data
2. Theory – Static model in this talk
3. Calibration
4. Quantitative Exercise
5. Conclusion

# Data

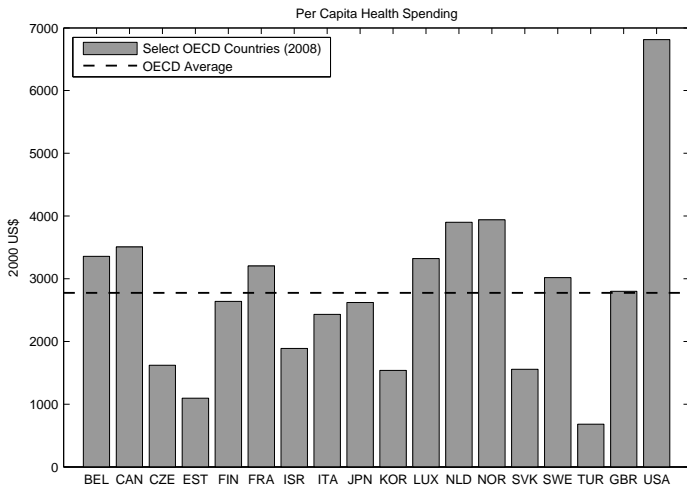


## Data

- We use OECD data on aggregate health care spending
  - Health spending includes all public and private expenditures.
- We use OECD data on obesity rate
  - Self-reported obesity (except for Japan)
  - Obesity is defined as  $BMI > 30$  for adults.
- We have total of 273 country–year observations.
  - Data available for at least one year for 33 countries.
- In this talk we report data and results for 18 countries in year 2008.

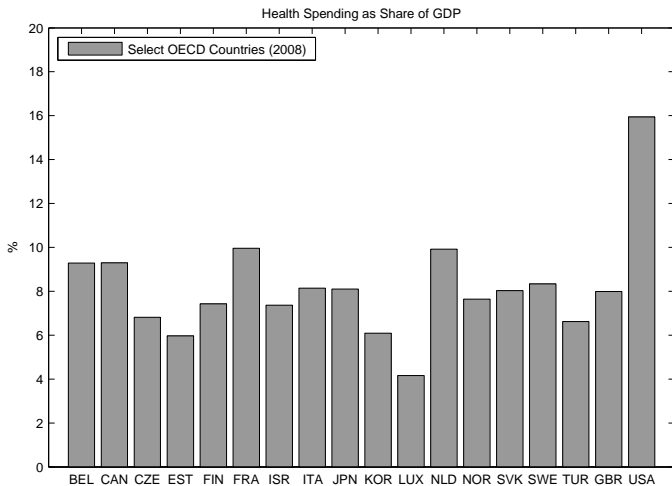
# Data

## Per Capita Health Care Spending



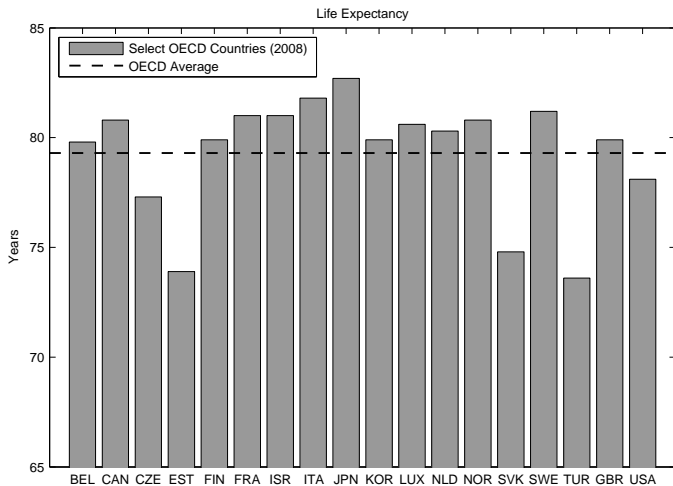
# Data

## Health Care Spending as Share of GDP



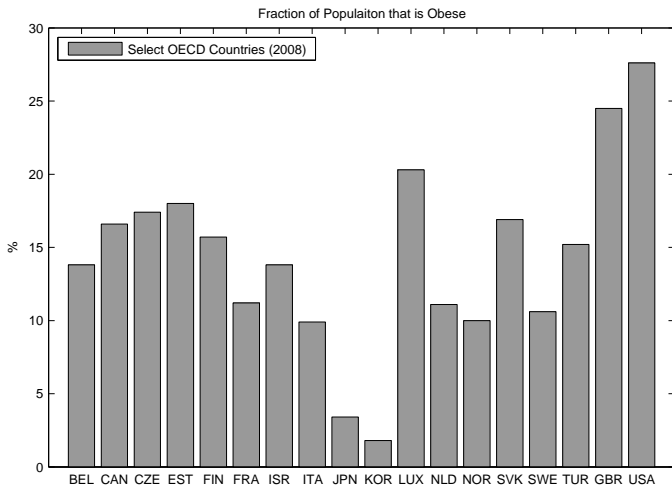
# Data

## Life Expectancy at Birth



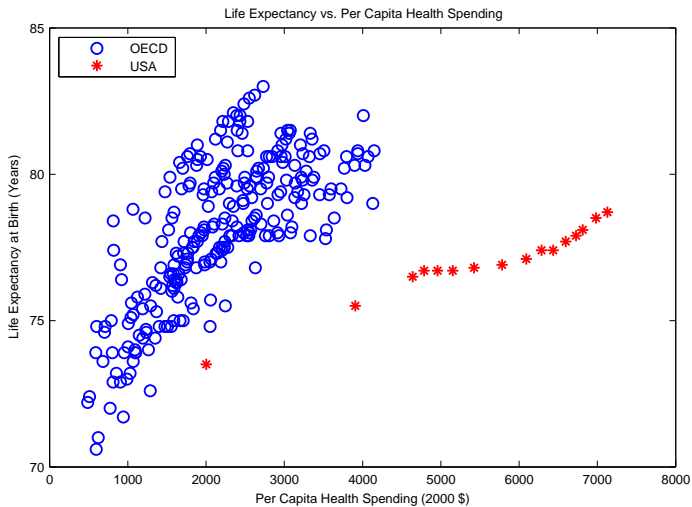
# Data

## Fraction of Population that is Obese



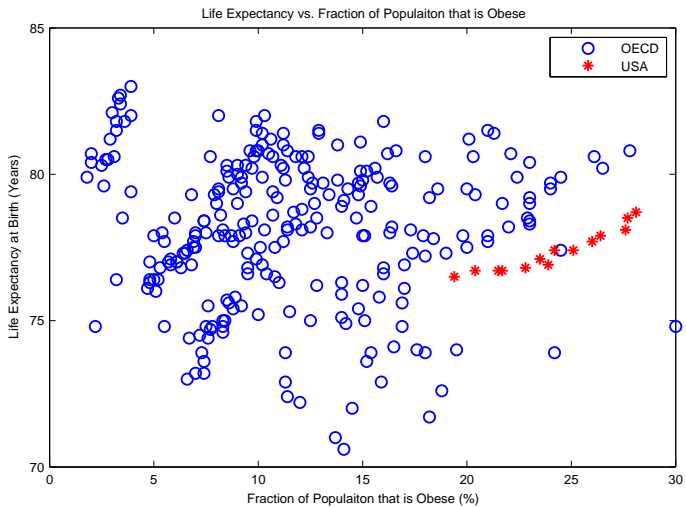
# Data

## Life Expectancy vs. Health Care Spending



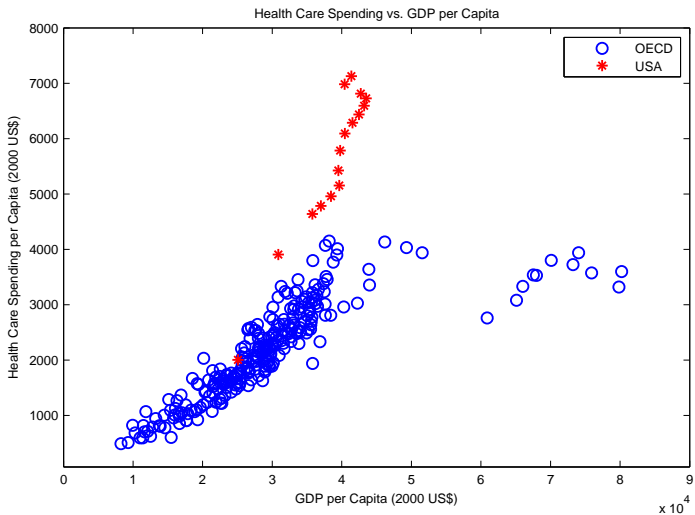
# Data

## Life Expectancy vs. Obesity



# Data

## Health Care Spending vs. GDP





## Theory: Simple Static Model

## Model Individuals

- There are two types,  $i = ob, nob$ , (potentially) infinitely lived
- Type  $i$  have constant *health status*  $x_i$  which determines mortality

$$\int_0^{\infty} \exp(-t/x_i) u(c_i(t)) dt \quad , i = ob, nob$$

- Type  $i$  spend constant flow  $h_i$  on health.

$$x_i = f_i(h_i), \quad -f_i'', f_i' > 0$$

- Everyone has constant endowment  $y$ .

$$\int_0^{\infty} \exp(-t/x_i) (c_i(t) + h_i - y) dt = 0$$

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# Model

## Efficient Allocation of Consumption and Health Care

- Let  $\psi$  be fraction obese population (type  $i = ob$ )
- Consider the following planning problem

$$\max \psi \int_0^{\infty} e^{-(t/x_{ob})} u(c_{ob}(t)) dt + (1-\psi) \int_0^{\infty} e^{-(t/x_{nob})} u(c_{nob}(t)) dt$$

s.t.

$$\psi \int_0^{\infty} e^{-(t/x_{ob})} (c_{ob}(t) + h_{ob} - y) dt +$$
$$(1 - \psi) \int_0^{\infty} e^{-(t/x_{nob})} (c_{nob}(t) + h_{nob} - y) dt = 0$$

$$x_i = f_i(h_i)$$

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- Consumption allocation will be the same across time and type.

## Model

### Efficient Allocation of Consumption and Health Care

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- Consider the following planning problem

$$\max \psi x_{ob} u(c_{ob}) + (1 - \psi) x_{nob} u(c_{nob})$$

s.t.

$$\psi x_{ob} (c_{ob} + h_{ob} - y) + (1 - \psi) x_{nob} (c_{nob} + h_{nob} - y) = 0$$

$$x_i = f_i(h_i)$$

- Consumption allocation will be the same across time and type.
- The problem simplifies to a static maximization problem.

# Model

## Characterizing Allocations

- First order condition

$$\frac{u(c)}{u'(c)} = \frac{x_i}{f'_i(h_i)}$$



# Model

## Characterizing Allocations

- First order condition – interpretation

$$\underbrace{\frac{x_i u(c)}{u'(c)}}_{\text{marginal value of life}} = \underbrace{\frac{x_i^2}{f'_i(h_i)}}_{\text{marginal cost of life}}$$

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- Assume

$$u(c) = b + \frac{c^{1-\gamma}}{1-\gamma}, \text{ and } x_i = f_i(h_i) = A_i h_i^{\eta_i}$$

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- Assume

$$u(c) = b + \frac{c^{1-\gamma}}{1-\gamma}, \text{ and } x_i = f_i(h_i) = A_i h_i^{\eta_i}$$

- Then

$$bc^\gamma - \frac{c}{1-\gamma} = \frac{h_i}{\eta_i}$$

# Model

## Properties of Static Model

$$bc^\gamma - \frac{c}{1-\gamma} = \frac{h_i}{\eta_i}$$

- If  $h_{ob} > h_{nob}$  if and only if  $\eta_{ob} > \eta_{nob}$ .
- $A_i$  does not affect this equation. This is useful for calibration.

# Calibration

# Calibration

## Health Expenditure of Obese vs. Non-Obese

- Use Medical Expenditure Panel Survey (MEPS) from 1997 to 2010.
- Define obesity if  $BMI \geq 30$  ( $\geq 28$  if younger than 20)
- Calculate average health care spending by obese and non-obese
- Obese people spend on average %37.8 more.
- Assume this ratio is constant for the period we study (in the US)
- We split the aggregate health care spending according to this ratio.

## Calibration

Parameters of Survival function:  $\eta_i$

$$bc^\gamma - \frac{c}{1-\gamma} = \frac{h_i}{\eta_i}$$

- Use data on health care spending by type and obesity rate.
- Choose  $b$ ,  $\eta_{ob}$  and  $\eta_{nob}$  such that
  - Health care spending data in year 2000 solves the FOC.
  - Value of statistical life is \$9 million.

## Calibration

Parameters of Survival function:  $A_i$

$$x_i = A_i h_t^{\eta_i}$$

- Use data on life expectancy for the whole population, 1959 to 2010.
- Regress life expectancy data on common time trend.
- Take unexplained residual for the U.S., call it  $Z_t$ .
- Use data on obesity rate, health care spending and calibrated  $\eta_i$ 's

$$Z_t = \psi_t A_{ob} h_{t,ob}^{\eta_{ob}} + (1 - \psi_t) A_{nob} h_{t,nob}^{\eta_{nob}}$$

to find  $A_{ob}$  and  $A_{nob}$



# Calibration

## Summary

Parameter		Value
$\gamma$		2
$b$	value of statistical life = \$9 mil	0.0002
$\psi$	fraction of obese population, U.S. (OECD)	21.7%
$y$	endowment (C+G), NIPA	30094
survival function parameters		
$\eta_{ob}$		0.065
$\eta_{nob}$		0.045
$A_{ob}$		26.48
$A_{nob}$		49.12

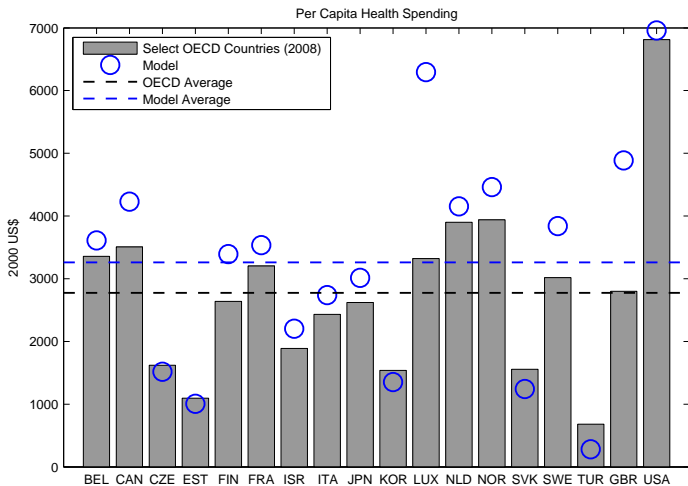
## Quantitative Exercise

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- The model is calibrated to match the US observation in year 2000.
- Generate health care spending and life expectancy for country  $j$ 
  - Assuming US has GDP per capita and obesity rate of country  $j$
- Compare model generated allocation with OECD data.

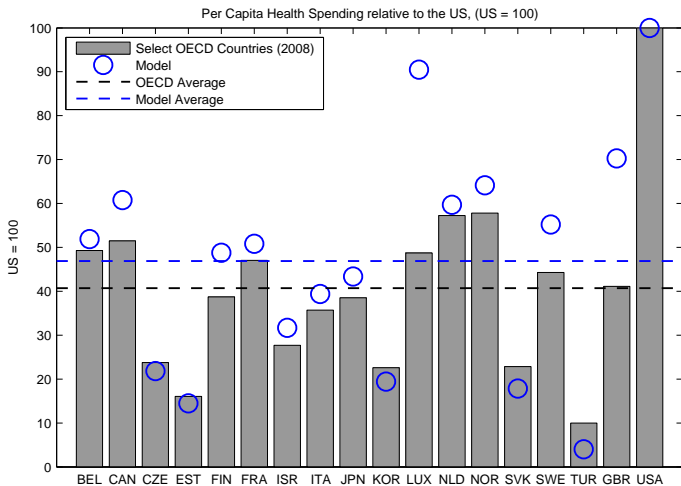
# Data vs Model

## Per Capita Health Care Spending



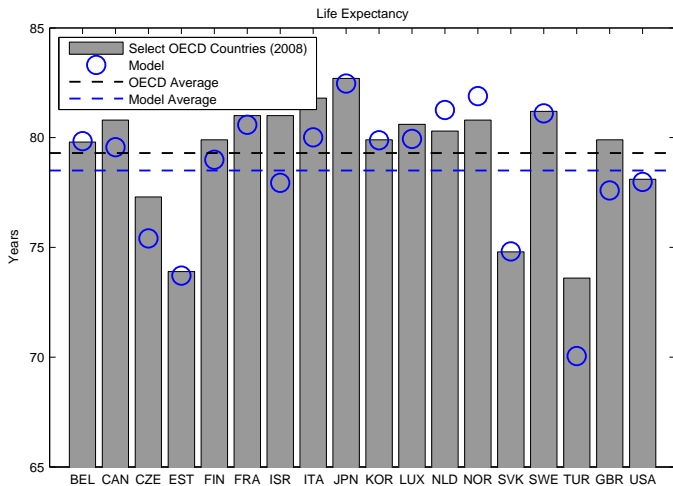
# Data vs Model

## Per Capita Health Care Spending, Relative to the US



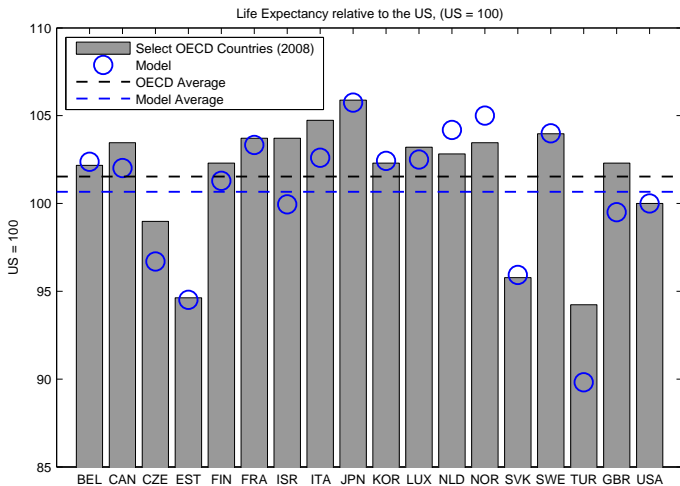
# Data vs Model

## Life Expectancy at Birth



# Data vs Model

Life Expectancy at Birth, relative to the US (US = 100)



## Experiment

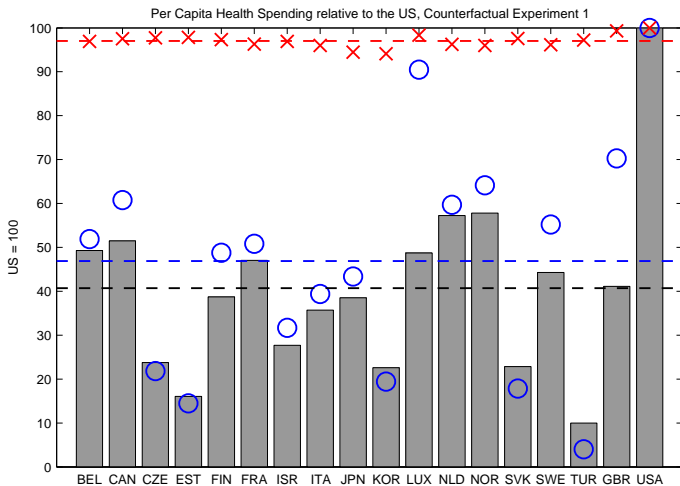
### GDP Per Capita or Obesity Rate?

- Which one these factors is more important?
- We repeat our exercise by
  1. Keeping GDP per capita at the US level, only vary obesity rate.
  2. Keeping obesity rate at the US level, only vary GDP per capita.



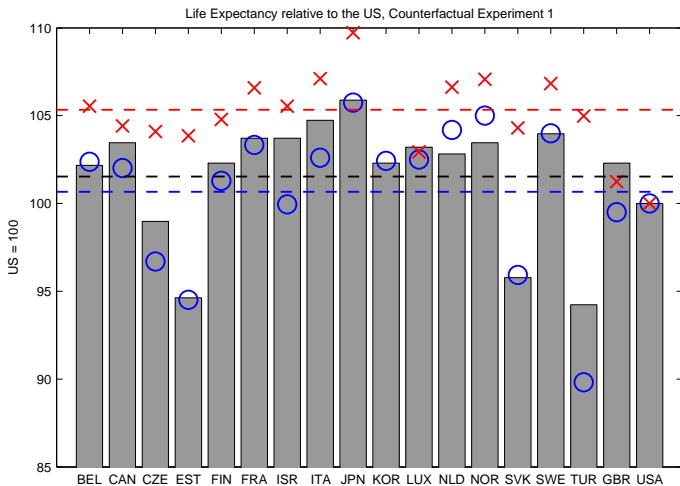
# Experiment 1: Holding GDP per capita at US level

## Per Capita Health Care Spending, Relative to the US



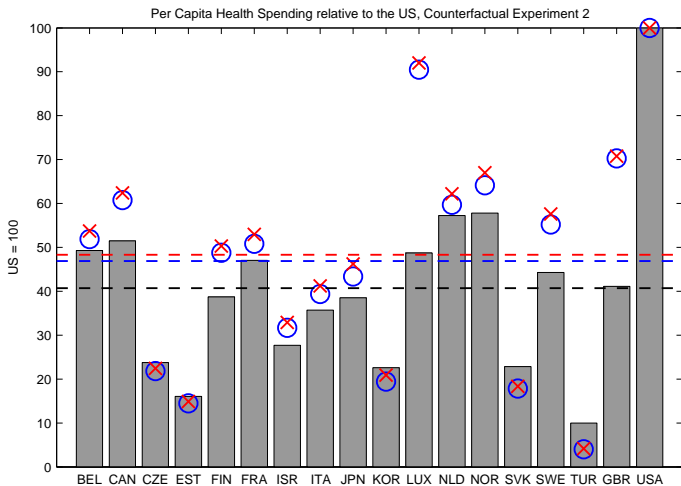
# Experiment 1: Holding GDP per capita at US level

Life Expectancy at Birth, relative to the US (US = 100)



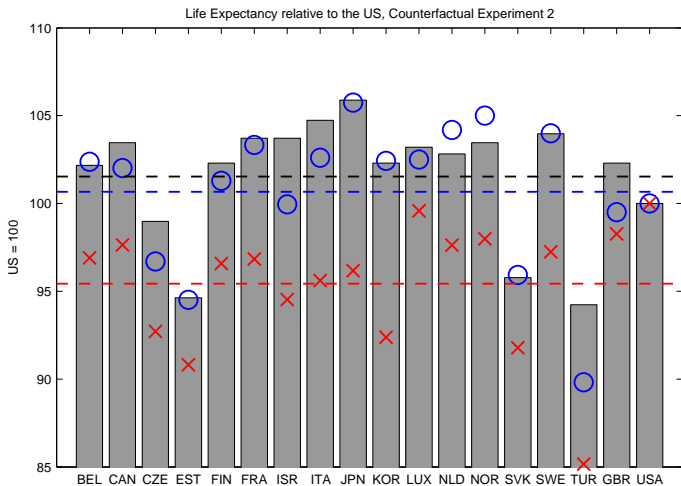
## Experiment 2: Holding Obesity Rate at US level

### Per Capita Health Care Spending, Relative to the US



## Experiment 2: Holding Obesity Rate at US level

Life Expectancy at Birth, relative to the US (US = 100)



## Results Summary

Per Capita Health Care Spending, relative to the US

Country	Data	Benchmark	Only Obesity Rate	Only GDP
Belgium	49	52	97	54
Canada	51	61	98	62
Czech Republic	24	22	98	22
Estonia	16	14	98	15
Finland	39	49	97	50
France	47	51	96	53
Israel	28	32	97	33
Italy	36	39	96	41
Japan	38	43	94	46
Korea	23	19	94	21
Luxembourg	49	90	98	92
Netherlands	57	60	96	62
Norway	58	64	96	67
Slovak Republic	23	18	98	18
Sweden	44	55	96	58
Turkey	10	4	97	4
UK	41	70	99	71
USA	100	100	100	100

## Results Summary

### Life Expectancy, relative to the US

Country	Data	Benchmark	Only Obesity Rate	Only GDP
Belgium	102	102	106	97
Canada	103	102	104	98
Czech Republic	99	97	104	93
Estonia	95	95	104	91
Finland	102	101	105	97
France	104	103	107	97
Israel	104	100	106	95
Italy	105	103	107	96
Japan	106	106	110	96
Korea	102	102	110	92
Luxembourg	103	103	103	100
Netherland	103	104	107	98
Norway	103	105	107	98
Slovak Republic	96	96	104	92
Sweden	104	104	107	97
Turkey	94	90	105	85
UK	102	100	101	98
USA	100	100	100	100

# Extention to Life Cycle Model

## Work in Progress

- We are using NLSY data to
  - Estimate mortality by age for obese and non-obese,
  - Probability of becoming obese at each age.
- We use MEPS data on spending and CDC mortality data to
  - Estimate parameters of the survival functions for each age group.
- Once we have these estimates we can run the full dynamic model.
- This work is in progress, but we don't have any results to report.

## Conclusion

- Many important details on institutional arrangement missing from analysis.
- Large differences across countries with regard to those arrangements.
- We focus only on the differences in income
- We find the income differences have large effect.