



# Module 3: Medicare Advantage Quality and Regression Discontinuity

## Part 1: MA Data and Quality Measurement

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Ian McCarthy | Emory University  
Econ 470 & HLTH 470

# What is Medicare Advantage

- Private provision of health insurance for Medicare beneficiaries
- Medicare "replacement" plans
- It's just private insurance for those eligible for Medicare

# Medicare Advantage History

- Existed since 1980s, formalized in the 1990s, expanded in 2000s
- Medicare+Choice as part of Balanced Budget Act in 1997
- Largest expansion: Medicare Modernization Act in 2003 (also brought Medicare Part D)

# Medicare Advantage Details

In its current form...

- Insurers submit plan details and a price needed to cover traditional Medicare ("bid")
- If approved, Medicare pays risk-adjusted bid *or* benchmark
- Bid < benchmark, insurer gets a rebate
- Bid > benchmark, insurer charges premium
- Seperate bidding for Part D

# Medicare Advantage in Real Life

Let's take a look at the Medicare Advantage plan options...

[Medicare Plan Finder](#)

# Medicare Advantage Quality Ratings

- Initial MA Star Ratings (2007)
- Overall rating introduced in 2009
- Complicated formula...
- **key point:** ratings from several domains are averaged and then rounded
- More details available [here](#)

# Role of Quality Ratings

- Potentially affect plan choice
- Quality bonus program in 2012
  - Demonstration program at first (2012 through 2015)
  - ACA quality bonus payments begin 2015

# Details of QBP

Eligible plans may receive two bonuses:

1. Benchmark bonus: Increased benchmark payment of up to 5\%
2. Rebate bonus: Share of bid-benchmark differential going back to insurer (from 50% up to 70%)
  - Applied to plans with 3-stars and above from 2012-2015 (demonstration period)
  - Applied to plans with 4-stars and above beginning 2015



# Some good primers

- [KFF Bonus Payment Illustration](#)
- [2021 Star Ratings and Bonus Payments](#)

# Medicare Advantage Data

- Recall the Medicare Advantage repository, [Medicare Advantage GitHub repository](#)
- Now we need to work with the **final** dataset

# Final MA Data

```
ma.data ← read_rds(here("data/final_ma_data.rds"))
```

# Summary stats

Focus on enrollments and star ratings:

```
stargazer(as.data.frame(ma.data %>% select(avg_enrollment, avg_eligibles, Star_Rating)), type="html")
```

Statistic	N	Mean	St. Dev.	Min	Pctl(25)	Pctl(75)	Max
planid	895,495	35.849	69.789	1	4	41	999
avg_enrollment	204,173	397.404	1,578.641	11.000	31.250	231.667	63,234.080
avg_eligibles	749,267	42,587.920	98,741.840	11.571	3,798.000	37,116.570	1,355,734.000
Star_Rating	448,793	3.307	0.783	1.500	2.500	4.000	5.000

# Clean the data

Limit to plans with:

- Observed enrollments,  $> 10$
- First year of star rating (2009)
- Observed star rating

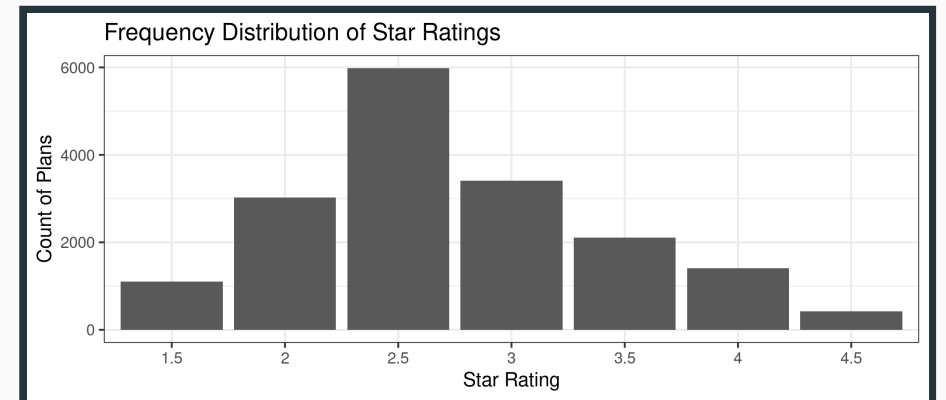
```
ma.data.clean ← ma.data %>%  
  filter(!is.na(avg_enrollment) & year=2009 & !is.na(partc_score))
```

# Calculate raw average rating

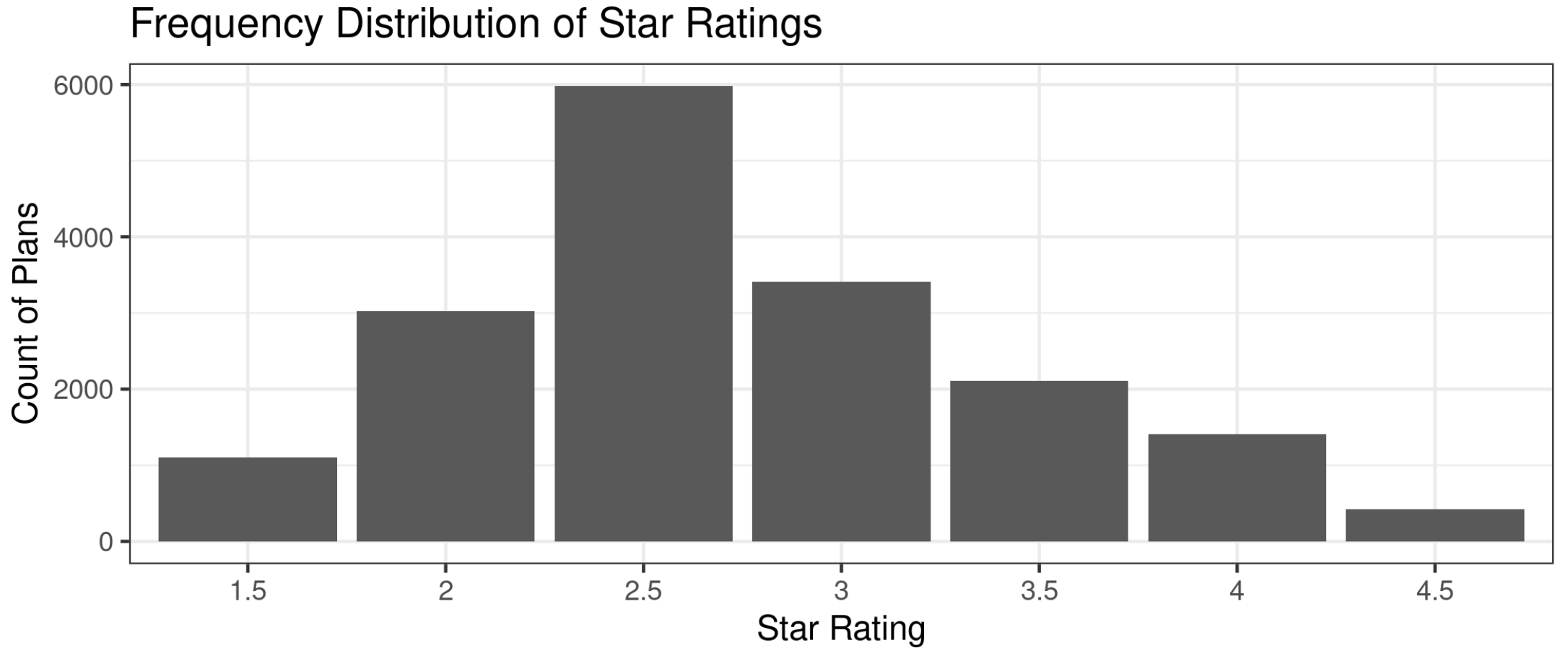
```
ma.data.clean ← ma.data.clean %>%
  mutate(raw_rating=rowMeans(
    cbind(breastcancer_screen,rectalcancer_screen,cv_cholscreen,diabetes_cholscreen,
      glaucoma_test,monitoring,flu_vaccine,pn_vaccine,physical_health,
      mental_health,osteo_test,physical_monitor,primaryaccess,
      hospital_followup,depression_followup,nodelays,carequickly,
      overallrating_care,overallrating_plan,calltime,
      doctor_communicate,customer_service,osteo_manage,
      diabetes_eye,diabetes_kidney,diabetes_bloodsugar,
      diabetes_chol,antidepressant,bloodpressure,ra_manage,
      copd_test,betablocker,bladder,falling,appeals_timely,
      appeals_review),
    na.rm=T)) %>%
  select(contractid, planid, fips, avg_enrollment, first_enrollment,
    last_enrollment, state, county, raw_rating, partc_score,
    avg_eligibles, avg_enrolled, premium_partc, risk_ab, Star_Rating,
    bid, avg_ffscost, ma_rate)
```

# Distribution of star ratings

```
ma.data.clean %>%  
  ggplot(aes(x=as.factor(Star_Rating))) +  
  geom_bar() +  
  labs(  
    x="Star Rating",  
    y="Count of Plans",  
    title="Frequency Distribution of Star Ratings"  
  ) + theme_bw()
```



# Distribution of star ratings





# Enrollments and star ratings

```
##  
## Call:  
## lm(formula = avg_enrollment ~ factor(Star_Rating), data = ma.data.clean)  
##  
## Residuals:  
##      Min       1Q   Median       3Q      Max   
## -627    -388    -214     -51   41908   
##  
## Coefficients:  
##              Estimate Std. Error t value Pr(>|t|)      
## (Intercept)         87.31     43.32   2.016  0.04387 *    
## factor(Star_Rating)2    32.75     50.62   0.647  0.51758      
## factor(Star_Rating)2.5  194.65     47.15   4.128 3.67e-05 ***  
## factor(Star_Rating)3    433.95     49.84   8.707 < 2e-16 ***  
## factor(Star_Rating)3.5  470.91     53.47   8.808 < 2e-16 ***  
## factor(Star_Rating)4    552.30     57.91   9.538 < 2e-16 ***  
## factor(Star_Rating)4.5  272.36     82.68   3.294  0.00099 ***  
## ---  
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1  
##  
## Residual standard error: 1440 on 17451 degrees of freedom  
## Multiple R-squared:  0.01559,    Adjusted R-squared:  0.01526   
## F-statistic: 46.07 on 6 and 17451 DF,  p-value: < 2.2e-16
```