

Effects of Advertising campaigns on Humana customers

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Humana Inc. is a for-profit American health insurance company based in Louisville, Kentucky.



Humana had over 13 million customers in the U.S., reported a 2013 revenue of US\$41.3 billion

The Health Insurance Company: **Humana Inc**



DATASET

- This is a panel data with data captured over two time periods, 2014 and 2015 for each county
- Data comprises of Expenditure in various marketing campaigns.
- HMO, PPO plans of the company and its competitors
- Dependent Variable: Change in Customers for a year

HMO -Health Maintenance Organization*

PPO -Preferred Provider Organization*

Issues encountered

- This is an Unbalanced Panel Data, the number of time periods (year: 2014, 2015) is not same for all cross-sectional data (ID).
- So, ID's with missing time periods are identified and omitted from the dataset to make the panel data balanced.
- Python is used to clean the data and write the cleaned data to a 'CSV' file, for us to do our further analysis.

```
import pandas as pd
df = pd.read_csv('humana.csv')
print(df)

null_data = df[df.isnull().any(axis=1)]

df1= pd.DataFrame(null_data)

pd.options.display.max_rows = 1500
# print(df1['id'])
a = pd.DataFrame(df1['id'])

df1.to_excel("output.xlsx")

pd.dataframe(df1['id'])

a_list = a['id'].tolist()

cleaned_df = df[df['id'].isin(a_list) == False]

cleaned_df.to_csv('cleaned_df.csv')
```

Model

- Since this is a panel data, fixed effects model is used to estimate the parameters.

Why pooled OLS cannot be used here?

- Does not account for the structure of panel data
- OLS Assumption is violated – Correlation of dependent variable with error term is not zero.
- SAS is used to run the model.

```
data econ;
  set WORK.cleaned;
run;

proc panel data=econ;
  id id year;
  model ttl_member_cnt_change2 = zillow_housing_value
    TTL_ELIGIBLE
    national_tv_brand_01_07
    pi_humana
    humana_count_hmo_plans
    humana_count_ppo_plans
    pi_competitors
    tot_num_competitor_hmo_plans
    tot_num_competitor_ppo_plans
    HUM_CNTY_MA_MAPD
    digital_sem
    dm
    drtv_longform
    drtv_shortform
    local_print
    local_tv
    national_tv_product
    outdoor
    radio
```

Results

| Parameter Estimates | | | | | | |
|------------------------------|----|----------|----------------|---------|---------|------------------------------|
| Variable | DF | Estimate | Standard Error | t Value | Pr > t | Label |
| Intercept | 1 | -1262.52 | 522.9 | -2.41 | 0.0158 | Intercept |
| zillow_housing_value | 1 | 0.005436 | 0.00112 | 4.85 | <.0001 | zillow_housing_value |
| TTL_ELIGIBLE | 1 | 0.105721 | 0.00900 | 11.75 | <.0001 | TTL_ELIGIBLE |
| national_tv_brand_01_07 | 1 | 0.088093 | 0.00618 | 14.27 | <.0001 | national_tv_brand_01_07 |
| pi_humana | 1 | -14.7193 | 6.8129 | -2.16 | 0.0308 | pi_humana |
| humana_count_hmo_plans | 1 | 115.1954 | 38.2955 | 3.01 | 0.0026 | humana_count_hmo_plans |
| humana_count_ppo_plans | 1 | -131.091 | 16.9932 | -7.71 | <.0001 | humana_count_ppo_plans |
| pi_competitors | 1 | -63.7664 | 7.8792 | -8.09 | <.0001 | pi_competitors |
| tot_num_competitor_hmo_plans | 1 | -132.027 | 25.1801 | -5.24 | <.0001 | tot_num_competitor_hmo_plans |
| tot_num_competitor_ppo_plans | 1 | -61.4442 | 19.0441 | -3.23 | 0.0013 | tot_num_competitor_ppo_plans |
| HUM_CNTY_MA_MAPD | 1 | -1.09913 | 0.0181 | -60.68 | <.0001 | HUM_CNTY_MA_MAPD |
| digital_sem | 1 | -0.14537 | 0.00997 | -14.58 | <.0001 | digital_sem |
| dm | 1 | 0.043601 | 0.00253 | 17.26 | <.0001 | dm |
| drtv_longform | 1 | 0.093396 | 0.00978 | 9.55 | <.0001 | drtv_longform |
| drtv_shortform | 1 | 0.033538 | 0.00853 | 3.93 | <.0001 | drtv_shortform |
| local_print | 1 | 0.013739 | 0.00275 | 5.00 | <.0001 | local_print |
| local_tv | 1 | -0.01125 | 0.00612 | -1.84 | 0.0658 | local_tv |
| national_tv_product | 1 | 0.12099 | 0.0245 | 4.93 | <.0001 | national_tv_product |
| outdoor | 1 | 0.148685 | 0.0266 | 5.58 | <.0001 | outdoor |
| radio | 1 | 0.066353 | 0.0593 | 1.12 | 0.2636 | radio |
| national_tv_brand | 1 | 0.039769 | 0.00885 | 4.49 | <.0001 | national_tv_brand |

- **Zillow_housing_value**

For every \$1000 increase in the Zillow housing value in a county, an average of 5 customers are increased in that county.

- **TTL_ELIGIBLE**

An increase of 10 customers in Medicare insurance holders will result in 1 customer increase.

- **national_tv_brand_o1_o7**

An increase of \$12.5 spent on national brand tv from months 1st to 8th will result in 1 customer increase.

- **pi_humana**


One-point increase in purchase intent from humana (scaled from 1-7, 1 being highest) will result in a decrease of 15 customers.

- **humana_count_hmo_plans**

One unit increase in humana_count_hmo_plans will result in 115 customers increase.

- **humana_count_ppo_plans**

One unit increase in humana_count_ppo_plans will result in 113 customers decrease.



Interpretations' of each Independent Variable

- **pi_competitors**

One-point increase in purchase intent from HUMANA competitors will result in a decrease of 64 customers.

- **tot_num_competitor_hmo_plans**


One unit increase in **tot_num_competitor_hmo_plans** will result in 132 customers decrease.

- **tot_num_competitor_ppo_plans**

One unit increase in **tot_num_competitor_ppo_plans** will result in 61 customers decrease.

- **HUM_CNTY_MA_MAPD**

One customer increase in humana medicare customers will result in 1 customer decrease on an average.



Interpretations' Cont.

- **Digital SEM (Search Engine Marketing)**

An increase of \$100 spent on digital marketing SEM will result in 14 customer decrease on an average.

- **Direct Mails**

An increase of \$100 spent on direct mails will result in 4 customer increase on an average.

- **Direct Response TV longform**

For every 100\$ increase in the spending of direct response tv longform, the average number of customers increases by 9 approx.

- **Direct Response TV shortform**

For every 100\$ increase in the spending of direct response tv shortform, the average number of customers increases by 3 approx.

- **Local_print**

For every 100\$ increase in the spending of local print, the average number of customers increases by 1 approx.

- **Local_tv**

The spending on local tv is not a significant factor in deciding the number of humana customers



Interpretations' Cont.

Interpretations' Cont.



national_tv_brand



For every 100\$ increase in the spending on marketing the tv brand, the average number of customers increases by 4 approx.



Outdoor



For every 100\$ increase in the spending of outdoor marketing, the average number of customers increases by 15 approx.



Radio



The spending on radio is not a significant factor in deciding the number of humana customers

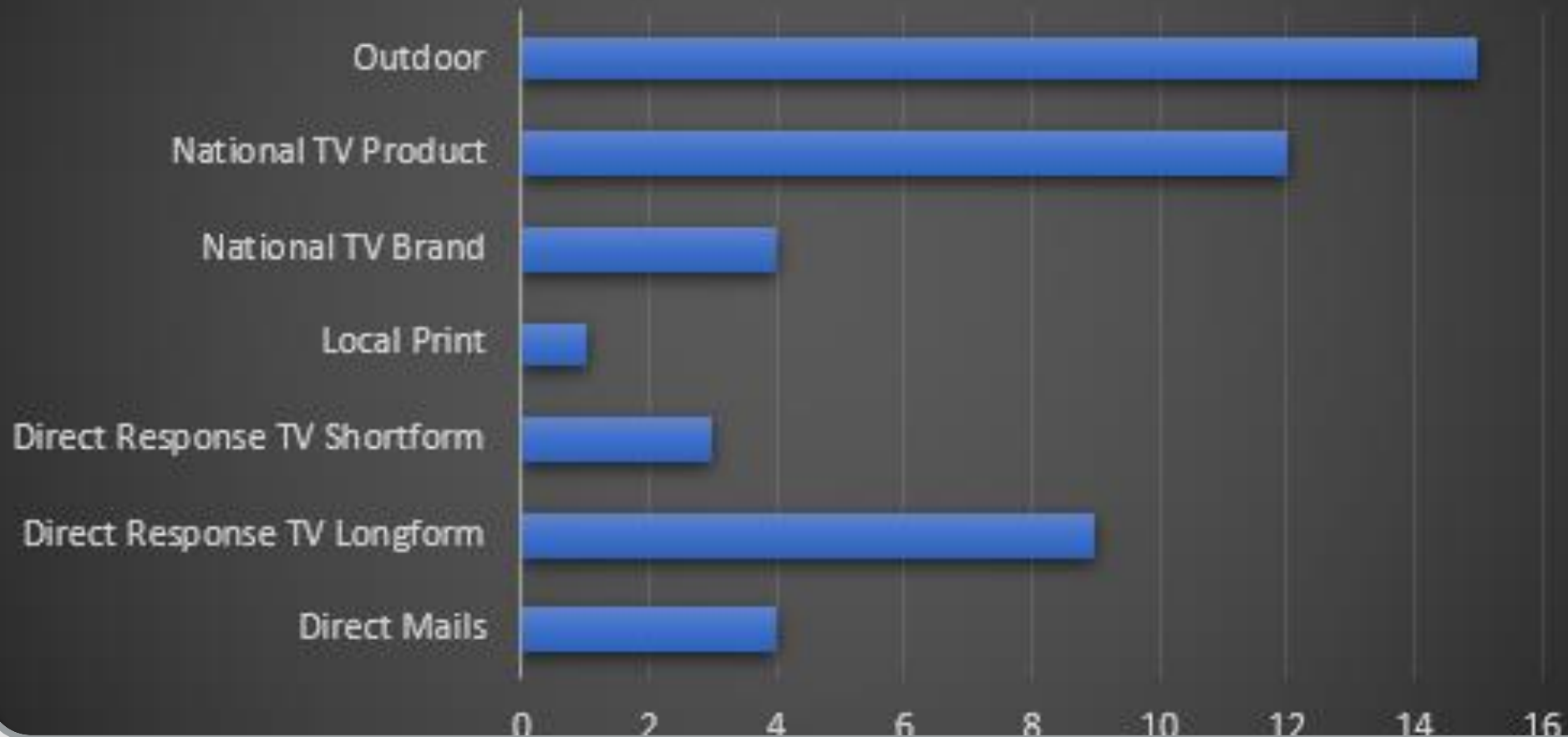


national_tv_product



For every 100\$ increase in the spending on marketing the tv product, the average number of customers increases by 12.

Marketing Vs Customer Increase for every 100\$ spent



Recommendations

- The impact caused by tv longform advertising is more than that of tv shortform advertising
- Spending on marketing campaigns should be more focused on Outdoor and National TV Product
- Digital Search Engine Marketing has a negative impact on the Humana customers.
- Local TV and Radio marketing have no significant impact on the Humana customers



Thank you