

Appendices

12.11-2020

1 Appendices

```
start <- as.Date("01/03/1990", format="%d/%m/%Y")
end <- as.Date("01/12/2015", format="%d/%m/%Y")

yivgdp <- read_csv("data/gdp_yiv.csv")
```

```
##
## -- Column specification -----
## cols(
##   Date = col_character(),
##   GDP = col_double(),
##   YIV = col_double()
## )
```

```
yivgdp$Date <- as.Date(yivgdp$Date, format="%d.%m.%Y")
yivgdp <- yivgdp %>%
  mutate(log_gdp=log(1+GDP/100)*100)

fred_quarterly <- fredqf(date_start=start,date_end=end)
fred_quarterly <- subset(fred_quarterly, select = -c(X91, X181, X183))

variable_names <- as.vector(colnames(fred_quarterly[, -1]))

varnames <- describe_qd(variable_names)
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## 244 Real Disposable Business Income, Billions of 2012 Dollars (Corporate cash flow wi
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## 121 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
## 122 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
## 123 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
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## 194 First difference of natural log:  $\ln(x)-\ln(x-1)$ 
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## 196 First difference of natural log:  $\ln(x)-\ln(x-1)$ 
## 197 First difference:  $x(t)-x(t-1)$ 
## 198 First difference:  $x(t)-x(t-1)$ 
## 199 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
## 200 First difference of percent change:  $(x(t)/x(t-1)-1)-(x(t-1)/x(t-2)-1)$ 
## 201 First difference:  $x(t)-x(t-1)$ 
## 202 Level (i.e. no transformation):  $x(t)$ 
## 203 Level (i.e. no transformation):  $x(t)$ 
## 204 Level (i.e. no transformation):  $x(t)$ 
## 205 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
## 206 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
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## 211 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 
## 212 Second difference of natural log:  $(\ln(x)-\ln(x-1))-(\ln(x-1)-\ln(x-2))$ 

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## 213 Second difference of natural log: (ln(x)-ln(x-1))-(ln(x-1)-ln(x-2))
## 214 Second difference of natural log: (ln(x)-ln(x-1))-(ln(x-1)-ln(x-2))
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## 233 Second difference of natural log: (ln(x)-ln(x-1))-(ln(x-1)-ln(x-2))
## 234 First difference of natural log: ln(x)-ln(x-1)
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## 246 First difference of natural log: ln(x)-ln(x-1)
## 247 First difference: x(t)-x(t-1)
## 248 First difference of natural log: ln(x)-ln(x-1)

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1.1 Appendix A

Notes: This table includes summary statistics for main variables used in our research. Statistics include mean, standard deviation,, min, 1st quartile, median, 3rd quartile, max & number of valid data points. In Panel A, different YIV data is summarized. In Panel B, we have listed the main dependent variables which are used for predictions. GDP denotes the year-on-year growth rate(quarterly data), CON denotes YOY consumption growth(monthly data), EMP describes YOY growth rate for non-farm payroll and lastly IND stands for

Industrial production YOY growth (monthly data). In Panel C, different control variables are listed: SVEN1F01 - 1 year treasury bond par yield.

Table 1.1: Summary Statistics

	Mean	Std.Dev	Min	Q1	Median	Q3	Max	N.Valid
Panel A: YIV								
YIV	3.34	1.31	1.39	2.60	3.00	3.62	9.21	103
Panel B: Dependent Variables								
GDP	2.50	1.78	-3.92	1.71	2.61	3.98	5.30	103
CON	4.88	1.95	-3.03	3.92	5.11	6.22	9.02	312
EMP	1.07	1.67	-5.00	0.20	1.60	2.20	3.50	312
IND	2.00	4.05	-15.33	1.19	2.74	4.16	8.54	312
Panel C: Control Variables								
SVEN1F01	3.89	2.40	0.21	1.38	4.35	5.88	9.29	6486
VIX	19.83	7.64	10.82	14.20	17.76	23.54	62.64	312
HOUSNG	1.01	18.36	-54.80	-7.25	2.80	12.70	50.00	312

Note:

Additional control variables will be added upon construction. Furthermore, currently the frequency of the datasets differs for different variables but this will be addressed in the research process.

1.2 Appendix B.

Notes: This table includes regression using GDP & YIV. Controls will be added during research process. The equation for the regression is the following:

$$\sum_{j=1}^{j=H} \log(1 + GDP_{i,t+j})/H = \alpha_H + \beta_H \sigma_{IV,t}^{INT} + Controls + \varepsilon_{t+H} \quad (1)$$

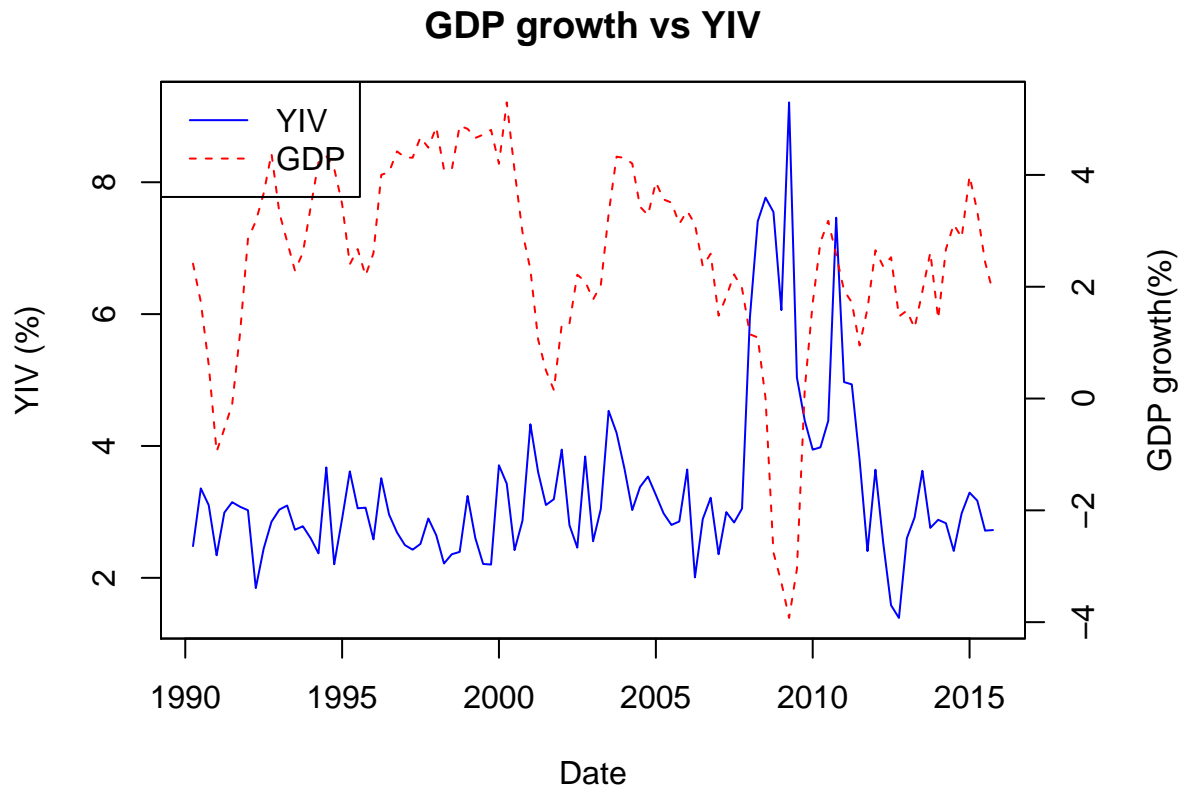
Table 1.2: Regression output

	H12	H18	H24	H30	H36
Panel A: YIV					
R-Squared	39.18	34.97	27.53	23.09	20.26
Adj. R2	38.55	34.29	26.75	22.24	19.37
Intercept	5.02	4.71	4.33	4.08	3.92
Beta	-0.76	-0.66	-0.54	-0.47	-0.41
t-stat	-7.90	-7.15	-5.94	-5.23	-4.76
p-value	0	0	0	0	0
RMSE	1.27	1.22	1.20	1.16	1.13
Newey	-0.15	-0.13	-0.10	-0.10	-0.20
Significance	***	***	***	***	***

Note:

*** - $p < 0.01$, ** - $p < 0.05$, * - $p < 0.1$

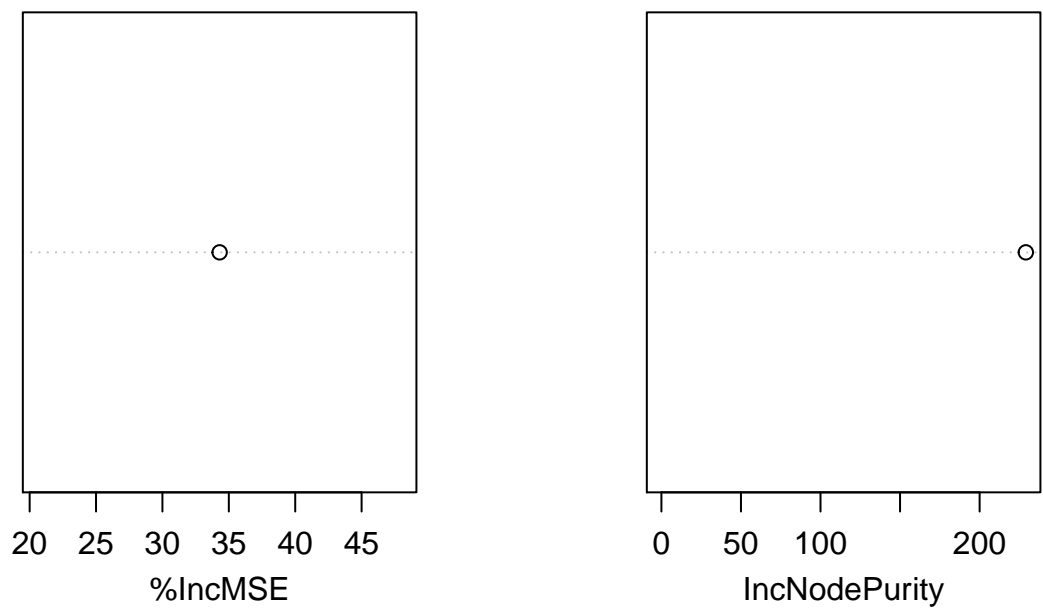
1.3 Appendix C



1.4 Appendix D

```
##
## Call:
## randomForest(formula = H12 ~ . - log_gdp - GDP, data = train, importance = TRUE)
##           Type of random forest: regression
##           Number of trees: 500
## No. of variables tried at each split: 1
##
##           Mean of squared residuals: 1.827493
##           % Var explained: 29.91
##
##           %IncMSE
## YIV 34.307
```

gdp.rf



```
##           1           2           3           4           5           6           7           8
## 2.3015413 1.7349930 0.8890817 1.4208569 1.8502451 1.3337087 2.6458063 3.2613418
##           9          10          11          12          13          14          15
## 2.9481313 3.3978196 2.7196849 2.9992115 1.9923596 3.0979888 3.0329875
## [1] 0.841158
```


1.5 Appendix E

```
## Warning: Use of 'df_results$"R-Squared"' is discouraged. Use 'R-Squared'  
## instead.
```

