



Unemployment
Trends

Group 4

Outline

Description of
data

Models
Considered

Forecast
comparisons

Final model
decision,
forecast
analysis

US Unemployment Trends

Initial Model Selection

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STAT 626: Time Series Analysis



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Timplot of National Unemployment

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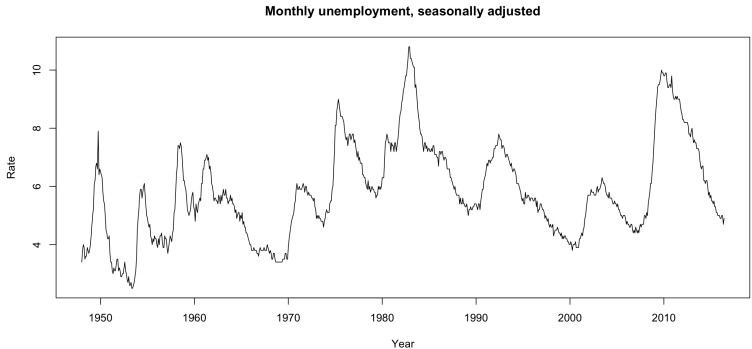
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Smoothed unemployment for the study time period

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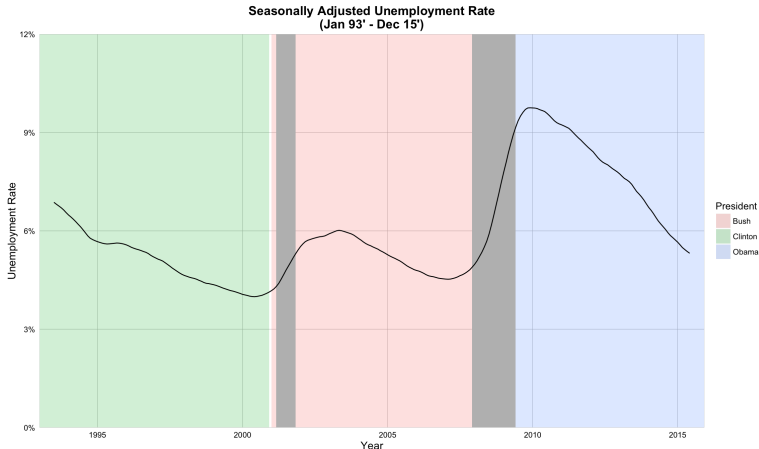
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Scatterplot matrix of unemployment and potential predictors

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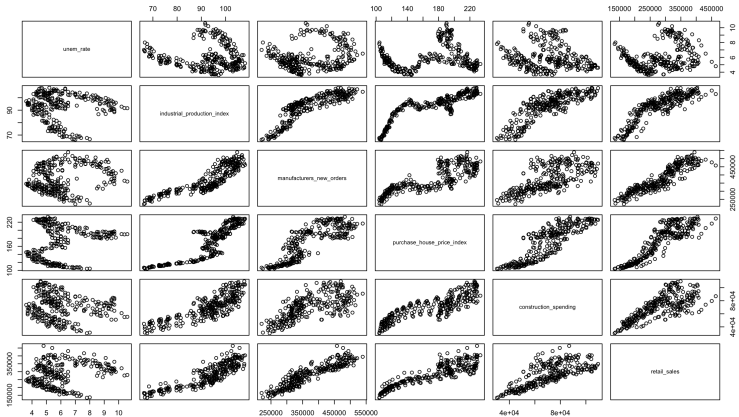
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Decomposition of Data

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```
-----  
decom.unem = decompose(ts(data = econ$unem_rate,  
                           start = c(1993,1), frequency = 12), type = "additive")  
decom.ind = decompose(ts(data = econ$industrial_production_index,  
                           start = c(1993,1), frequency = 12), type = "additive")  
decom.mno = decompose(ts(data = econ$manufacturers_new_orders,  
                           start = c(1993,1), frequency = 12), type = "additive")  
decom.hpi = decompose(ts(data = econ$purchase_house_price_index,  
                           start = c(1993,1), frequency = 12), type = "additive")  
decom.con = decompose(ts(data = econ$construction_spending,  
                           start = c(1993,1), frequency = 12), type = "additive")  
decom.rts = decompose(ts(data = econ$retail_sales,  
                           start = c(1993,1), frequency = 12), type = "additive")  
-----  
## Seasonally Adjust 2016 unemployment  
unem.16 = unem.16 - decom.unem$seasonal[1:5]  
-----  
## Add seasonally adjusted rate  
econ.sa = data.frame(  
  row.names = row.names(econ),  
  unem_rate_sa = econ$unem_rate - decom.unem$sea,  
  industrial_production_sa = econ$industrial_production_index - decom.ind$sea,  
  manufacturers_new_orders_sa = econ$manufacturers_new_orders - decom.mno$sea,  
  house_price_sa = econ$purchase_house_price_index - decom.hpi$sea,  
  construction_spending_sa = econ$construction_spending - decom.con$sea,  
  retail_sales_sa = econ$retail_sales - decom.rts$sea,  
  recession_ind = econ$recession_ind  
)  
-----
```



Autocorrelation of unemployment data

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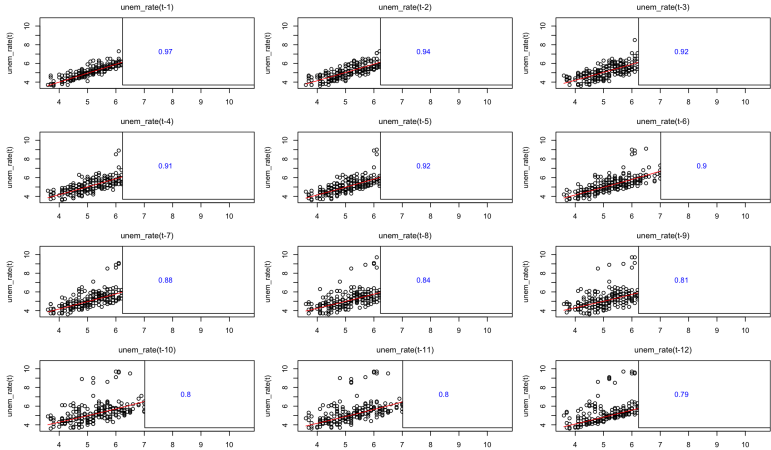
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Timeplots with and without differencing

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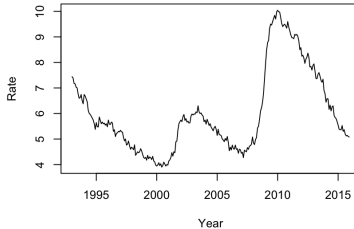
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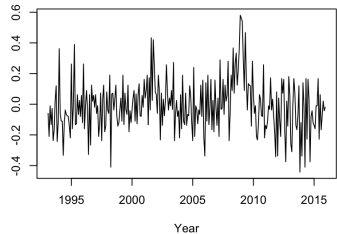
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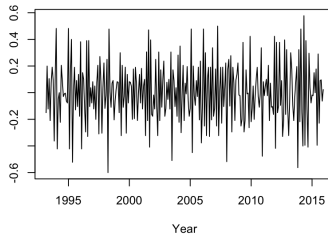
Monthly Unemployment



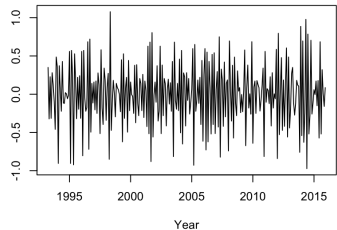
First differences



Second differences



Third differences





ADF Test Results for unemployment

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Model	Statistic	Lag order	p-value
1 st difference	-9.3595	6	< 0.01
2 nd difference	-9.3595	6	< 0.01
3 rd difference	-13.02	6	< 0.01



Timeplots of differenced predictors

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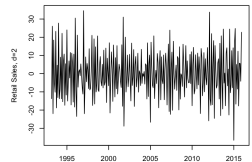
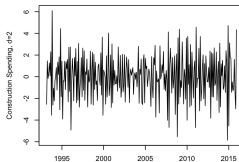
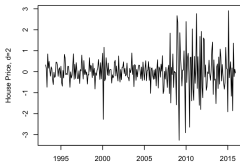
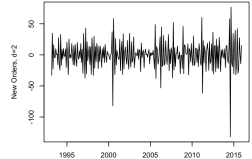
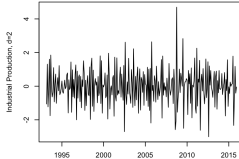
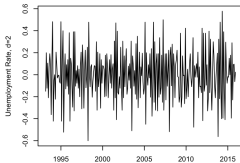
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ADF Test Results for Predictors, $d = 2$

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Variable	Statistic	p-value
Industrial Production	-9.2333	< 0.01
New Orders	-8.391	< 0.01
House Prices	-9.104	< 0.01
Construction Spending	-10.447	< 0.01
Retail Sales	-10.72	< 0.01



ACF & PACF Plots

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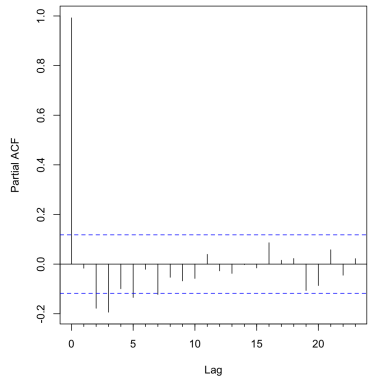
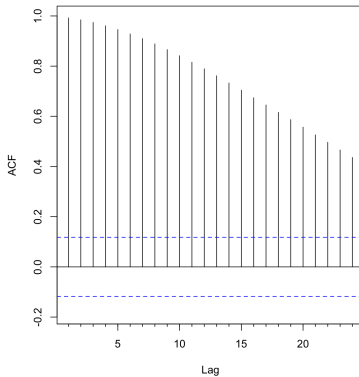
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ACF & PACF Plots of Second Differences

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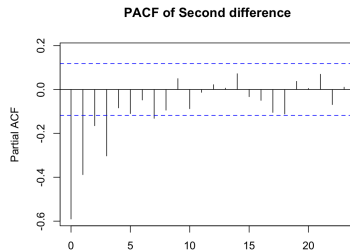
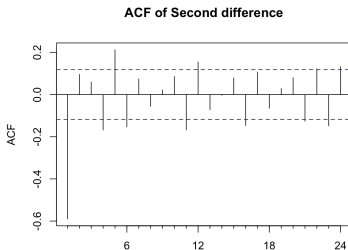
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ARIMA Models Considered

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Model	Order	Reg	AIC	BIC	Best
1	1,2,1	NA	-212.30	-201.46	BIC
2	2,2,2	NA	-211.81	-193.74	
3	3,2,3	NA	-215.48	-190.19	
4	1,2,1	X	-211.56	-182.65	AIC
5	2,2,2	X	-209.83	-177.32	
6	3,2,3	X	-215.10	-171.74	
7	1,2,1	LagX	-222.45	-193.69	
8	2,2,2	LagX	-220.70	-188.35	
9	3,2,3	LagX	-217.89	-174.76	



VAR Models Considered

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Model	P	Type	AIC	BIC	Best
1	1	NA	-223.67	-201.97	BIC/AIC
2	2	NA	-217.83	-185.31	
3	1	Ind	-256.77	-231.45	
4	1	LagX	-216.65	-195.06	
5	2	LagX	-212.53	-180.17	
6	1	Both	-245.72	-220.53	



Comparison of best ARIMA and VAR models

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Model	Type	AIC	BIC
ARIMA #1	Univariate ARIMA(1,2,1)	-212.29	-201.45
ARIMA #7	Multivariate ARIMA(1,2,1)	-222.45	-193.69
VAR #3	VAR(1)	-256.76	-231.45



Multivariate ARIMA(1,2,1)

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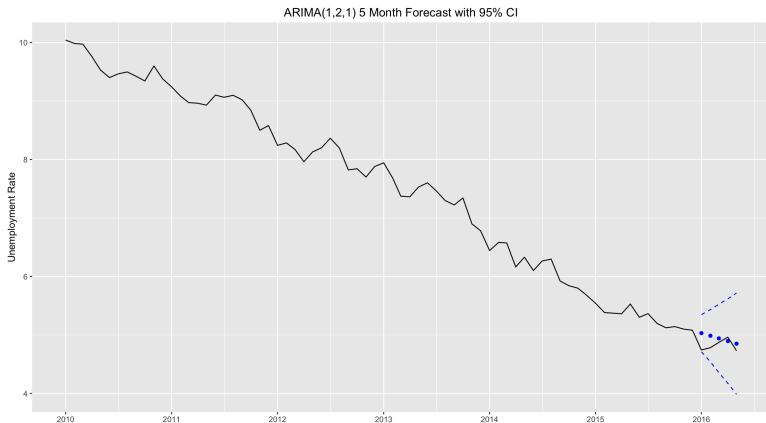
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VAR(1)

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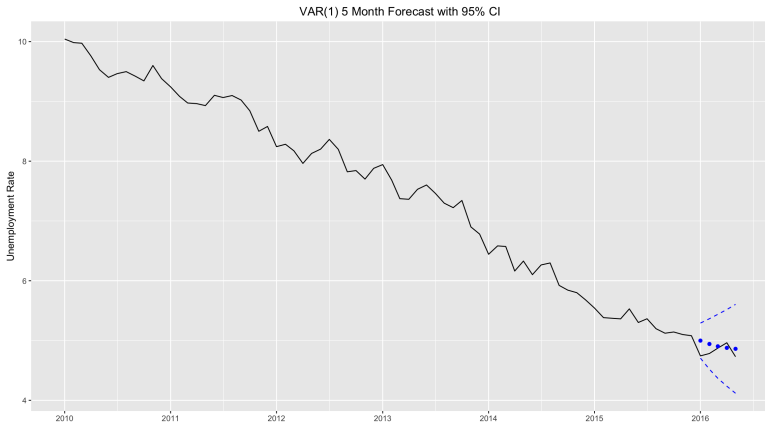
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Comparison of ARIMA(1,2,1) and VAR(1)

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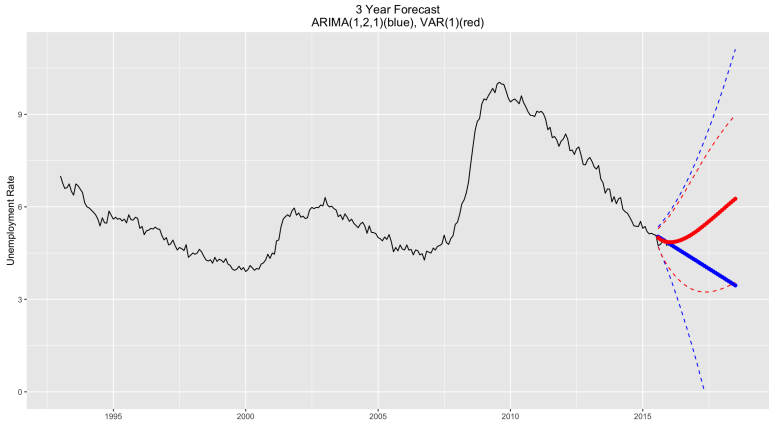
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Final Model: VAR(1)

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The final model chose was the VAR(1) with construction spending, retail sales, and the recession indicator as predictors:

$$\begin{aligned} \text{Unemployment} = & .935 + .0041(t) + .975\text{Unemployment}_{t-1} \\ & + .004\text{ConstructionSpend}_{t-1} - .005\text{RetailSales}_{t-1} \\ & + .19\text{RecessionIndicator}_{t-1} + w_t \end{aligned}$$



Final Model: VAR(1): Predictions

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