## HAWKWATCHERS

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#### **GOALS**

#### FEDERAL RESERVE press release



For release at 2 p.m. EST

January 31, 2018

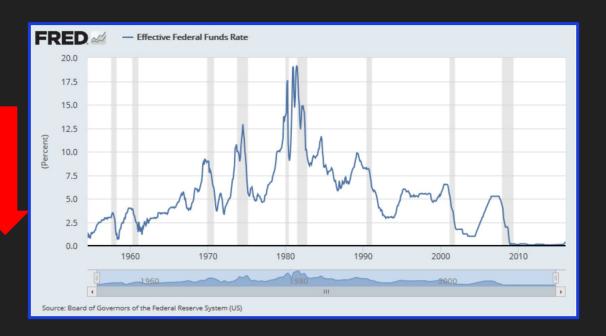
Information received since the Federal Open Market Committee met in December indicates that the labor market has continued to strengthen and that economic activity has been rising at a solid rate. Gains in employment, household spending, and business fixed investment have been solid, and the unemployment rate has stayed low. On a 12-month basis, both overall inflation and inflation for items other than food and energy have continued to run below 2 percent. Market-based measures of inflation compensation have increased in recent months but remain low; survey-based measures of longer-term inflation exceedings are little channels on balance.

Consistent with its statutory mandate, the Committee seeks to foster maximum employment and price stability. The Committee expects that, with further gradual adjustments in the stance of monetary policy, economic activity will expand at a moderate pace and labor market conditions will remain strong. Inflation on a 12-month basis is expected to move up this year and to stabilize around the Committee's 2 percent objective over the medium rem. Near-term risks to the economic outlook appear roughly balanced, but the Committee is monitoring inflation developments closely.

In view of realized and expected labor market conditions and inflation, the Committee decided to maintain the target range for the federal funds rate at 1-1/4 to 1-1/2 percent. The stance of monetary policy remains accommodative, thereby supporting strong labor market conditions and a sustained return to 2 percent inflation.

In determining the timing and size of finiture adjustments to the target range for the federal funds not, the Committee will assess realized and expected economic conditions relative to its objectives of maximum employment and 2 percent inflation. This assessment will take into account a wide range of information, including measures of the property of the control of the property of the control of the control

(more)



### WHY?







#### WHY?

#### A Model for the Federal Funds Rate Target\*

#### Table 3

List of candidate explanatory variables in the specification of the ACH model

#### Inflation Measures:

- $\bullet~$  GDP~Deflator (yearly average of the annualized log-change, in percent)
- CPI Index, less food and energy (yearly average of the annualized log-change, in percent)
- Personal Consumption Expenditures Deflator (yearly average of the annualized logchange, in percent)
- · Employment Cost Index (annualized, quarterly log-change, in percent)
- 12-month ahead inflation forecasts (Consumer Survey, University of Michigan)

#### Output Measures:

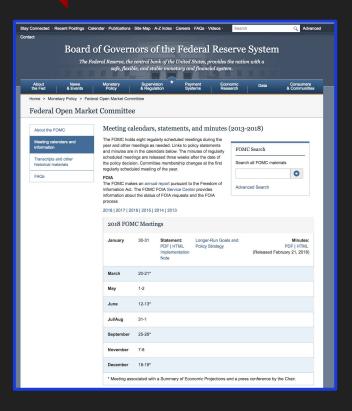
- Output Gap (log difference between actual and potential GDP, Congressional Budget
   Office estimates, in percent)
- GDP growth (annualized quarterly growth rate, in percent)
- • Total Capacity Utilization (in deviations from an 80% norm)
- 12-month ahead consumer expectations on business conditions (Consumer Survey, University of Michigan)

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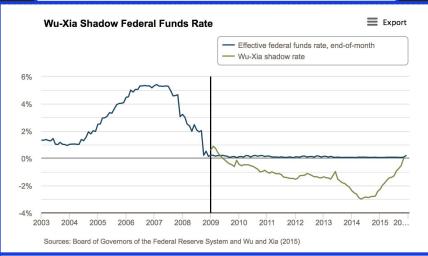
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#### Data







#### Wu-Xia Shadow Federal Funds Rate

Note: When the shadow fed funds rate is at least 25 basis points, this model's short-term interest rate is identical to the shadow fed funds rate and has been highly correlated with other short-term market interest rates such as the effective federal funds rate. Consequently, we will not provide regular updates of the shadow federal funds rate as long as the target range for the federal funds rate is at or above 25 to 50 basis points.

### Pipeline

January 31, 2018

#### Federal Reserve issues FOMC statement

For release at 2:00 p.m. EST

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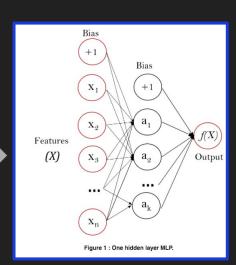
In determining the timing and size of future adjustments to the target range for the federal funds rate, the Committee will assess realized and expected connonic conditions relative to its objectives of maximum employment and 2 percent inflation. This assessment will take into account a wide range of information, including measures of labor market confidence, includator of inflation pressures and inflation expectations, and readings on financial and international development pressures and inflation expectations, and readings on financial and international development with a second confidence of the confidence of inflation and the confidence of inflation switched the confidence of the confidence of inflation and the confidence of inflation switched the confidence of inflations of inflations and inflations are confidence or inflations and inflations with the confidence of th

	month	year	Change	increase
0	February	1994	0.07	True
1	March	1994	0.03	True
2	April	1994	0.07	True
3	May	1994	0.13	True
4	June	1994	0.06	True

```
TFVects

<293x961 sparse matrix of type '<class 'numpy.float64'>'
    with 4111 stored elements in Compressed Sparse Row format>

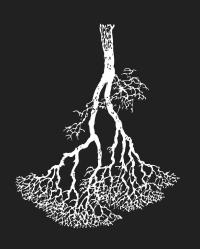
matrix([[0., 0., 0., ..., 0., 0., 0.],
        [0., 0., 0., ..., 0., 0., 0.],
        [0., 0., 0., ..., 0., 0., 0.],
        [0., 0., 0., ..., 0., 0., 0.],
        [0., 0., 0., ..., 0., 0., 0.],
        [0., 0., 0., ..., 0., 0., 0.]])
```

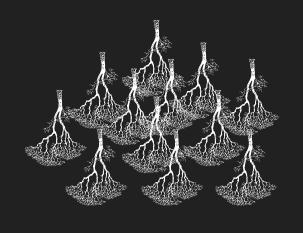


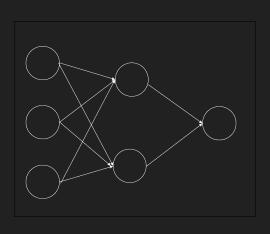
nltk

scikit-learn

#### Models







Decision Tree

Bagging

Neural Net

### Testing / Results

**Training: Feb. 1994 – Dec. 2015** 

0.87

False True

avg / total

precision	recall	fl-score	support
0.89	0.85	0.87	137
0.85	0.89	0.87	132

0.87

269

0.87

**Testing: Jan. 2016 – Jan. 2018** 

	precision	recall	f1-score	support
False	1.00	0.33	0.50	6
True	0.83	1.00	0.90	19
avg / total	0.87	0.84	0.81	25

#### Bootstrap Estimate

Randomly split dataset into train/test sets (70/30), train and test model, determine performance (using MSE), rinse and repeat to get robust performance estimate

	precision	recall	fl-score	support
0	0.66	0.70	0.68	429
1	0.70	0.67	0.68	461
avg / total	0.68	0.68	0.68	890

test estimate MSE bootstrap= 0.31910112359550563 test estimate MSE standard err= 0.02420298789723373

**Test estimate MSE Bootstrap = 0.32** 

**Test estimate MSE SE = 0.02** 

#### Labor Market Conditions Indicator

Labor Market Variables			
Unemployment rate (U3)	w <b>(</b> )	Hires rate	
Broad unemployment rate (U6)	W	Percent of firms planning to increase employment (NFIB)	
Unemployment forecast (Blue Chip)		Average hourly earnings	
Job flows from U to E	<u>~</u>	Initial claims	W (
Quits rate		Private nonfarm payroll employment	
Employment-population ratio	<u>₩</u>	Aggregate weekly hours	W
Working part time for economic reasons	<u>~</u>	Temporary help employment	<u>~</u>
Job leavers	<u>₩</u>	Expected job availability (U of Michigan)	
Job availability index (Conference Board)		Labor force participation rate	<u>~</u>
Unemployed 27 or more weeks	<u>₩</u>	Manufacturing employment index (ISM)	
Percent of firms with positions not able to fill right now		Announced job cuts (Challenger-Gray-Christmas)	
(NFIB)		Expected job availability (Conference Board)	
Job losers	W ( )		

Source: Federal Reserve Bank of Kansas City

"The LMCI tracks changes in the labor market by finding variations from multiple labor indicators. Indicators range from unemployment rates to wages to layoffs to business surveys. The LMCI plays a critical role in helping the Fed with one of its two mandates: ensuring maximum employment. It's one of the factors that the agency will take into account when it considers raising interest rates later this year. "

- Investopedia, November 30, 2015

### Testing / Results - LMCI

**Training: Sept. 1994 – Dec. 2015** 

Testing: J	lan. 2016 – J	Jan. 2018
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	precision	recall	f1-score	support
0	0.78	0.05	0.10	131
1	0.50	0.98	0.66	125
avg / total	0.64	0.51	0.37	256

	precision	recall	fl-score	support
0	0.00	0.00	0.00	6
1	0.76	1.00	0.86	19
avg / total	0.58	0.76	0.66	25

### Bootstrap Estimate - LMCI

	precision	recall	fl-score	support
0	0.47	0.25	0.32	424
1	0.49	0.72	0.58	426
avg / total	0.48	0.48	0.45	850

test estimate MSE bootstrap= 0.5152941176470588 test estimate MSE standard err= 0.046108042217095115

**Test estimate MSE Bootstrap = 0.52** 

**Test estimate MSE SE = 0.046** 

### Challenges

Noise when comparing words to numbers

Keeping track of temporary functions used

- We had access to plenty of data what is important?
  - How much does language change? How many years back is beneficial? Do we prioritize models that can predict any year accurately or ones that predict the future?

#### Future Work

• Binary classification is limited - could try to predict numerical change

- Repeat the process with other countries banks
  - O Difference in language used even though all are in English
  - Web scrapers need to be customized for each bank and each time period

# DEMO

- Latest Release:
- https://www.federalreserve.gov/newsevents/pressreleases/monetary2018013
   1a.htm
- Release from January 2009 (during the financial crisis)
- https://www.federalreserve.gov/newsevents/pressreleases/monetary2009012
   8a.htm

# **APPENDIX**

#### REFERENCES

- A Model for the Federal Funds Interest Rate
  - http://econweb.ucsd.edu/~jhamilto/jordec01.pdf
- Measuring the Macroeconomic Impact of Monetary Policy at the Zero Lower Bound
  - https://www.imf.org/external/np/res/seminars/2015/arc/pdf/Xia.pdf
- Document Classification by Inversion of Distributed Language Representations
  - http://www.aclweb.org/anthology/P15-2008

### tf-idf Computation

$$tf(t,d) = \frac{f_{t,d}}{\sum_{f' \in d} f'_{t',d}}$$
$$idf(t,D) = \log \frac{N}{|\{d \in D : t \in d\}|}$$