

# Outline

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- 5. Performance
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  - b) Identification by timing
  - c) Incorporating complex/ephemeral data



# Data series

#### Criteria

- Real activity measure, weekly or daily
- Timely availability
- Long enough time series to be confident of correlations

- Stable definition and survey instrument
- Provides signal value
- These criteria eliminate very many interesting series!

	Time available EST (days									
	Series	Native Units	from reference week)	Notes						
Cons.	Redbook Research: Same Store,	NSA, Y/Y % Chg.	1 <sup>st</sup> Tuesday, 9:00am (3 days)	Sales-weighted, year-over-year same-store sales growth,						
	Retail Sales			9,000 stores (80% of the retail sales) (Redbook Research)						
	Rasmussen Consumer Index	Index, 3-day MA	Friday of reference week,	Daily survey of 1500 American adults Sun-Thurs.						
			6:00pm (0 days)	(Rasmussen)						
Labor	Unemployment Insurance:	NSA, Thous.	1 <sup>st</sup> Thursday, 8:30am (5 days)	US DOL						
mkts	Initial Claims									
	Unemployment Insurance:	NSA, Thous.	2 <sup>nd</sup> Thursday, 8:30am (12	US DOL						
	Continued Claims		days)							
	American Staffing Association	NSA, Jun-12-06=100	2 <sup>nd</sup> Tuesday, 8:30am (10 days)	Stratified panel of small, medium, and large staffing						
	Staffing Index			companies (American Staffing Association)						
	Federal Withholding Tax	Y/Y % Chg.	1 <sup>st</sup> Tuesday, 4:00pm (5 days)	Treasury receipts of income and payroll taxes withheld						
	Collections			from paychecks, adjusted (Taxtracking.com)						
Ind.	Raw Steel Production	NSA, Thous. Net Tons	1 <sup>st</sup> Monday, 4:00pm (2 days)	50% weekly production provided, 50% monthly production						
Prodn.				(American Iron & Steel Institute)						
	U.S Railroad Traffic	NSA, car-loads	1 <sup>st</sup> Wednesday, 9:00am (4	Total carloads and intermodal units (Association of						
			days)	American Railroads)						
Energy	US Fuel Sales to End Users	NSA, EOP, Thous.	1 <sup>st</sup> Wednesday 10:30am (4	Weekly product supplied of finished gasoline and distillate						
		barrels/ day	days)	fuels (US EIA)						
	Electric Utility Output	NSA, Gigawatt Hours	1 <sup>st</sup> Wednesday, 1:00pm (4	U.S. (ex Alaska and Hawaii) investor-owned electric						
			days)	companies (Edison Electric Institute)						

### Weekly seasonal adjustment

#### **Options are limited**

- Hard problem (floating holidays, 4 weeks  $\neq$  1 month, 52 weeks  $\neq$  1 year)
- Standard methods using multiplicative factors but that approach might not make sense in the pandemic (x% of the decline in March is seasonal?)
  - In September 2020, US DOL switched from multiplicative seasonal adjustment to additive
- What we do:
  - 1. Transform series to logs, or not
  - 2. 52 week difference
  - 3. Manual adjustment for problem weeks
  - New years (t) new years (t-1) = 53 weeks







(c) Redbook Research: Same Store, Retail Sales Average

# Data: untransformed (left) and transformed with WEI (right)





## Data: untransformed (left) and transformed with WEI (right)





(a) Negative Unemployment Insurance: Initial Claims, NSA (YoY % Change)



(a) Negative Unemployment Insurance: Initial Claims, NSA (YoY % Change)





(j) Negative Unemployment Insurance: Continued Claims, NSA (YoY % Change)



(j) Unemployment Insurance: Continued Claims, NSA (Negative YoY % Change)

# Data: untransformed (left) and transformed with WEI (right)





(g) American Staffing Association Staffing Index, NSA (YoY % Change)



(g) American Staffing Association Staffing Index, NSA (YoY % Change)





(h) Adjusted Federal Collections of Taxes Withheld From Paychecks (YoY % Change)



(h) Adjusted Federal Collections of Taxes Withheld From Paychecks (YoY % Change)





(e) Raw Steel Production, NSA (YoY % Change)





(i) US Railroad Traffic Originated: Intermodal + Carloads, NSA (YoY % Change)



(i) US Railroad Traffic Originated: Intermodal + Carloads, NSA (YoY % Change)





(b) US Motor Gasoline, Diesel, and Jet Fuel End Sales, NSA (YoY % Change)



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(d) Electric Utility Output: U.S. ex Hawaii and Alaska, NSA (YoY % Change)



(d) Electric Utility Output: U.S. ex Hawaii and Alaska NSA (YoY % Change)

# Methods

#### Factor, extracted as first principal component

Table 2: PCA Results								
	Weights	Weights						
Series	Baseline	Trimmed (ALS)						
Same-Store Retail Sales	0.28	0.27						
Consumer Confidence	0.23	0.20						
Initial Claims	-0.37	-0.38						
Continued Claims	-0.41	-0.41						
Staffing Index	0.40	0.39						
Tax Withholding	0.30	0.32						
Steel Production	0.36	0.36						
Fuel Sales	0.22	0.22						
Railroad Traffic	0.34	0.36						
Electricity Output	0.12	0.12						
Total variance explained	55.4	56.6						

*Notes:* Estimation sample is first week of 2008 through last week of February 2020. The first column uses all observations. The second column is based on a trimmed sample in which outliers were removed so those observations were treated as missing. In this case, the weights are estimated using alternating least squares, see for instance Stock and Watson (2002b).

#### Sensitivity: WEI and alternatives



*Notes:* Brown = WEI, blue is alternative



$$WEI_{t} = \mu^{d} + \theta_{1}^{d} WEI_{t-1}^{d} + \theta_{2}^{d} WEI_{t-2} + \sum_{j \in J^{d}} \delta_{j}^{d} X_{jt} + v_{t}^{d},$$

#### Table 3: Relationship between WEI updates

	Panel a.: 1/5/2008 to 2/29/2020						Panel b.: 3/28/2020 to 8/8/2020					
	RMSE			Correlation		RMSE			Correlation			
	First revision	Second revision	Final	First revision	Second revision	Final	First revision	Second revision	Final	First revision	Second revision	Final
Initial estimate	0.23	0.25	0.26	0.99	0.99	0.99	1.22	1.48	1.39	0.86	0.83	0.83
First revision	_	0.08	0.10	_	1.00	1.00	-	0.56	0.48	_	0.99	0.99
Second revision	-	-	0.06	-	-	1.00	-	-	0.72	-	-	0.99

Notes: For the estimate indicated in each row, the table reports the RMSE with respect to the subsequent estimate indicated in the columns and the pairwise correlations for each pair of estimates. Panel a. considers the pre-pandemic sample, 1/5/2008 to 2/29/2020, based on infeasible historical estimates computed using the baseline weights and update regression coefficients. Panel b. considers the pandemic sample, 3/28/2020 to 8/8/2020, using the published values for each WEI update.

#### Table 4: GDP regression results

Regressors	(I)	(II)	(111)	(IV)
$WEI_{a}^{quarterly}$	0.57***			
Ŷ	(0.13)			
WEI month 3				-0.14
				(0.36)
WEI month 2			1.07***	1.24**
			(0.32)	(0.51)
WEI month 1		0.51***	-0.55*	-0.59*
		(0.13)	(0.32)	(0.33)
F-test: weekly		15.01	15.02	9.94
coefficients = 0		(0.00)	(0.00)	(0.00)
F-test: weekly			3.25	1.94
coefficients equal			(0.05)	(0.14)
SER	0.51	0.54	0.48	0.48
Adjusted R <sup>2</sup>	0.89	0.88	0.90	0.90

Notes: All regressions include 2 lags of four-quarter GDP growth as in (5) (column (1)) and (6) (remaining columns). Results starred at the 1%, 5%, and 10% levels, \*\*\*, \*\*, \*. Estimation sample is 2008:Q1-2019:Q4 using the latest vintage of WEI and GDP data. Standard errors are given in parentheses for coefficients and p-values are given in parentheses for F-statistics. Real-time nowcasting of 2020 Q2 growth (saar)

WEI : -32.7% Advance GDP: -33.1% Latest GDP: -31.4%



- 1. Weekly seasonal adjustment
- 2. Integrate nonstandard series which are frequently:
  - Short
  - Nonstationary coverage or definitions
  - Potentially highly informative at very short horizons (days/weeks)
- 3. Exploit high frequency for causal analysis
  - This is standard in the monetary shock literature (announcement days – e.g. Kuttner (2000))
  - Being done in COVID/NPI literature, e.g. Arnon et al (2020), Chetty et al (2020)
  - Carry over into SVAR/SVAR-IV/LP/LP-IV analysis?



#### **Google mobility indexes**

