

# Can GDP measurement be further improved?

## Data revision and reconciliation

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Simon van Norden

Joint Montreal Macro BrownBag  
CIRANO, November 2019  
(paper @ [www.svannorden.org](http://www.svannorden.org))

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Data revision  
and  
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Motivation

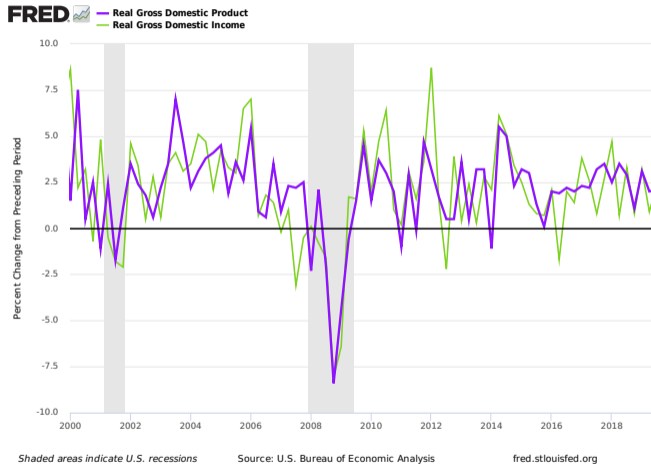
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# Motivation I



U.S. Real GDP growth: Expenditure vs Income measures (Nov. 27, 2019)

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## Motivation II

Which is the better measure of GDP?  
Expenditure (GDE) or Income (GDI)?

- ▶ Nalewaik (2012)
- ▶ Chang and Li (2015)

Reconciliation:

- ▶ Stone, Champnowne and Meade (1942)
- ▶ Weale (1992)
- ▶ Diebold (2010)
- ▶ ADNSS (2013) & (2016)
  - ▶ FRB Philadelphia publishes GDP<sup>+</sup>
- ▶ Anesti et al. (2018) (UK: **U**ncertain **K**ingdom)

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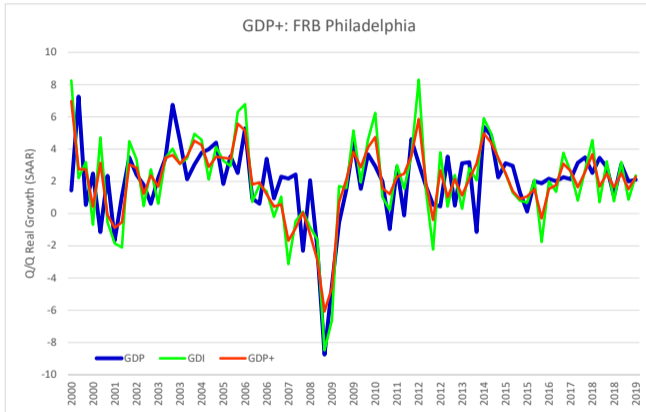
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# Motivation III



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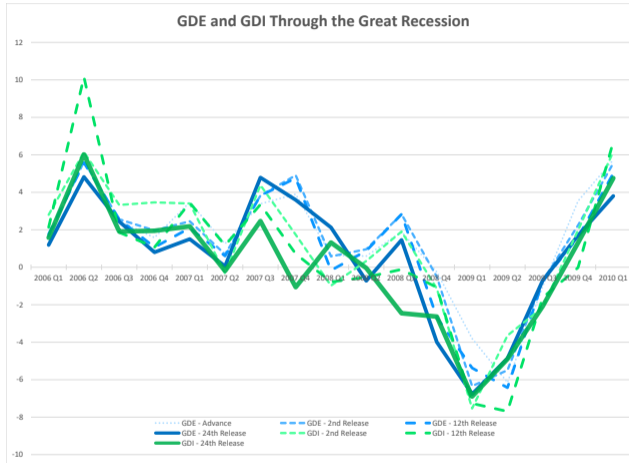
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# Motivation IV



Both series have important revisions

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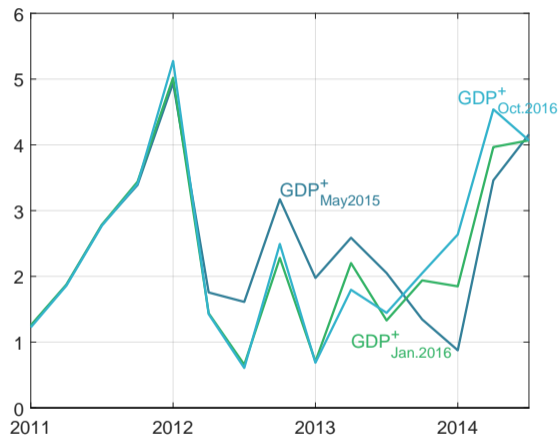
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# Motivation V



...and so does  $GDP^+$ !

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# Our Contribution

1. We model the reconciliation problem in a standard state-space framework.
2. We show how to allow for
  - ▶ multiple data releases (cf Jacobs and van Norden JoE 2011)
  - ▶ varying precision
  - ▶ series dynamics
  - ▶ news and noise errors, possibly correlated across the two series
3. We show it solves ADNSS (2013) identification problem
4. Compare our new measure ( $GDP^{++}$ ) to real  $GDE$  and  $GDI$  growth and provide confidence intervals for the new estimates.
5. Decompose initial estimates of  $GDE$  and  $GDI$  growth into news and noise shocks

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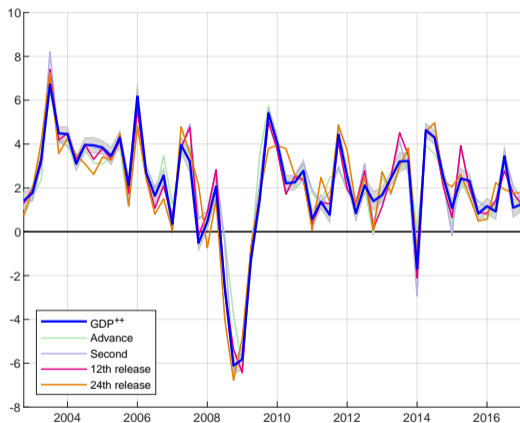
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# $GDP^{++}$ I



$GDP^{++}$  vs  $GDE$

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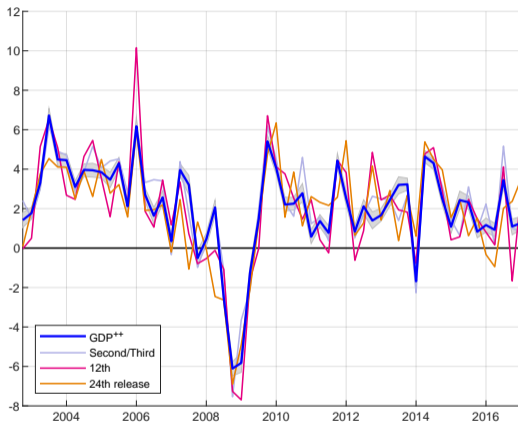
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# $GDP^{++}$ II



$GDP^{++}$  vs  $GDI$

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# Problem

Reconciliation relies on assumptions about the errors in the series being reconciled.

- ▶ which is more precise?
- ▶ lead/lag relationships?
- ▶ News or Noise?

These relationships vary depending on which release(s) we consider.

- ▶ Important for producing efficient estimates.
- ▶ Important for understanding reliability of estimates.

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# Revision properties

## News and Noise

Let  $y_t^i$  be the  $i$ -th release of  $y$  in period  $t$  and  $\tilde{y}_t \equiv$  'true' value of  $y_t$

### 1. Noise:

$$y_t^i = \tilde{y}_t + \zeta_t^i, \quad \text{cov}(\tilde{y}_t, \zeta_t^i) = 0 \quad \forall i$$

⇒ revisions (partly) forecastable

⇒ vintages **more** volatile than 'true' values

### 2. News:

$$\tilde{y}_t = y_t^i + \nu_t^i, \quad \text{cov}(y_t^i, \nu_t^i) = 0 \quad \forall i$$

Linked to rational forecasts (De Jong 1987)

rational statistical agency (Sargent 1989)

⇒ revisions *cannot* be forecast

⇒ vintages **less** volatile than "true" values

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# Notation

## Data (vectors)

$GDE_t$  real GDP growth (Expenditure measure)  
 $GDI_t$  real GDP growth (Income measure)

## Some scalars

$GDE_t^i, GDI_t^i$  superscript  $i$  indicates release ( $1, \dots, L$ )  
 $GDP_t$  real GDP growth ("Truth" - unobserved)  
 $GDP_t^{50/50}$  BEA: Average of ( $GDE_t^i, GDI_t^i$ )  
 $GDP_t^+$  real GDP growth - FRB Philadelphia measure  
 $GDP_t^{++}$  our real GDP growth measure

## Errors (vectors)

$\nu_t$  News measurement error  
 $\zeta_t$  Noise measurement error

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# State-Space Model I

Measurement Equation:

$$\begin{bmatrix} GDE_t^L \\ GDI_t^L \end{bmatrix} = GDP_t + \begin{bmatrix} \nu_{Et}^L \\ \nu_{It}^L \end{bmatrix} + \begin{bmatrix} \zeta_{Et}^L \\ \zeta_{It}^L \end{bmatrix} \quad (1)$$

where

$$\begin{aligned} GDE_t^L &= [GDE_t^1, \dots, GDE_t^l]', & GDI_t^L &= [GDI_t^1, \dots, GDI_t^l]', \\ \nu_{Et}^L &= [\nu_{Et}^1, \dots, \nu_{Et}^l]', & \nu_{It}^L &= [\nu_{It}^1, \dots, \nu_{It}^l]', \\ \zeta_{Et}^L &= [\zeta_{Et}^1, \dots, \zeta_{Et}^l]', & \zeta_{It}^L &= [\zeta_{It}^1, \dots, \zeta_{It}^l]', \end{aligned}$$

**Noise:**  $E[\zeta_{Et}^L | GDP_t] = 0 = E[\zeta_{It}^L | GDP_t]$

**News:**  $E[\nu_{Et}^j | GDE_t^k] = 0 = E[\nu_{It}^j | GDI_t^k] \quad \forall j > k$

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## State-Space Model II

### Transition Equation:

Let  $\alpha_t = [GDP_t, \nu_{Et}^L, \nu_{It}^L, \zeta_{Et}^L, \zeta_{It}^L]'$

The transition equation may be compactly written as

$$\alpha_t = \begin{bmatrix} \rho & 0 \\ 0 & 0 \end{bmatrix} \alpha_{t-1} + \mathbf{R} \cdot \eta_t, \quad (2)$$

$$\mathbf{R} = \begin{bmatrix} \mathbf{R}_1 & \mathbf{R}_2 + \mathbf{R}_3 & 0 & 0 \\ -\mathbf{V}_l \cdot \text{diag}(\mathbf{R}_1) & -\mathbf{V}_l \cdot \text{diag}(\mathbf{R}_3) & 0 & 0 \\ 0 & -\mathbf{V}_l \cdot \text{diag}(\mathbf{R}_2) & 0 & 0 \\ 0 & 0 & \mathbf{R}_4 & \mathbf{R}_6 \\ 0 & 0 & 0 & \mathbf{R}_5 \end{bmatrix} \quad (3)$$

$\mathbf{V}_l$  is upper triangular matrix of ones,

$\mathbf{R}_1, \dots, \mathbf{R}_3$  are  $1 \times l$  vectors and  $\mathbf{R}_4, \dots, \mathbf{R}_6$  are  $l \times l$  diagonal matrices.

$$\eta_t = [\eta_{E\nu t}^i, \eta_{I\nu t}^i, \eta_{E\zeta t}^i, \eta_{I\zeta t}^i]' \sim N(0, \mathbf{I}_{4l})$$

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## Identification

How can we hope to distinguish News and Noise measurement errors?

(2) implies that all persistence comes through  $GDP_t$ .

- ▶ News shocks are part of  $GDP_t$ , and so have a persistent effect. Also, they do not decay over subsequent releases.
- ▶ Noise shocks have no persistence across time or releases.

2 series with  $l$  releases each give us  $2l \cdot (2l + 1)/2$  observable cross moments and  $2l$  first-order autocorrelations =  $l \cdot (2l + 3)$  moments to identify  $1 + 6l$  parameters.

- ▶  $\rho$  and  $\mathbf{R}_1, \dots, \mathbf{R}_6$  with  $l$  elements each.
- ▶ For  $l = 1$ , we have 5 moments for 7 unknown parameters.
- ▶ For  $l = 2$ , we have 14 moments for 13 unknown parameters.
- ▶ For  $l = 3$ , we have 27 moments for 19 unknown parameters.

We give a formal proof of identification based on Komunjer and Ng (2011).

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# Data and estimation

## Data

- ▶ Monthly vintages of quarterly series 2003Q1–2014Q3 from Bureau of Economic Analysis (BEA)
- ▶ For real *GDE* growth we use the advance, third, the 12th and the 24th releases
- ▶ For real *GDI* growth we use the second/third, the 12th and the 24th releases

## Estimation

- ▶ Gibbs Sampling with diffuse priors
- ▶ Estimate with errors correlated or uncorrelated across the two series.
- ▶ Compare results to AR(1) for GDE, GDI,  $GDP^{50/50}$  and  $GDP^+$

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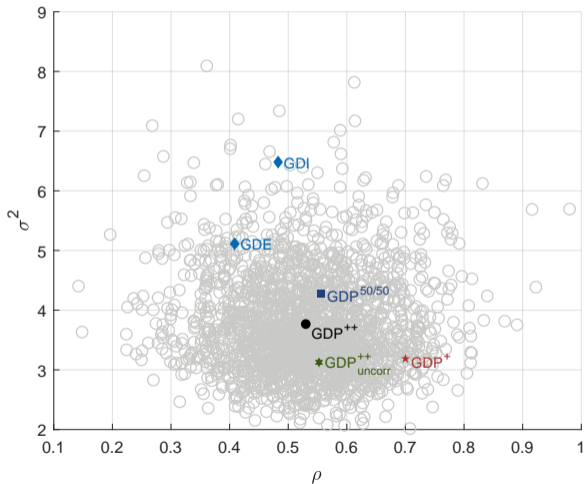
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# Real *GDP* growth dynamics I



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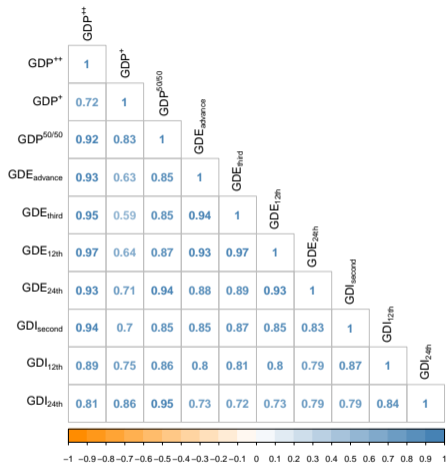
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# Real *GDP* growth dynamics II



Correlations

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# $GDP_t^{++}$ Loadings (Kalman Gains)

	Balanced Sample		Ragged-Edge Sample	
Weight on	<i>GDE</i>	<i>GDI</i>	<i>GDE</i>	<i>GDI</i>
<b>News and Noise</b>				
Advance	0.0272		0.2311	
Second/Third	-0.2103	0.3067	0.3363	0.4804
12th	0.7104	0.1081	0	0
24th Release	0.0479	0.0125	0	0
<b>Uncorrelated News and Noise</b>				
Advance	0.0380		0.1363	
Second/Third	0.1240	0.1672	0.4934	0.3768
12th	0.2318	0.0796	0	0
24th Release	0.2799	0.0826	0	0

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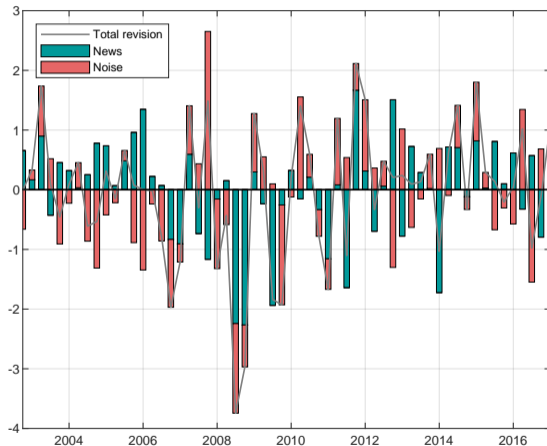
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# Historical decomposition of real $GDE$ growth



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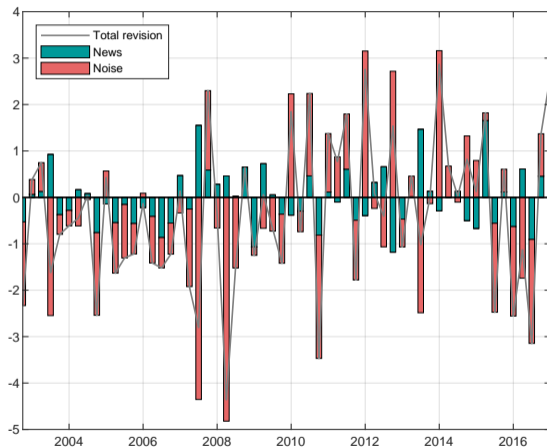
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# Historical decomposition of real *GDI* growth



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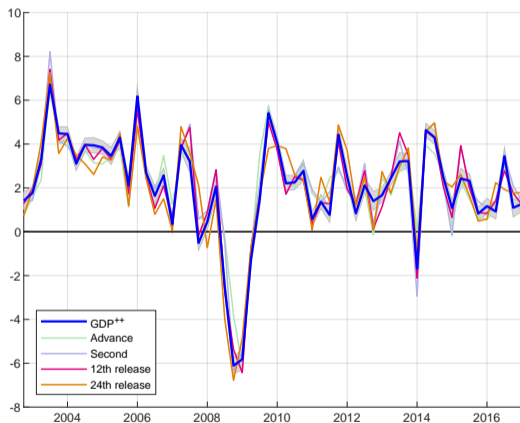
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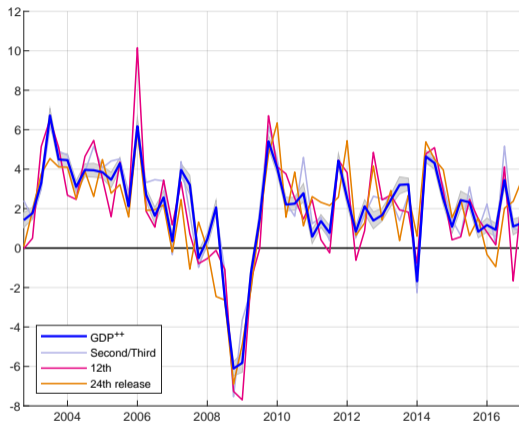
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# $GDP^{++}$ II



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# Conclusion

We show how to reconcile series subject to revision due to news and noise.

- ▶ Identification possible due to differing impact of news and noise errors across data vintages, and persistence in “true”  $GDP$

We provided a new real  $GDP$  growth measure using real-time data

- ▶ More persistent and smaller residual variance than real  $GDE$  growth and real  $GDI$  growth
- ▶ Similar AR-coefficient but smaller residual variance than  $GDP^+$

Computed historical decomposition of real  $GDE$  growth and real  $GDP$  growth measurement errors

- ▶ Higher news share in real  $GDE$  growth than in real  $GDI$  growth
- ▶ 2008 downturn in  $GDI$  seems like noise rather than a leading indicator of recession.

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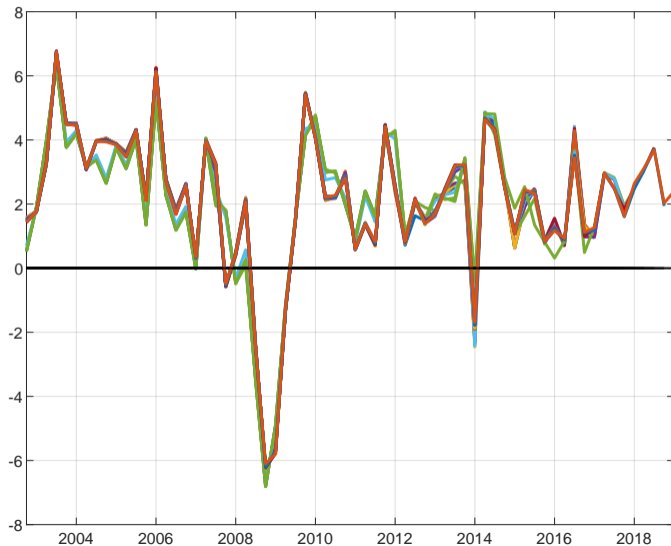
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# $GDP^{++}$ in Real-Time



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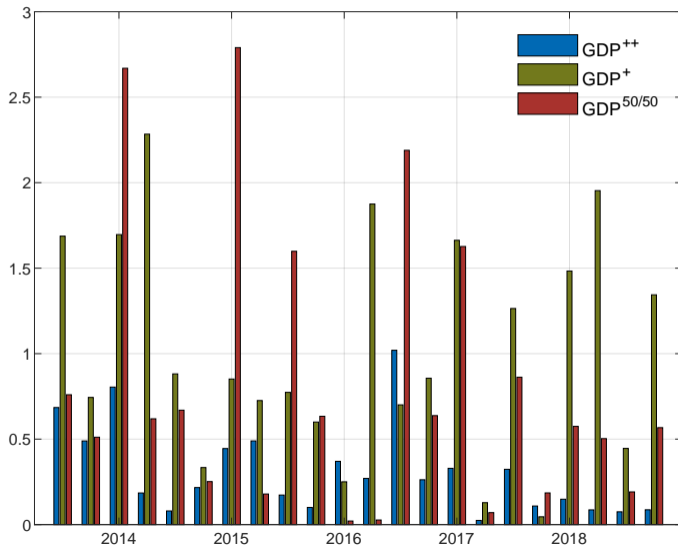
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# Revisions in $GDP^{++}$ , $GDP^+$ and $GDP^{50/50}$



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