

# Evaluation of a Modified Gross Flows Estimator for The Current Population Survey

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Joint Statistical Meetings  
August, 2024

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# Outline

Description of the Estimation Problem

Review The Current Population Survey (CPS)

Our Theoretical Approach

Our Empirical Results

Conclusions and Future Work

# Monthly Labor Force Estimates from BLS

- ▶ The Bureau of Labor Statistics (BLS) publishes monthly estimates for individuals aged 16+ in the Civilian Non institutional Population (CNP)
  - ▶ Total for those **Employed**
  - ▶ Total for those **Unemployed**
  - ▶ Total for those **Not in the Labor Force**
- ▶ Month-to-month transitions between those labor force states which are called "Gross Flows"
- ▶ There are some individuals who transition in or out of the CNP each month which we call **Flows** (either inflows or outflows)

# Monthly Gross Flows Labor Force Estimation

Table: Typical Monthly Table (in thousands).

		April 2024				
		<i>E</i>	<i>U</i>	<i>N</i>	<i>F</i>	<i>T</i>
March 2024	<i>E</i>	155,916	1,361	4,053	26	161,356
	<i>U</i>	1,793	3,176	1,633	2	6,604
	<i>N</i>	3,760	1,347	94,609	209	99,924
	<i>F</i>	121	10	288	—	418
	<i>T</i>	161,590	5,894	100,582	237	—

*E* = Employed

*U* = Unemployed

*N* = Not-in-Labor-Force

*F* = Flow (In-flow or Out-flow)

*T* = Total

# Theoretical Monthly Gross Flows Table

Table: Population Gross Flows Table.

		Current Month				
		<i>E</i>	<i>U</i>	<i>N</i>	<i>F</i>	<i>T</i>
Previous Month	<i>E</i>	$T_{EE}$	$T_{EU}$	$T_{EN}$	$T_{EF}$	$T_{ET}$
	<i>U</i>	$T_{UE}$	$T_{UU}$	$T_{UN}$	$T_{UF}$	$T_{UT}$
	<i>N</i>	$T_{NE}$	$T_{NU}$	$T_{NN}$	$T_{NF}$	$T_{NT}$
	<i>F</i>	$T_{FE}$	$T_{FU}$	$T_{FN}$	—	$T_{FT}$
	<i>T</i>	$T_{TE}$	$T_{TU}$	$T_{TN}$	$T_{TF}$	—

*E* = Employed

*U* = Unemployed

*N* = Not-in-Labor-Force

*F* = Flow (In-flow or Out-flow)

*T* = Total

# Motivation for Our Research

- ▶ The current raking method of Gross Flows Estimation used by BLS was described in Frazis, Robison, Evans and Duff (2005)
- ▶ The purpose of our research is to evaluate an alternative estimation method which builds off a model proposed by Stasny and Fienberg (1985)
  - ▶ Does not use external death data from the NCHS
  - ▶ Explicitly models differences in Month-in-sample pairs from the Current Population Survey (CPS)

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# Current Population Survey

- ▶ Household survey conducted each month, with particular emphasis on the month unemployment rate
- ▶ Survey of approximately 42,000 households each month
- ▶ Basic weighting reflects: Probability of selection, various nonresponse adjustments, and Post-stratification to known population control totals each month
- ▶ 4-8-4 Rotation Design.

# The CPS 4-8-4 Rotation Design

- ▶ In the CPS a household is in sample for 4 consecutive months, then exits the sample for 8 months, then reenters the sample for a final 4 consecutive months.
- ▶ MIS1, MIS2, . . . , MIS8 refers the number of months a sample household has been in Sample.
- ▶ Each month there are 8 month-in-sample groups.

# The CPS 4-8-4 Rotation Design

Table: Month in Sample Pairs

MIS	Month		Pair
	Previous	Current	
1	↘	<i>R</i>	
2	↘	→	(1,2)
3	↘	→	(2,3)
4	<i>R</i>	→	(3,4)
5	↘	<i>R</i>	
6	↘	→	(5,6)
7	↘	→	(6,7)
8	<i>R</i>	→	(7,8)

► *R* = unpaired due to sample rotation

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# Definition of Rotation and Missing

- ▶ Each month some units were eligible to be sampled but were not collected. We refer to these as **Missing**.
- ▶ Each month some sample units are not available because they have been rotated out of the sample. We refer to this unavailability as **Rotation**.
- ▶ Note: both Rotation and Missing are distinct from **Flows**

# Partial Flow Table *A* Using Previous Month's Weights

Table: Sample *A* Table

		Current Month						
		<i>E</i>	<i>U</i>	<i>N</i>	<i>F</i>	<i>M</i>	<i>R</i>	<i>T</i>
Previous Month	<i>E</i>	$A_{EE}$	$A_{EU}$	$A_{EN}$	$A_{EF}$	$A_{EM}$	$A_{ER}$	$A_{ET}$
	<i>U</i>	$A_{UE}$	$A_{UU}$	$A_{UN}$	$A_{UF}$	$A_{UM}$	$A_{UR}$	$A_{UT}$
	<i>N</i>	$A_{NE}$	$A_{NU}$	$A_{NN}$	$A_{NF}$	$A_{NM}$	$A_{NR}$	$A_{NT}$

*E* = Employed, *U* = Unemployed, *N* = Not-in-Labor Force

*F* = Flow (In-flow or Out-flow)

*M* = Missing, *R* = Rotation, *T* = Total

# Partial Flow Table $B$ Using Current Month's Weights

Table: Sample  $B$  Table

		Current Month		
		$E$	$U$	$N$
Previous Month	$E$	$B_{EE}$	$B_{EU}$	$B_{EN}$
	$U$	$B_{UE}$	$B_{UU}$	$B_{UN}$
	$N$	$B_{NE}$	$B_{NU}$	$B_{NN}$
	$F$	$B_{FE}$	$B_{FU}$	$B_{FN}$
	$M$	$B_{ME}$	$B_{MU}$	$B_{MN}$
	$R$	$B_{RE}$	$B_{RU}$	$B_{RN}$
	$T$	$B_{TE}$	$B_{TU}$	$B_{TN}$

$E$  = Employed,  $U$  = Unemployed,  $N$  = Not-in-Labor Force

$F$  = Flow (In-flow or Out-flow)

$M$  = Missing,  $R$  = Rotation,  $T$  = Total

# Schematic Representation of Our Estimation Method

**Table:** Reallocation of Those due to Missing and Rotation

		Current Month						
		<i>E</i>	<i>U</i>	<i>N</i>	<i>F</i>	<i>M</i>	<i>R</i>	<i>T</i>
Previous Month	<i>E</i>	$\hat{T}_{EE}$	$\hat{T}_{EU}$	$\hat{T}_{EN}$	$\hat{T}_{EF}$	←←	←←	$\hat{T}_{ET}$
	<i>U</i>	$\hat{T}_{UE}$	$\hat{T}_{UU}$	$\hat{T}_{UN}$	$\hat{T}_{UF}$	←←	←←	$\hat{T}_{UT}$
	<i>N</i>	$\hat{T}_{NE}$	$\hat{T}_{NU}$	$\hat{T}_{NN}$	$\hat{T}_{NF}$	←←	←←	$\hat{T}_{NT}$
	<i>F</i>	$\hat{T}_{FE}$	$\hat{T}_{FU}$	$\hat{T}_{FN}$				
	<i>M</i>	↑↑	↑↑	↑↑				
	<i>R</i>	↑↑	↑↑	↑↑				
	<i>T</i>	$\hat{T}_{TE}$	$\hat{T}_{TU}$	$\hat{T}_{TN}$				

*E* = Employed, *U* = Unemployed, *N* = Not-in-Labor Force

*F* = Flow (In-flow or Out-flow)

*M* = Missing, *R* = Rotation, *T* = Total

## Example of Modeling for the *A* Table

Row *E* month-in-sample  $i = 1, 2, 3, 5, 6, 7$

$$E\{A_{EE}^{(i)}\} = \theta_{AEi}(1 - P_{AEi})T_{EE}$$

$$E\{A_{EU}^{(i)}\} = \theta_{AEi}(1 - P_{AEi})T_{EU}$$

$$E\{A_{EN}^{(i)}\} = \theta_{AEi}(1 - P_{AEi})T_{EN}$$

$$E\{A_{EF}^{(i)}\} = \theta_{AEi}(1 - P_{AEi})T_{EF}$$

$$E\{A_{EM}^{(i)}\} = \theta_{AEi}P_{AEi}T_{ET}$$

Row *E* month-in-sample  $i = 4, 8$

$$E\{A_{ER}^{(i)}\} = \theta_{AEi}T_{ET}$$

## Example of Modeling for the $B$ Table

Column  $E$  month-in-sample  $i = 2,3,4,6,7,8$

$$E\{B_{EE}^{(i)}\} = \theta_{BEi}(1 - P_{BEi})T_{EE}$$

$$E\{B_{UE}^{(i)}\} = \theta_{BEi}(1 - P_{BEi})T_{UE}$$

$$E\{B_{NE}^{(i)}\} = \theta_{BEi}(1 - P_{BEi})T_{NE}$$

$$E\{B_{FE}^{(i)}\} = \theta_{BEi}(1 - P_{BEi})T_{FE}$$

$$E\{B_{ME}^{(i)}\} = \theta_{BEi}P_{BEi}T_{TE}$$

Column  $E$  month-in-sample  $i = 1,5$

$$E\{B_{RE}^{(i)}\} = \theta_{BEi}T_{TE}$$

# Interpretation of the Parameters

- ▶ The  $P$  parameters indicate the % missing rate
  - ▶ These are computed for  $E, U, N$
  - ▶ Also computed for each  $A$  and  $B$  table
  - ▶ And computed for each MIS pair (1,2), (2,3), (3,4), (5,6), (6,7), (7,8)
- ▶ The  $\theta$  indicate the month-in-sample effects and are computed monthly
- ▶ These parameters model the differences between MIS pairs and are a unique contribution of our research

# Estimation

- ▶ We use a pseudo likelihood method based on a multinomial likelihood.
- ▶ We estimate the parameters by nonlinear optimization while constraining the row and column totals of the the Gross Flows Table for  $E$ ,  $U$  and  $N$  to match the official monthly estimates (6 constraints). The 6 constraints correspond to 6 Lagrange multipliers which we compute each month.

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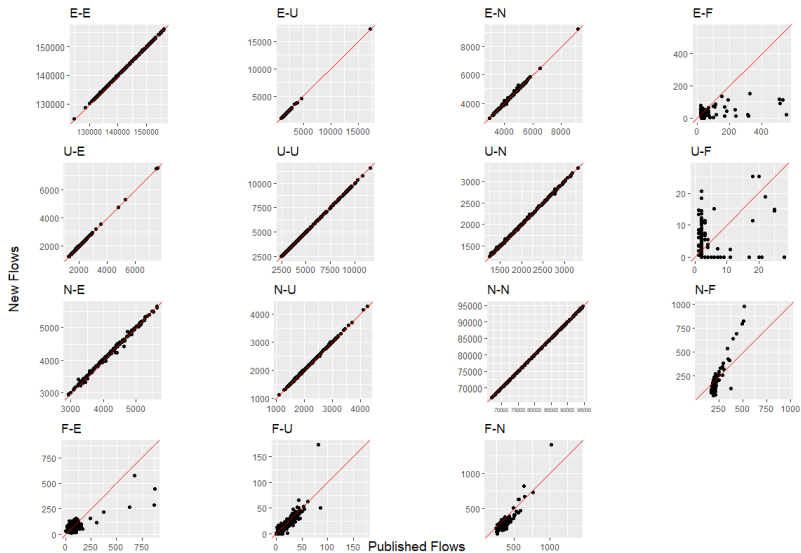
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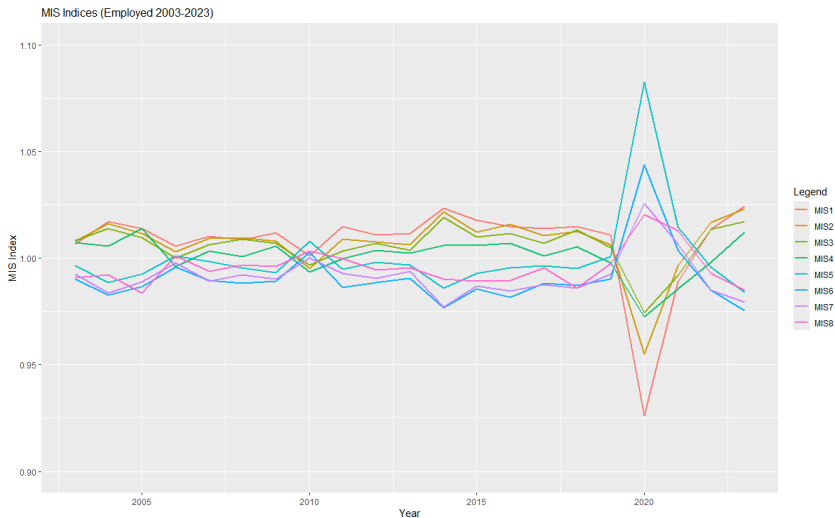
# Data Analyzed

- ▶ Monthly estimates from December 2002 to December 2023 were used.
- ▶ Gross Flows Tables were calculated by Total and Total split by Sex, but only Total are presented here.

# Gross Flow Estimate Comparison



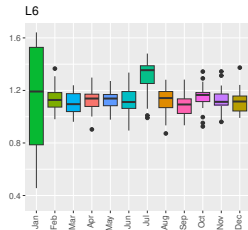
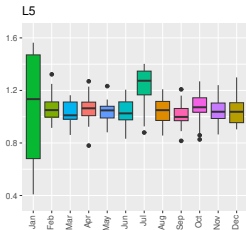
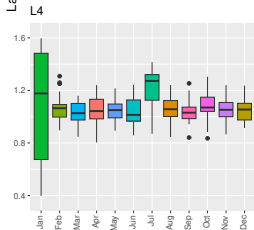
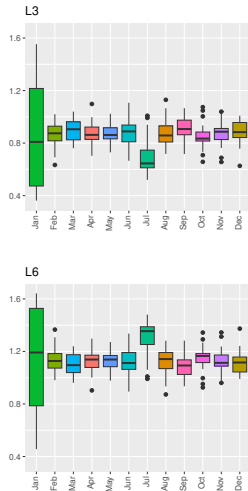
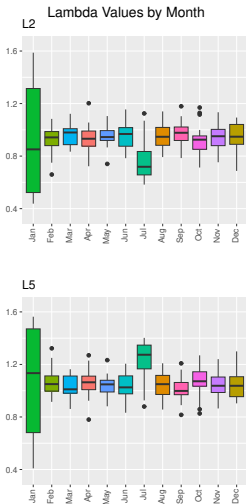
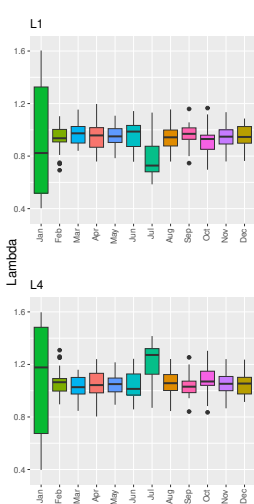
# Month-in-Sample Effects (2003-2023)



# Employed Missing Rates by MIS Pair (A Table)



# Lagrange Constraints



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- ▶ Our new estimates are very close to the reported estimates except for the in-flows and out-flows.
- ▶ Month-in-sample indexes reflect an unusual change around 2020.
- ▶ The Percent missing parameters are revealing about the dynamics of survey response.
- ▶ Lagrange multipliers reflect the impacts of annual population control changes in January,
- ▶ Future work will examine expanding the Gross Flow Table to expand Employed to include Part-time and Full-time, and expand Not-in-Labor-Force to include the Marginally Attached and the Non Marginally Attached.

# CONTACT INFORMATION

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