

# Identifying Seasonality Across Numerous Small Area Time Series

## An Investigation into Agricultural Employment Across U.S. Counties

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# Disclaimer

The views expressed here are not necessarily those of the U.S. Bureau of Labor Statistics, the Department of Labor, or the United States.



# Overview

The Local Area Unemployment Statistics (LAUS) program produces county-level total employment for all counties through a building block method.

- Current LAUS substate estimates use statewide agricultural employment from the Current Population Survey (CPS) and allocates to counties using the American Community Survey (ACS).
- Seasonal factors thus represent statewide variation spread across counties.
- Alternative agricultural employment data available for counties through administrative Quarterly Census of Employment and Wages (QCEW) with local over-the-month variation.

This study: apply X-13 to identify counties with seasonal agricultural employment using administrative QCEW data and examine feasibility of producing reasonable forecasts.

- Expect agricultural employment to be highly seasonal at the local level.

# Data

Monthly agricultural employment (NAICS 11 minus logging) time series by county or county equivalent in the U.S. and Puerto Rico with  $N = 2,815$  with strictly non-zero agricultural employment.

- Data sourced from the QCEW published by the BLS and cover July 2001 through March 2024 with  $T = 273$ .
  - Represents all agricultural employment covered under the Unemployment Insurance (UI) system or about 1.5 million workers in 2023 (annual average) ([U. S. Bureau of Labor Statistics 2024](#)).
- Coverage in the QCEW varies state-by-state due to differences in agricultural coverage in the UI system.
  - Complete coverage of farms and farm labor contractors in Arizona and California ([U. S. Bureau of Economic Analysis 2021](#)).
  - Some state labor market information offices develop their own estimates using alternative approaches.
- Important to note that QCEW counts jobs by *location* and not by *residence*.
  - LAUS counts employment on a residency basis.

# Methodology

Use X-13 to seasonally decompose county time series into trend, seasonal and irregular components through automatic model selection and outlier detection.

- Screen areas with seasonal ARIMA component, significant model-based F (MBF), and significant QS tests (Bell et al. 2022).
- Compute seasonality strength index from Hyndman and Athanasopoulos (2021) to sort seasonal areas into weakly and strongly seasonal areas,

$$\text{Strength}_i = \max \left( 0, 1 - \frac{\text{Var}(I_{it})}{\text{Var}(I_{it} + S_{it})} \right), \quad \forall i,$$

where  $I_t$  and  $S_t$  are the irregular and seasonal components, respectively.

Given long time series, standard tests may suffer weaknesses.

- QS test only examines first two seasonal autocorrelations, may be deeper patterns.
- MBF only detects for stable seasonality.

# Results

Comparing a few seasonality tests shows most specifications contained seasonal AR or MA terms and rejected both the MBF and QS tests.

- Most automatically selected models were the default airline model.
- QS had slightly lower rejection rates than MBF.
- Areas with larger seasonal strength indexes tended to have QS statistics above 150.

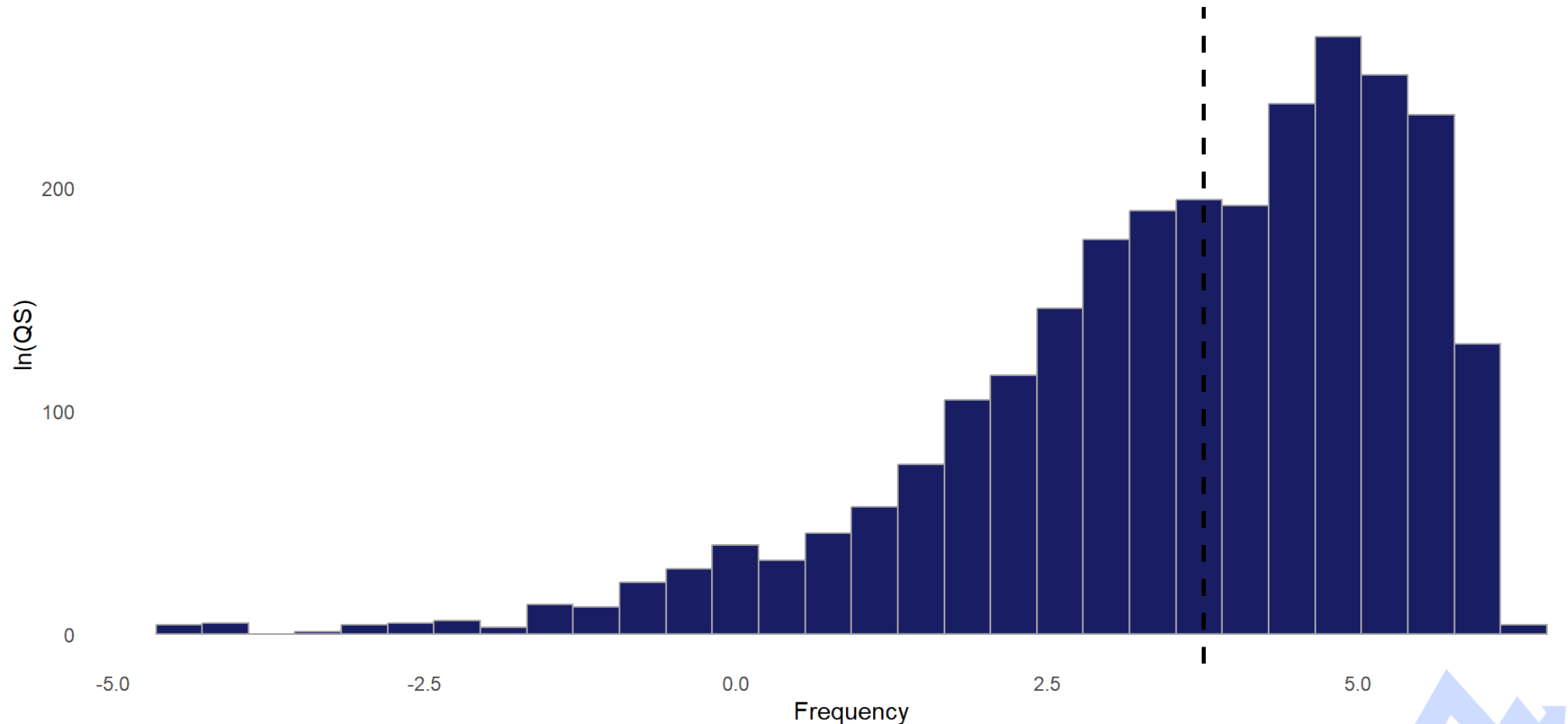
Strength Quantile	Seasonal AR/MA	MBF Sig.	QS Sig.	QS > 150
1	638	527	286	7
2	694	660	540	30
3	695	677	664	170
4	695	684	691	433
NA	19	41	20	0

*Notes: Significance determined at the 95% level.*

# QS Test Statistic Distribution

QS statistics were especially large and left skewed, showing very high rejection rates.

Distribution of the QS Statistic for Seasonality



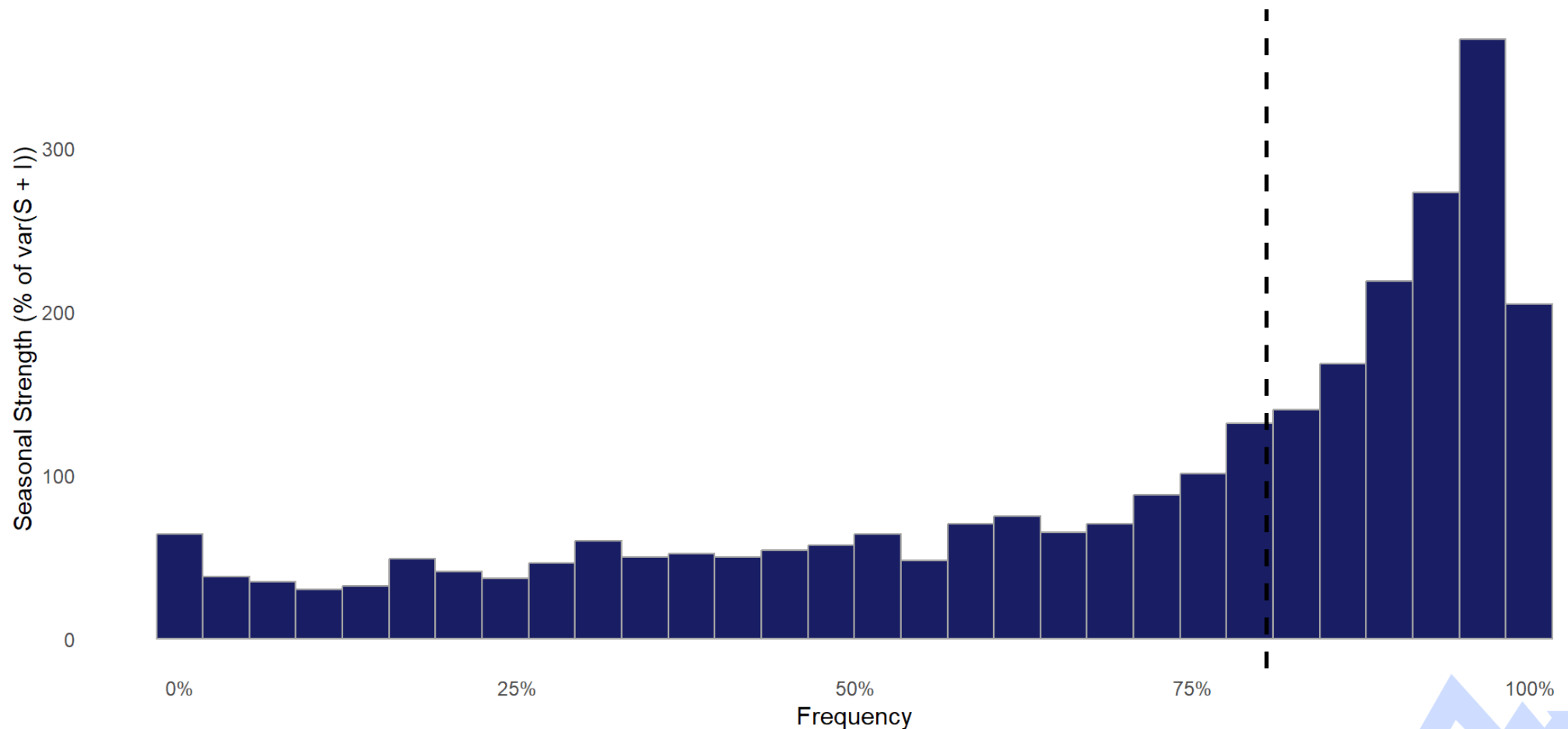
Notes: Dashed line denotes the 50th percentile.

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# Seasonality Strength Distribution

Seasonality strength index shows slightly more variation, although still a strong left skew.

Distribution of the Seasonality Strength Statistic Index



Notes: Dashed line denotes the 50th percentile.



# Discussion

QCEW administrative data show highly seasonal agricultural employment across substate areas as measured by standard seasonality tests.

- Standard QS and MBF tests appear overpowered given long time series.
- Overlaying standard tests from X-13 with additional metrics, such as seasonality strength, may help prevent over-identifying seasonal areas.
- As expected, agricultural employment was *highly seasonal* across multiple tests.

Further work will further refine seasonality testing.

- Add tests for moving seasonality, examine deeper seasonal autocorrelations.
- Examine spatial relationships between seasonal factors.
  - Spatial correlation may derive from similar farm types, commuting flows.
- Produce and evaluate county agricultural employment forecasts as research data.
  - Local-level seasonal variability from administrative data could help refine LAUS estimation.

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Research and Methods

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# References

- Bell, William R., Kathleen M. McDonald-Johnson, Tucker S. McElroy, Osbert Pang, Brian C. Monsell, and Baoline Chen. 2022. “Identifying Seasonality.”  
<https://www.bls.gov/osmr/research-papers/2022/st220010.htm>.
- Hyndman, Rob, and George Athanasopoulos. 2021. *Forecasting: Principles and Practice (3rd Ed)*. <https://otexts.com/fpp3/>.
- U. S. Bureau of Economic Analysis. 2021. *Local Area Personal Income Methodology*. Washington, DC: U.S. Bureau of Economic Analysis.  
<https://www.bea.gov/sites/default/files/methodologies/lapi2016.pdf>.
- U. S. Bureau of Labor Statistics. 2024. “Employment and Wages, Annual Averages 2023.” Washington, DC. <https://www.bls.gov/cew/publications/employment-and-wages-annual-averages/current/home.htm#exclusions>.

