

## Background

Ministry of Health (SS) officials implemented the National Journey of Safe Distance (JNSD), a non-pharmaceutical intervention (NPI) to mitigate the COVID-19 epidemic in the country in mid-March 2020. The NPI caused a massive loss of 12.5 million jobs between March and April 2020.

### Objective:

Estimate the short-term effect of JNSD on the labor market dynamics, focusing on the insertion and exit rates of formal and informal workers.

## Method

We developed multistate models to estimate transition rates between labor market states before the national lockdown using data from 03/2019 to 03/2020 and data from 4/2020 to 6/2020 for the JNSD period.

➤ We fitted the multistate models using maximum likelihood estimation, assuming time to transition follows an exponential distribution with a constant hazard.

➤ We used data from National Occupation and Employment Survey (ENOE) and the Telephone Occupation and Employment Survey (ETOE).

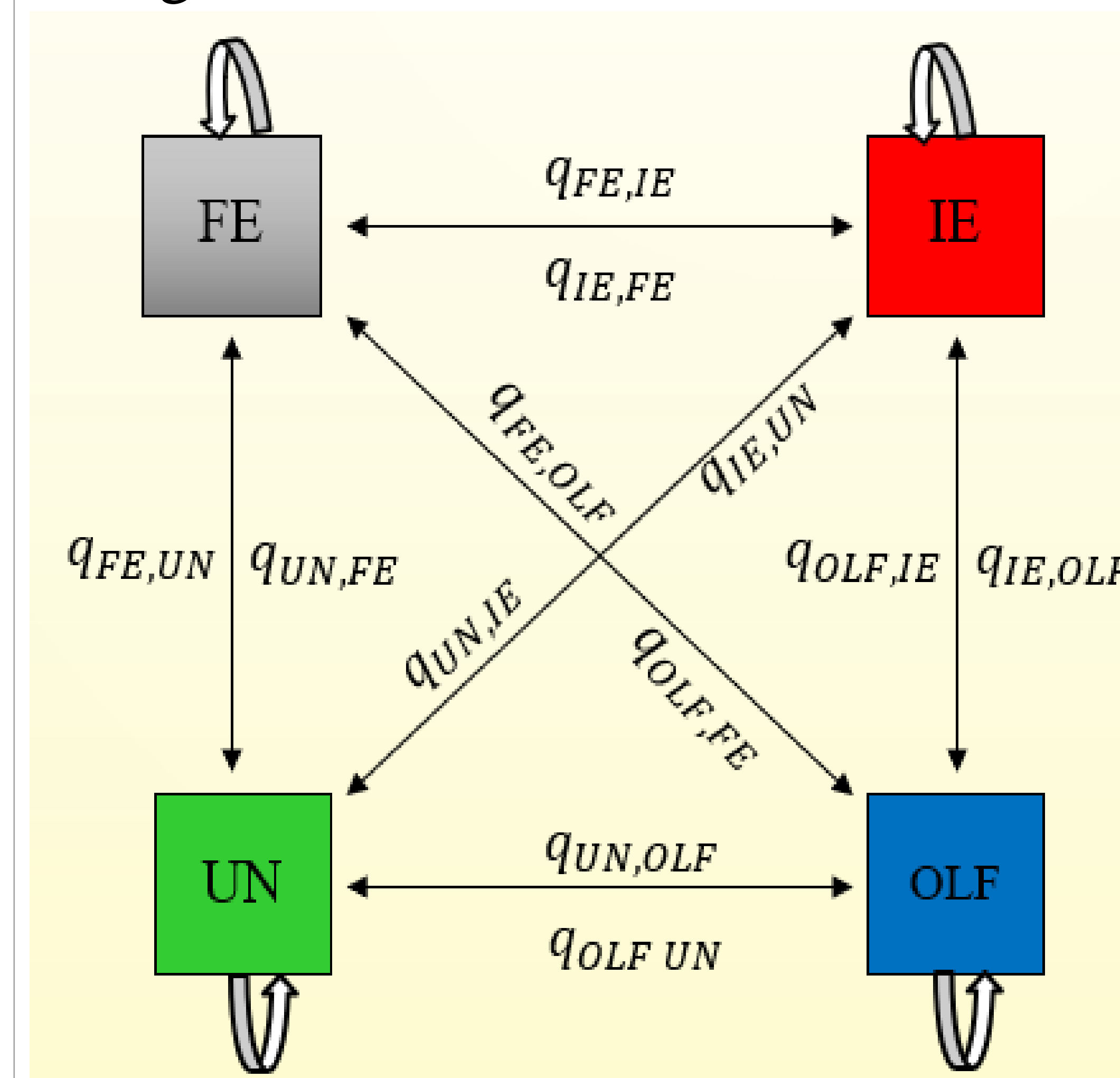
The COVID-19 national lockdown effect is estimated as a hazard ratio (HR) on the transition rates among labor market states controlling for sex, age, and education groups.

## Empirical Strategy

➤ The MSM has four states: formal employment (FE), informal employment (IE), unemployment (UN), and out of labor force (OLF).

➤ We assume that the mobility observed among labor states is generated by homogeneous Markov processes in continuous time.

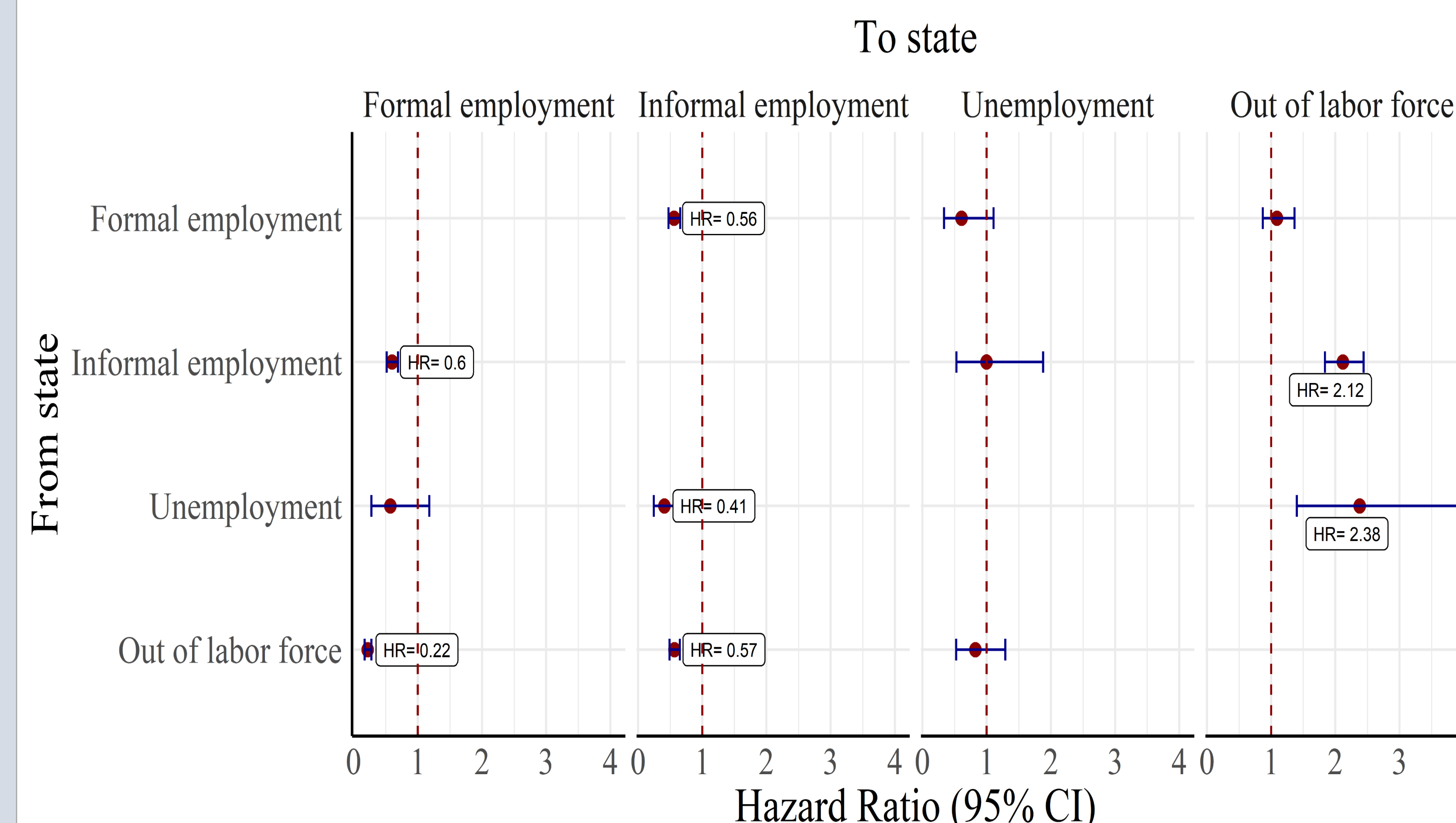
Fig 1. Labor Market Multistate Model



Note: Arrows indicate possible transitions. The acronyms are formal employment (FE), informal employment (IE), unemployment (UN), and Out of Labor Force (OLF). Source: own elaboration.

## Results

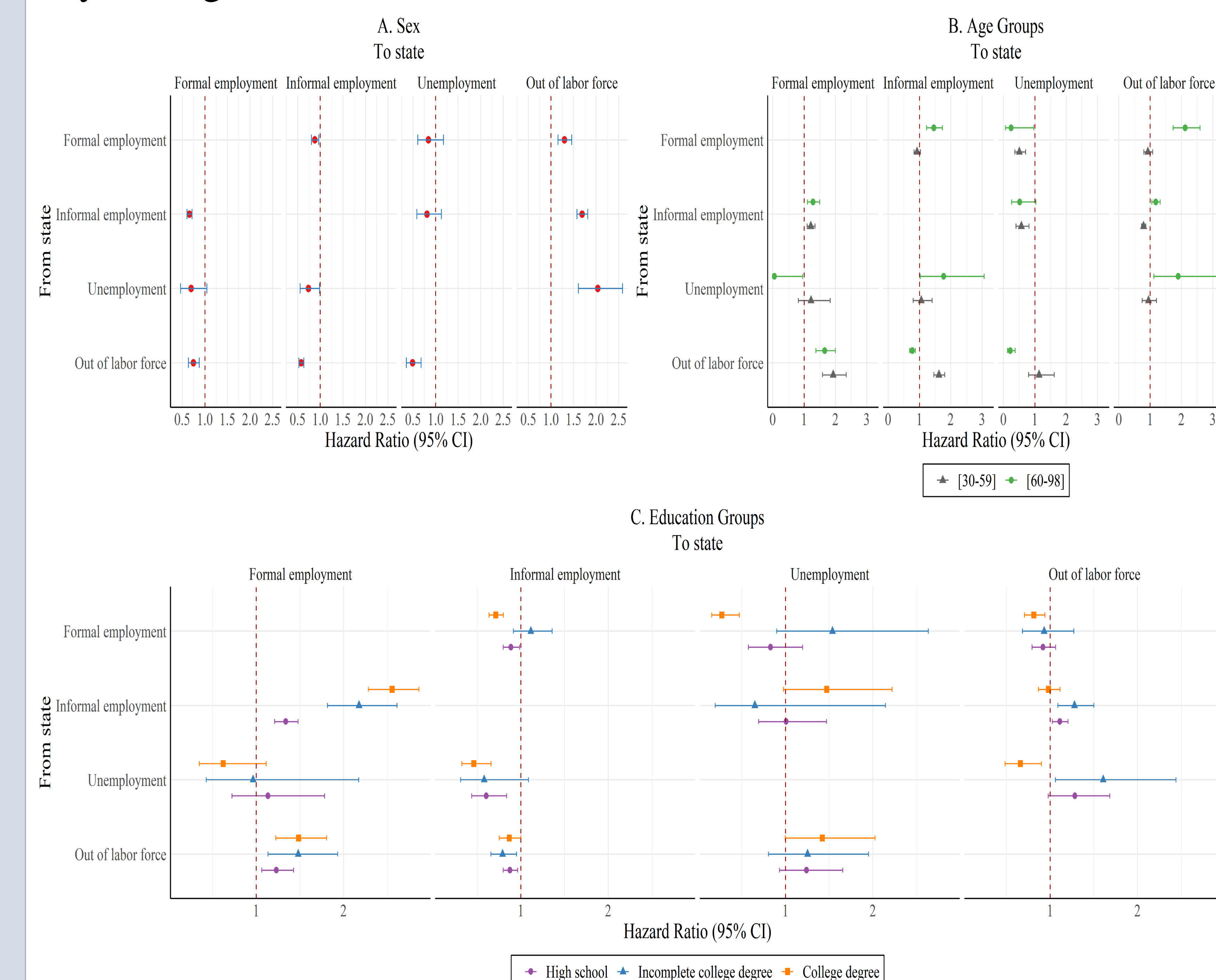
Fig. 2 Short-run effect of JNSD on transition rates among labor market states



➤ Transition rates from IE and UN to OLF are 2.12 (HR 95% CI, 1.83-2.43) and 2.38 (HR 95% CI, 1.39-4.04) higher in JNSD than the one-year pre-JNSD period, respectively.

➤ FE to UN and OLF transitions are 0.60 (HR 95% CI, 0.33-1.10) and 1.08 (HR 95% CI, 0.86-1.34).

Fig. 3 Hazard ratio for transition rates among employment states by sex, age, and education



➤ Women had 1.30 (HR 95% CI: 1.16-1.45), 1.69 (HR 95% CI: 1.57-1.81), and 2.03 (HR 95% CI: 1.60-2.58) higher rates in transitioning from FE, IF, and UN to OLF, respectively, than men.

➤ Individuals older than 59 years compared with 15–29-year-olds had 2.11 (HR 95% CI: 1.73-2.59), 1.18 (HR 95% CI: 1.05-1.31), 1.90 (HR 95% CI: 1.11-3.21) higher transition rates from FE, IE, and UN to OLF, respectively.

➤ Those with college education group had 0.82 (HR 95% CI: 0.70-0.94), 0.98 (HR 95% CI: 0.87-1.11), and 0.66 (HR 95% CI: 0.48-0.90) times the rate of transitioning from FE, IE, UN to OLF, compared with low education group of workers.

### Conclusion:

We found that informal workers were more vulnerable to leaving the active labor market than formal workers during JNSD. Women, individuals with only primary education, 15–29-year-olds, and those older than 65 were more likely to transit to OLF state than men, individuals with a college education, and 30-59-year-olds.