

# Recent Macro Trends: Data Analysis

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## 0. Set-up

### Work description

- Following Karahan et al. (2024), proposing an overview of the evolution of the startup rate in Japan and it's potential link with the labour force growth rate.

### Data Description

- Population demographics for Japan are retrieved from OECD data.
  - **WAP:** OECD. *Working-age population (15-64) – Quarterly growth rate* [Data set]. OECD Data Explorer. Retrieved October 28, 2025, from <https://data-explorer.oecd.org/?lc=en>
  - **CLF:** OECD. *Labour force – Quarterly level for 15-64 age group* [Data set]. OECD Data Explorer. Retrieved October 28, 2025, from <https://data-explorer.oecd.org/?lc=en>
- Japanese firms demographics are not available in any digital format. The values are thus retrieved from PDF reports and compiled using ChatGPT (also used for traduction).
  - **BEFORE 2006:** Japan Institute for Labour Policy and Training (JILPT). (2009). *Chapter 12: Trends in establishments*, pp. 139–147. Tokyo: JILPT. [https://www.jil.go.jp/kokunai/statistics/kako/2009/documents/12\\_p139-147.pdf](https://www.jil.go.jp/kokunai/statistics/kako/2009/documents/12_p139-147.pdf)
  - **AFTER 2006:** Small and Medium Enterprise Agency. (2020). *White Paper on SMEs in Japan, 2020, Part 1, Chapter 3, §1: Changes in number of enterprises and openings/closings*. Tokyo. [https://www.chusho.meti.go.jp/pamflet/hakusyo/2020/PDF/chusho/03Hakusyo\\_part1\\_chap3\\_web.pdf](https://www.chusho.meti.go.jp/pamflet/hakusyo/2020/PDF/chusho/03Hakusyo_part1_chap3_web.pdf)

### Packages

```
library(dplyr)
library(tidyr)
library(zoo)
library(ggplot2)
```

# 1. Population and labour force

## Loading Data

```
df_pop <- read.csv("WAP_OECD.csv", header = T )
df_labour <- read.csv("labour_force.csv", header = T )
```

## WAP Cleaning

```
df_pop <- df_pop %>%
  filter(REF_AREA == "JPN") %>%
  select(REF_AREA, TIME_PERIOD, OBS_VALUE) %>%
  rename(WAP = OBS_VALUE)
```

## CLF Cleaning

```
df_labour <- df_labour %>%
  filter(REF_AREA == "JPN") %>%
  select(REF_AREA, TIME_PERIOD, OBS_VALUE) %>%
  rename(CLF = OBS_VALUE) %>%
  arrange(TIME_PERIOD)
```

## Merging

- Only keeping overlapping years.

```
df_population <- df_labour %>%
  inner_join(df_pop, by = c("REF_AREA", "TIME_PERIOD"))
```

## Estimating Rates

- Simple calculation of WAP and CLF growth rates.

```
df_population <- df_population %>%
  group_by(REF_AREA) %>%
  mutate(CLF_growth = ((CLF - lag(CLF)) / lag(CLF)*100),
         WAP_growth = ((WAP - lag(WAP)) / lag(WAP)*100) )
```

## Long Formatting

```
df_population_long <- pivot_longer(df_population,
                                   cols = c(CLF_growth, WAP_growth),
                                   names_to = "Series",
                                   values_to = "Growth")
```

## 2. Firm demographics

### Loading Data

```
df_jap <- read.csv("japan_data.csv", header=T)
```

### Data Cleaning

- Keeping only the starting years, and the rates.
- Reformatting to a long format for the plot.

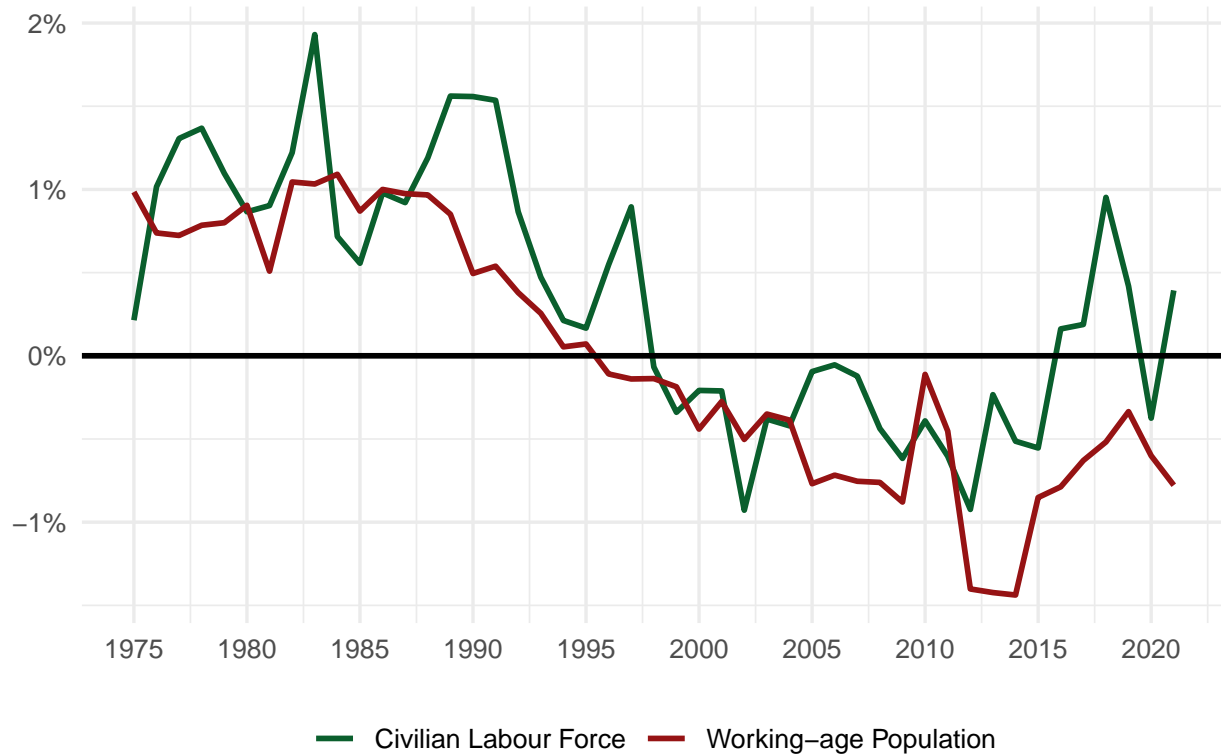
```
df_jap <- df_jap %>%  
  select(Start_year, Opening_rate_percent, Closure_rate_percent) %>%  
  pivot_longer(cols = c(Opening_rate_percent, Closure_rate_percent),  
               names_to = "Variable", values_to = "Rate") %>%  
  mutate(Variable = recode(Variable,  
                           Opening_rate_percent = "Entry_rate",  
                           Closure_rate_percent = "Exit_rate"))
```

## 3. Graphical analysis

### Labour Force Evolution

```
ggplot(df_population, aes(x = as.integer(TIME_PERIOD))) +  
  geom_line(aes(y = CLF_growth / 100,  
               color = "Civilian Labour Force"), linewidth = 1) +  
  geom_line(aes(y = WAP_growth / 100,  
               color = "Working-age Population"), linewidth = 1) +  
  geom_hline(yintercept = 0, color = "black", size = 1) +  
  labs(title = "Japan: Labour Supply Growth Rates",  
       x = NULL, y = NULL, color = NULL) +  
  scale_color_manual(values = c("Civilian Labour Force" = "#0A5F2D",  
                                "Working-age Population" = "#961314")) +  
  scale_y_continuous(labels = scales::percent_format(accuracy = 1)) +  
  scale_x_continuous(breaks = seq(1975, 2021, by = 5), limits = c(1975, 2021)) +  
  theme_minimal(base_size = 13) +  
  theme(legend.position = "bottom") +  
  coord_cartesian(ylim = range(c(df_population$CLF_growth,  
                                df_population$WAP_growth), na.rm = TRUE) / 100)
```

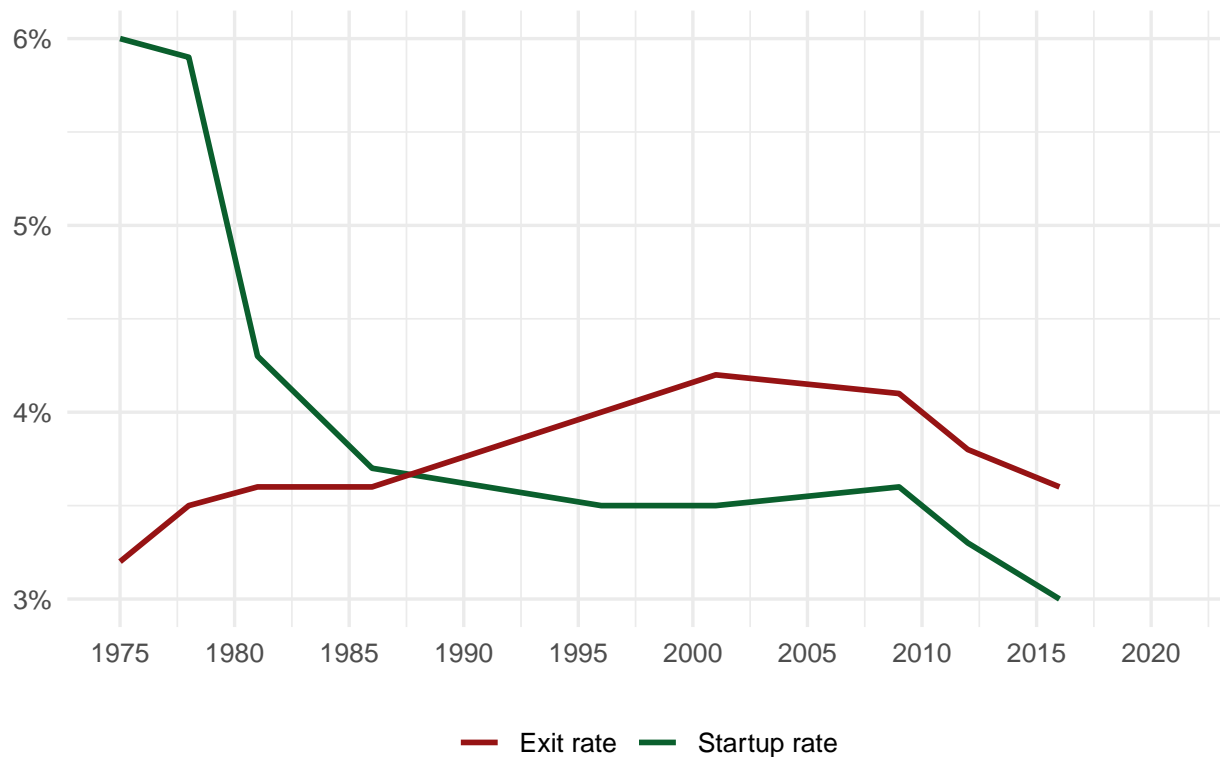
## Japan: Labour Supply Growth Rates



## Firm Demographics Evolution

```
ggplot(df_jap, aes(x = as.integer(Start_year))) +
  geom_line(data = subset(df_jap, Variable == "Entry_rate"),
    aes(y = Rate/100, color = "Startup rate"),
    linewidth = 1) +
  geom_line(data = subset(df_jap, Variable == "Exit_rate"),
    aes(y = Rate/100, color = "Exit rate"),
    linewidth = 1) +
  geom_hline(yintercept = 0, color = "black", size = 1) +
  labs(title = "Japan: Startup and Exit Rates",
    x = NULL, y = NULL, color = NULL) +
  scale_color_manual(values = c("Startup rate" = "#0A5F2D",
    "Exit rate" = "#961314")) +
  theme_minimal(base_size = 13) +
  theme(legend.position = "bottom") +
  coord_cartesian(ylim = range(df_jap$Rate/100, na.rm = TRUE)) +
  scale_x_continuous(breaks = seq(1975, 2021, by = 5), limits = c(1975, 2021)) +
  scale_y_continuous(labels = scales::percent_format(accuracy = 1))
```

## Japan: Startup and Exit Rates



## 4. Elasticity evaluation

### Merging dataframes

```
df_merged <- df_jap %>%  
  filter(Variable == "Entry_rate") %>%  
  left_join(df_population %>%  
    select(TIME_PERIOD, WAP_growth),  
    by = c("Start_year" = "TIME_PERIOD")) %>%  
  select(Start_year, Rate, WAP_growth) %>%  
  rename(Year = Start_year, Entry_rate = Rate)
```

### Estimating Elasticity

- Log-log technique is not producing realistic results due to the rates being close to zero.
- Here a simple level difference is used as a proxy for the elasticity, making use of the first order Taylor expansion of  $\log(1+x) = x$ .

```
df_elast <- df_merged %>%  
  arrange(Year) %>%  
  mutate(d_entry = Entry_rate - lag(Entry_rate),  
         d_labour = WAP_growth - lag(WAP_growth)) %>%  
  filter(!is.na(d_entry), !is.na(d_labour), abs(d_labour) > 0.001)
```

```
elasticity <- sum(df_elast$d_entry) / sum(df_elast$d_labour)
cat("Elasticity of the Startup rate WRT labour force:", round(elasticity, 2))
```

```
## Elasticity of the Startup rate WRT labour force: 1.69
```