Problem Set 1: PSID - Labor Outcomes

Tate Mason

Part 1: Overall Trends:

```
library(AER)
library(haven)
library(tidyverse)
library(psych)
library(patchwork)
library(broom)
library(Hmisc)
library(knitr)
```

```
df <- read_dta("~/SchoolWork/Y2S1/Macro/Data/PSID/PSID.dta")</pre>
```

Warning: ... is ignored in group_split(<grouped_df>), please use group_by(..., .add =
TRUE) %>% group_split()

Warning: Returning more (or less) than 1 row per `summarise()` group was deprecated in dplyr 1.1.0.

- i Please use `reframe()` instead.
- i When switching from `summarise()` to `reframe()`, remember that `reframe()` always returns an ungrouped data frame and adjust accordingly.

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year	group	category	individu	al p erson_	_ye yıes ırs_	_poo had an_	_a ge llege_	_p w thite_	_collar <u>avet</u> age
1999	Full sample	All	1847	3795	1	41.7	22.6	57.0	41.7
2001	-	All	1855	4078	1	42.4	24.1	55.7	42.4
2003	-	All	1844	4209	1	42.7	24.1	28.2	42.7
2005	-	All	1814	4231	1	43.0	22.1	26.4	43.0
2007	-	All	1799	4349	1	43.4	21.2	25.0	43.4
2009	-	All	1767	4421	1	43.1	29.3	26.2	43.1
2011	_	All	1713	4441	1	43.2	28.0	27.5	43.2
2013	Full	All	1701	4475	1	43.1	27.8	27.6	43.1
2015		All	1650	4365	1	43.1	27.3	28.1	43.1
2017	sample Full sample	All	1908	4684	1	43.0	49.3	NaN	43.0
NA	Educatio	nHS Dropout	873	1288	1	42.6	22.6	68.3	42.6
NA	Educatio	nHS Gradu-	873	1288	1	42.6	22.6	68.3	42.6
NA	Educatio	ate nCollege Plus	873	1288	1	42.6	22.6	68.3	42.6
NA	Educatio		883	1358	1	43.4	24.1	70.8	43.4
NA	Educatio	nHS Gradu-	883	1358	1	43.4	24.1	70.8	43.4
NA	Educatio	ate nCollege Plus	883	1358	1	43.4	24.1	70.8	43.4

i Please use `reframe()` instead.

year	group	category	indivi	dualperson_	_ye ynes ırs_	_pool nd an_	_a go llege_	_p w thite_	_collar <u>apgt</u> age
NA	Education	onHS Dropout	892	1384	1	43.7	24.1	48.4	43.7
NA	Education	onCollege Plus	892	1384	1	43.7	24.1	48.4	43.7
NA	Education		892	1384	1	43.7	24.1	48.4	43.7
NA	Education		872	1380	1	44.1	22.1	41.7	44.1
NA	Education	onCollege Plus	872	1380	1	44.1	22.1	41.7	44.1
NA	Education	onHS Gradu- ate	872	1380	1	44.1	22.1	41.7	44.1
NA	Education	onHS Dropout	866	1387	1	44.3	21.2	41.0	44.3
NA	Education	onCollege Plus	866	1387	1	44.3	21.2	41.0	44.3
NA	Education	onHS Gradu- ate	866	1387	1	44.3	21.2	41.0	44.3
NA	Education	onHS Dropout	929	1522	1	43.4	29.3	40.3	43.4
NA	Education	onCollege Plus	929	1522	1	43.4	29.3	40.3	43.4
NA	Education	onHS Gradu- ate	929	1522	1	43.4	29.3	40.3	43.4
NA	Education	onHS Dropout	921	1536	1	43.1	28.0	47.5	43.1
NA	Education	onCollege Plus	921	1536	1	43.1	28.0	47.5	43.1
NA	Education		921	1536	1	43.1	28.0	47.5	43.1
NA	Education	onHS Dropout	928	1555	1	42.8	27.8	43.8	42.8
NA	Education	onCollege Plus	928	1555	1	42.8	27.8	43.8	42.8

year	group	category	individ	lual p erson_	_ye yes rs_	_poo had an_	_a ge llege_	_p w thite_	_collar <u>a</u> p <u>oct</u> ag
NA	Educatio		928	1555	1	42.8	27.8	43.8	42.8
		Gradu-							
NT A	T3.1	ate	001	1510	1	40 C	07.9	45.0	40. C
NA	Educatio	nhs Dropout	921	1512	1	42.6	27.3	45.2	42.6
NA	Educatio	-	921	1512	1	42.6	27.3	45.2	42.6
1111	Laucano	Plus	521	1012	1	42.0	21.0	40.2	42.0
NA	Educatio		921	1512	1	42.6	27.3	45.2	42.6
		Gradu-							
		ate							
NA	Educatio		880	1399	1	42.7	49.3	NaN	42.7
		Gradu-							
NT A	та <i>«</i>	ate	000	1200	1	40.7	40.2	NT - NT	40.7
NA	Educatio	nCollege Plus	880	1399	1	42.7	49.3	NaN	42.7
NA	Educatio		880	1399	1	42.7	49.3	NaN	42.7
1111	Ladacatio	Dropout	000	1000	1	12.1	40.0	11611	12.1
NA	Industry	-	507	629	1	41.6	19.2	57.0	41.6
	v	Collar							
NA	Industry		507	629	1	41.6	19.2	57.0	41.6
		Collar							
NA	Industry		541	646	1	42.7	23.4	55.7	42.7
TAT A	т 1 д	Collar	F 41	C 1 C	1	40.7	00.4	FF 77	40.7
NA	Industry	Collar	541	646	1	42.7	23.4	55.7	42.7
NA	Industry		597	773	1	42.7	23.6	28.2	42.7
1111	maastry	Collar	001	110	1	12.1	29.0	20.2	12.,
NA	Industry		597	773	1	42.7	23.6	28.2	42.7
	-	Collar							
NA	Industry		607	793	1	43.5	20.6	26.4	43.5
		Collar							
NA	Industry		607	793	1	43.5	20.6	26.4	43.5
NT A	T., J.,	Collar	649	920	1	49.0	20.0	25.0	42.0
NA	Industry	Collar	642	839	1	43.2	20.8	25.0	43.2
NA	Industry		642	839	1	43.2	20.8	25.0	43.2
. 1.1.1	industry	Collar	0.12	000	1	10.2	20.0	20.0	10.2
NA	Industry		627	856	1	42.3	29.8	26.2	42.3
	v	Collar							
NA	Industry	White	627	856	1	42.3	29.8	26.2	42.3
		Collar							

year	group	category	individu	alperson_	_ye ynes rs_	_poo hod an_	_a ge llege	_p w thite_	_collar <u>apgt</u> age
NA	Industry	Blue Collar	557	777	1	42.8	22.9	27.5	42.8
NA	Industry	White Collar	557	777	1	42.8	22.9	27.5	42.8
NA	Industry	Blue Collar	566	782	1	42.8	27.0	27.6	42.8
NA	Industry	White Collar	566	782	1	42.8	27.0	27.6	42.8
NA	Industry	Blue Collar	551	764	1	42.4	26.1	28.1	42.4
NA	Industry	White Collar	551	764	1	42.4	26.1	28.1	42.4
NA	Wealth	Medium Wealth	1847	3795	1	41.7	22.6	57.0	41.7
NA	Wealth	High Wealth	1847	3795	1	41.7	22.6	57.0	41.7
NA	Wealth	Low Wealth	1847	3795	1	41.7	22.6	57.0	41.7
NA	Wealth	Medium Wealth	1855	4078	1	42.4	24.1	55.7	42.4
NA	Wealth	Low Wealth	1855	4078	1	42.4	24.1	55.7	42.4
NA	Wealth	High Wealth	1855	4078	1	42.4	24.1	55.7	42.4
NA	Wealth	Medium Wealth	1844	4209	1	42.7	24.1	28.2	42.7
NA	Wealth	Low Wealth	1844	4209	1	42.7	24.1	28.2	42.7
NA	Wealth	High Wealth	1844	4209	1	42.7	24.1	28.2	42.7
NA	Wealth	Medium Wealth	1814	4231	1	43.0	22.1	26.4	43.0
NA	Wealth	High Wealth	1814	4231	1	43.0	22.1	26.4	43.0
NA	Wealth	Low Wealth	1814	4231	1	43.0	22.1	26.4	43.0
NA	Wealth	Medium Wealth	1799	4349	1	43.4	21.2	25.0	43.4
NA	Wealth	Low Wealth	1799	4349	1	43.4	21.2	25.0	43.4

year	group	category	individ	ual p erson_	_ye ynes ırs_	_poo had an_	_a ge llege_	_p o thite_	_collar <u>avet</u> ag
NA	Wealth	High Wealth	1799	4349	1	43.4	21.2	25.0	43.4
NA	Wealth	Medium Wealth	1767	4421	1	43.1	29.3	26.2	43.1
NA	Wealth	Low Wealth	1767	4421	1	43.1	29.3	26.2	43.1
NA	Wealth	High Wealth	1767	4421	1	43.1	29.3	26.2	43.1
NA	Wealth	Medium Wealth	1713	4441	1	43.2	28.0	27.5	43.2
NA	Wealth	Low Wealth	1713	4441	1	43.2	28.0	27.5	43.2
NA	Wealth	High Wealth	1713	4441	1	43.2	28.0	27.5	43.2
NA	Wealth	Low Wealth	1701	4475	1	43.1	27.8	27.6	43.1
NA	Wealth	Medium Wealth	1701	4475	1	43.1	27.8	27.6	43.1
NA	Wealth	High Wealth	1701	4475	1	43.1	27.8	27.6	43.1
NA	Wealth	Low Wealth	1650	4365	1	43.1	27.3	28.1	43.1
NA	Wealth	Medium Wealth	1650	4365	1	43.1	27.3	28.1	43.1
NA	Wealth	High Wealth	1650	4365	1	43.1	27.3	28.1	43.1
NA	Wealth	Low Wealth	1908	4684	1	43.0	49.3	NaN	43.0
NA	Wealth	High Wealth	1908	4684	1	43.0	49.3	NaN	43.0
NA	Wealth	Medium Wealth	1908	4684	1	43.0	49.3	NaN	43.0

Age profiles

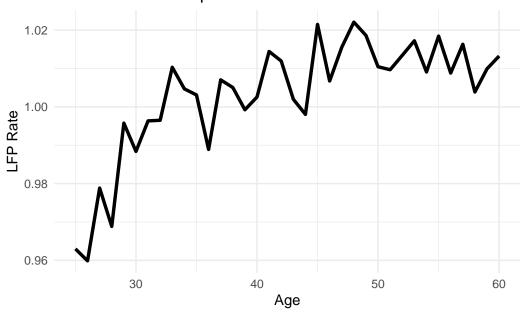
```
wm <- function(x,w) weighted.mean(x, w, na.rm=TRUE)
age_profile_fe <- function(data, y, base_age = 25, w_col = weight) {</pre>
```

```
yq <- rlang::enquo(y)</pre>
  wq <- rlang::enquo(w_col)</pre>
  d <- data %>%
   filter(!is.na(!!yq), !is.na(!!wq)) %>%
    mutate(
     age = as.integer(age),
      year = as.integer(year)
    )
  if (nrow(d) == 0) return(tibble(age = integer(), y_m = numeric()))
  # build formula: response ~ factor(age) + factor(year)
  resp <- rlang::as_name(yq)</pre>
  fml <- stats::as.formula(paste(resp, "~ factor(age) + factor(year)"))</pre>
  # evaluate weights as a numeric vector
  wv <- as.numeric(rlang::eval_tidy(wq, d))</pre>
  reg <- stats::lm(fml, data = d, weights = wv)</pre>
  af <- broom::tidy(reg) %>%
    dplyr::filter(grepl("^factor\\(age\\)", term)) %>%
    dplyr::mutate(age = as.integer(gsub("factor\\(age\\)", "", term))) %>%
    tidyr::complete(age = base_age:60, fill = list(estimate = 0)) %>%
    dplyr::arrange(age) %>%
    dplyr::transmute(age, y_m = estimate)
 mu <- mean(d[[resp]], na.rm = TRUE)</pre>
  dplyr::mutate(af, y_m = y_m + mu)
var_prof_year_net <- function(data, y, w_col = weight) {</pre>
  yq <- rlang::enquo(y)</pre>
 wq <- rlang::enquo(w_col)</pre>
  d <- data %>%
    filter(!is.na(!!yq), !!yq > 0, !is.na(!!wq)) %>%
    mutate(
      age = as.integer(age),
      year = as.integer(year),
      1y = \log(!!yq),
```

```
= as.numeric(!!wq) # <- carry weights as a column</pre>
    )
  if (nrow(d) == 0) return(tibble(age = integer(), v = numeric()))
  # Remove year effects with weighted regression
  reg <- stats::lm(ly ~ factor(year), data = d, weights = d$w)</pre>
  d$res <- stats::resid(reg)
  # Weighted variance within each age using that age group's weights
  d %>%
    group_by(age) %>%
    summarise(
      v = {
        wg <- w
        rg <- res
        mu <- weighted.mean(rg, wg, na.rm = TRUE)</pre>
        sum(wg * (rg - mu)^2, na.rm = TRUE) / sum(wg, na.rm = TRUE)
      },
      .groups = "drop"
    )
}
lfp_age_fe <- age_profile_fe(psid_m, lfp)</pre>
wage_age_fe <- age_profile_fe(psid_m, wage_real)</pre>
hr_age_fe <- age_profile_fe(psid_m, hr_worked)</pre>
inc_age_fe <- age_profile_fe(psid_m, inc_real)</pre>
var_wage_age <- var_prof_year_net(psid_m, wage_real)</pre>
var_hr_age <- var_prof_year_net(psid_m, hr_worked)</pre>
ggplot(lfp_age_fe, aes(age, y_m)) +
  geom_line(size = 1.2) +
  labs(
    title = "Labor Force Participation Rate",
    x = "Age",
    y = "LFP Rate"
  ) +
  theme minimal()
```

Warning: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0. i Please use `linewidth` instead.

Labor Force Participation Rate



```
ggsave("lfp_age_fe.pdf", width = 6, height = 4)

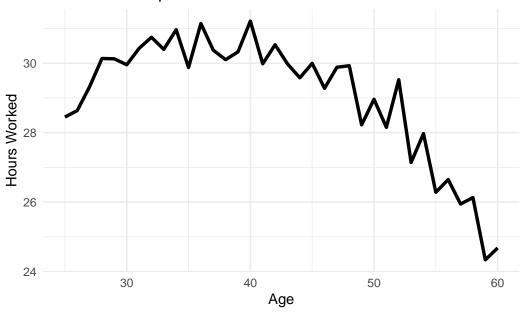
ggplot(wage_age_fe, aes(age, y_m)) +
  geom_line(size = 1.2) +
  labs(
    title = "Real Wage",
    x = "Age",
    y = "Real Wage (2017 $)"
  ) +
  theme_minimal()
```



```
ggsave("wage_age_fe.pdf", width = 6, height = 4)

ggplot(hr_age_fe, aes(age, y_m)) +
    geom_line(size = 1.2) +
    labs(
        title = "Hours Worked per Week",
        x = "Age",
        y = "Hours Worked"
    ) +
    theme_minimal()
```

Hours Worked per Week



```
ggsave("hr_age_fe.pdf", width = 6, height = 4)

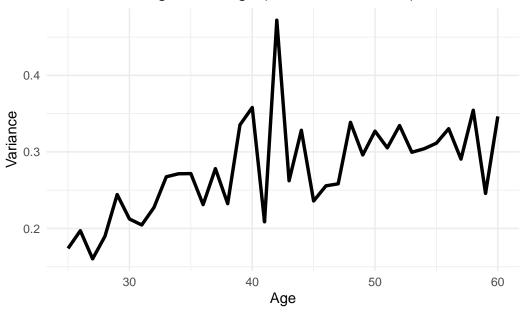
ggplot(inc_age_fe, aes(age, y_m)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Annual Income",
        x = "Age",
        y = "Real Income (2017 $)"
    ) +
    theme_minimal()
```

Real Annual Income 60000 30000 30 40 50 60 Age

```
ggsave("inc_age_fe.pdf", width = 6, height = 4)

ggplot(var_wage_age, aes(age, v)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Real Wage (Net of Year Effects)",
        x = "Age",
        y = "Variance"
    ) +
    theme_minimal()
```

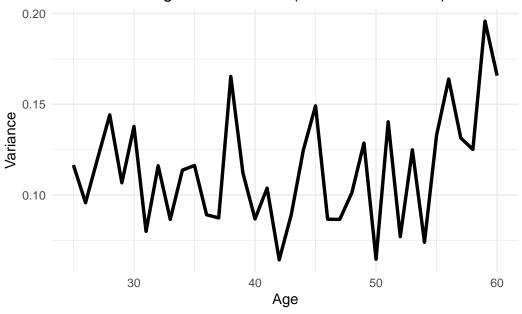
Variance of Log Real Wage (Net of Year Effects)



```
ggsave("var_wage_age.pdf", width = 6, height = 4)

ggplot(var_hr_age, aes(age, v)) +
  geom_line(size = 1.2) +
  labs(
    title = "Variance of Log Hours Worked (Net of Year Effects)",
    x = "Age",
    y = "Variance"
  ) +
  theme_minimal()
```

Variance of Log Hours Worked (Net of Year Effects)



```
ggsave("var_hr_age.pdf", width = 6, height = 4)
```

Education groups

```
wage_age_fe_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_modify(~ age_profile_fe(.x, wage_real)) %>%
    ungroup()

hour_age_fe_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_modify(~ age_profile_fe(.x, hr_worked)) %>%
    ungroup()

lfp_age_fe_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_by(educ_group) %>%
    group_by(educ_group) %>%
    group_modify(~ age_profile_fe(.x, lfp)) %>%
    ungroup()
```

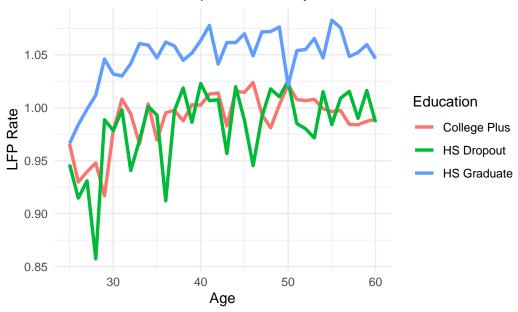
```
inc_age_fe_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_modify(~ age_profile_fe(.x, inc_real)) %>%
    ungroup()

var_wage_age_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_modify(~ var_prof_year_net(.x, wage_real)) %>%
    ungroup()

var_hr_age_educ <- psid_m %>%
    filter(!is.na(educ_group)) %>%
    group_by(educ_group) %>%
    group_by(educ_group) %>%
    group_modify(~ var_prof_year_net(.x, hr_worked)) %>%
    ungroup()
```

```
ggplot(lfp_age_fe_educ, aes(age, y_m, color = educ_group)) +
  geom_line(size = 1.2) +
  labs(
    title = "Labor Force Participation Rate by Education",
    x = "Age",
    y = "LFP Rate",
    color = "Education"
) +
  theme_minimal()
```

Labor Force Participation Rate by Education



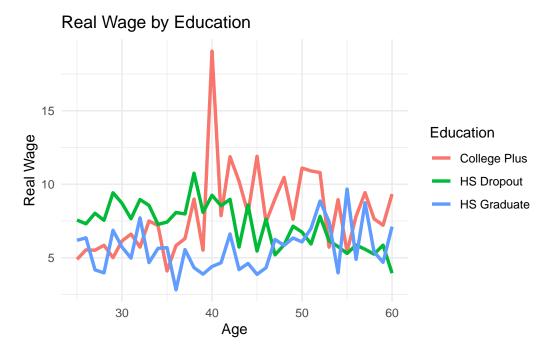
```
ggsave("lfp_age_fe_educ.pdf", width = 6, height = 4)

ggplot(inc_age_fe_educ, aes(age, y_m, color = educ_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Annual Income by Education",
        x = "Age",
        y = "Real Income",
        color = "Education"
    ) +
    theme_minimal()
```

Real Annual Income by Education 200000 150000 100000 College Plus HS Dropout HS Graduate

```
ggsave("inc_age_fe_educ.pdf", width = 6, height = 4)

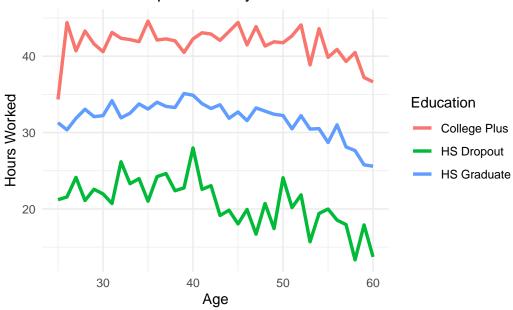
ggplot(wage_age_fe_educ, aes(age, y_m, color = educ_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Wage by Education",
        x = "Age",
        y = "Real Wage",
        color = "Education"
    ) +
    theme_minimal()
```



```
ggsave("wage_age_fe_educ.pdf", width = 6, height = 4)

ggplot(hour_age_fe_educ, aes(age, y_m, color = educ_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Hours Worked per Week by Education",
        x = "Age",
        y = "Hours Worked",
        color = "Education"
    ) +
    theme_minimal()
```

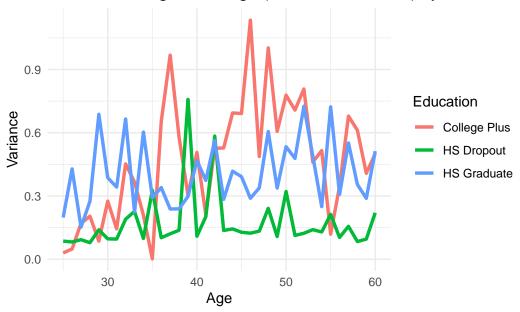
Hours Worked per Week by Education



```
ggsave("hr_age_fe_educ.pdf", width = 6, height = 4)

ggplot(var_wage_age_educ, aes(age, v, color = educ_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Real Wage (Net of Year Effects) by Education",
        x = "Age",
        y = "Variance",
        color = "Education"
    ) +
    theme_minimal()
```

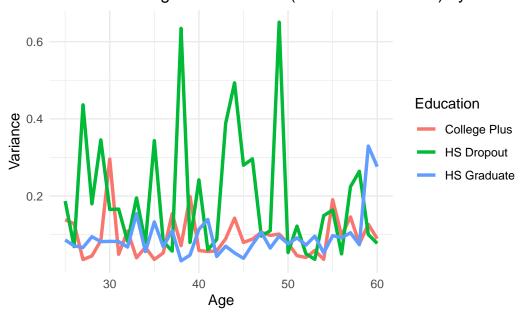
Variance of Log Real Wage (Net of Year Effects) by Education



```
ggsave("var_wage_age_educ.pdf", width = 6, height = 4)

ggplot(var_hr_age_educ, aes(age, v, color = educ_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Hours Worked (Net of Year Effects) by Education",
        x = "Age",
        y = "Variance",
        color = "Education"
    ) +
    theme_minimal()
```

Variance of Log Hours Worked (Net of Year Effects) by Educati



```
ggsave("var_hr_age_educ.pdf", width = 6, height = 4)
```

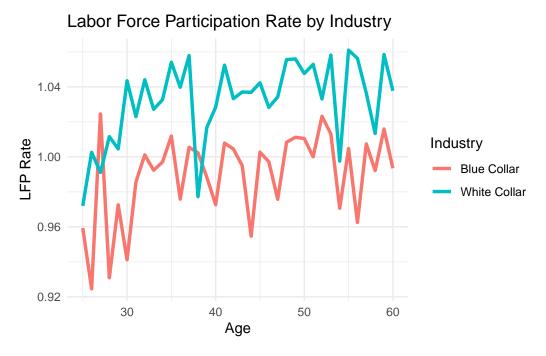
Industry groups

```
wage_age_fe_ind <- psid_m %>%
    filter(!is.na(ind_group)) %>%
    group_by(ind_group) %>%
    group_modify(~ age_profile_fe(.x, wage_real)) %>%
    ungroup()

hour_age_fe_ind <- psid_m %>%
    filter(!is.na(ind_group)) %>%
    group_by(ind_group) %>%
    group_modify(~ age_profile_fe(.x, hr_worked)) %>%
    ungroup()

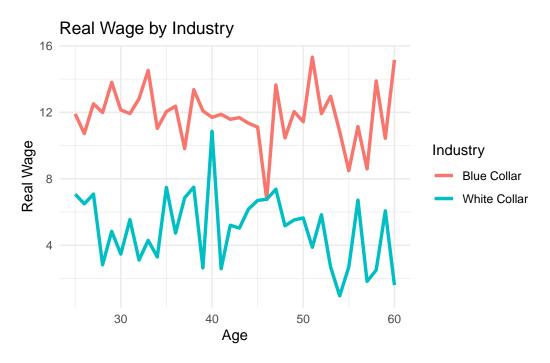
inc_age_fe_ind <- psid_m %>%
    filter(!is.na(ind_group)) %>%
    group_by(ind_group) %>%
    group_by(ind_group) %>%
    group_modify(~ age_profile_fe(.x, inc_real)) %>%
    ungroup()
```

```
lfp_age_fe_ind <- psid_m %>%
  filter(!is.na(ind_group)) %>%
  group_by(ind_group) %>%
  group_modify(~ age_profile_fe(.x, lfp)) %>%
 ungroup()
var_wage_age_ind <- psid_m %>%
 filter(!is.na(ind_group)) %>%
 group_by(ind_group) %>%
  group_modify(~ var_prof_year_net(.x, wage_real)) %>%
 ungroup()
var_hr_age_ind <- psid_m %>%
 filter(!is.na(ind_group)) %>%
  group_by(ind_group) %>%
 group_modify(~ var_prof_year_net(.x, hr_worked)) %>%
 ungroup()
ggplot(lfp_age_fe_ind, aes(age, y_m, color = ind_group)) +
  geom_line(size = 1.2) +
 labs(
   title = "Labor Force Participation Rate by Industry",
   x = "Age",
   y = "LFP Rate",
   color = "Industry"
  ) +
  theme_minimal()
```



```
ggsave("lfp_age_fe_ind.pdf", width = 6, height = 4)

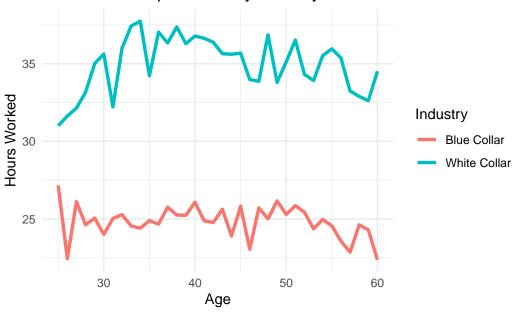
ggplot(wage_age_fe_ind, aes(age, y_m, color = ind_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Wage by Industry",
        x = "Age",
        y = "Real Wage",
        color = "Industry"
    ) +
    theme_minimal()
```



```
ggsave("wage_age_fe_ind.pdf", width = 6, height = 4)

ggplot(hour_age_fe_ind, aes(age, y_m, color = ind_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Hours Worked per Week by Industry",
        x = "Age",
        y = "Hours Worked",
        color = "Industry"
    ) +
    theme_minimal()
```

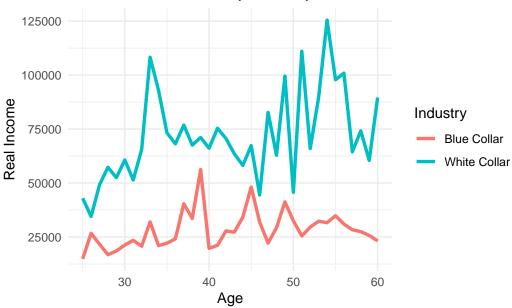
Hours Worked per Week by Industry



```
ggsave("hr_age_fe_ind.pdf", width = 6, height = 4)

ggplot(inc_age_fe_ind, aes(age, y_m, color = ind_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Annual Income by Industry",
        x = "Age",
        y = "Real Income",
        color = "Industry"
    ) +
    theme_minimal()
```

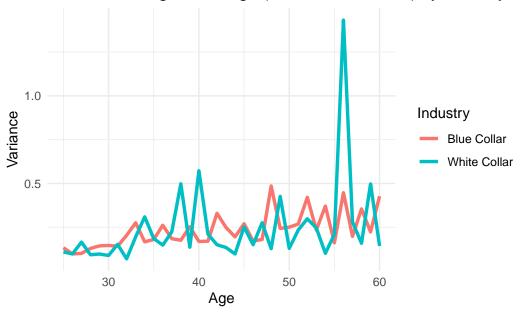
Real Annual Income by Industry



```
ggsave("inc_age_fe_ind.pdf", width = 6, height = 4)

ggplot(var_wage_age_ind, aes(age, v, color = ind_group)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Real Wage (Net of Year Effects) by Industry",
        x = "Age",
        y = "Variance",
        color = "Industry"
    ) +
    theme_minimal()
```

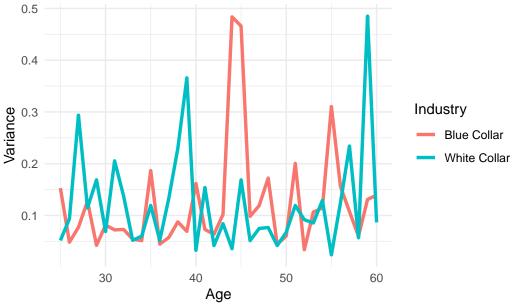
Variance of Log Real Wage (Net of Year Effects) by Industry



```
ggsave("var_wage_age_ind.pdf", width = 6, height = 4)

ggplot(var_hr_age_ind, aes(age, v, color = ind_group)) +
  geom_line(size = 1.2) +
  labs(
    title = "Variance of Log Hours Worked (Net of Year Effects) by Industry",
    x = "Age",
    y = "Variance",
    color = "Industry"
) +
  theme_minimal()
```

Variance of Log Hours Worked (Net of Year Effects) by Industry



```
ggsave("var_hr_age_ind.pdf", width = 6, height = 4)
```

Wealth groups

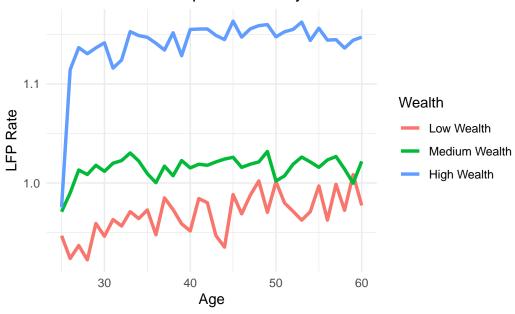
```
wage_age_fe_wealth <- psid_m %>%
    filter(!is.na(wealth_tectile)) %>%
    group_by(wealth_tectile) %>%
    group_modify(~ age_profile_fe(.x, wage_real)) %>%
    ungroup()

hour_age_fe_wealth <- psid_m %>%
    filter(!is.na(wealth_tectile)) %>%
    group_by(wealth_tectile) %>%
    group_modify(~ age_profile_fe(.x, hr_worked)) %>%
    ungroup()

inc_age_fe_wealth <- psid_m %>%
    filter(!is.na(wealth_tectile)) %>%
    group_by(wealth_tectile)) %>%
    group_by(wealth_tectile) %>%
    group_modify(~ age_profile_fe(.x, inc_real)) %>%
    ungroup()
```

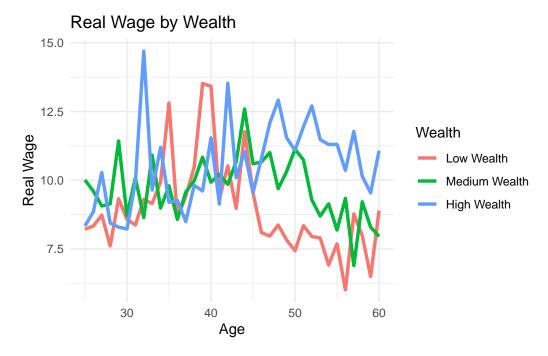
```
lfp_age_fe_wealth <- psid_m %>%
  filter(!is.na(wealth_tectile)) %>%
  group_by(wealth_tectile) %>%
  group_modify(~ age_profile_fe(.x, lfp)) %>%
  ungroup()
var_wage_age_wealth <- psid_m %>%
  filter(!is.na(wealth_tectile)) %>%
 group_by(wealth_tectile) %>%
  group_modify(~ var_prof_year_net(.x, wage_real)) %>%
 ungroup()
var_hr_age_wealth <- psid_m %>%
 filter(!is.na(wealth_tectile)) %>%
  group_by(wealth_tectile) %>%
  group_modify(~ var_prof_year_net(.x, hr_worked)) %>%
  ungroup()
ggplot(lfp_age_fe_wealth, aes(age, y_m, color = wealth_tectile)) +
  geom_line(size = 1.2) +
 labs(
   title = "Labor Force Participation Rate by Wealth",
   x = "Age",
   y = "LFP Rate",
    color = "Wealth"
  ) +
  theme_minimal()
```

Labor Force Participation Rate by Wealth



```
ggsave("lfp_age_fe_wealth.pdf", width = 6, height = 4)

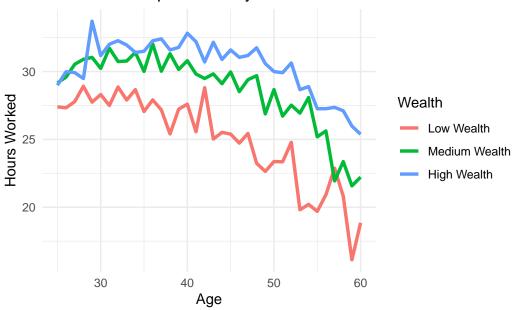
ggplot(wage_age_fe_wealth, aes(age, y_m, color = wealth_tectile)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Wage by Wealth",
        x = "Age",
        y = "Real Wage",
        color = "Wealth"
    ) +
    theme_minimal()
```



```
ggsave("wage_age_fe_wealth.pdf", width = 6, height = 4)

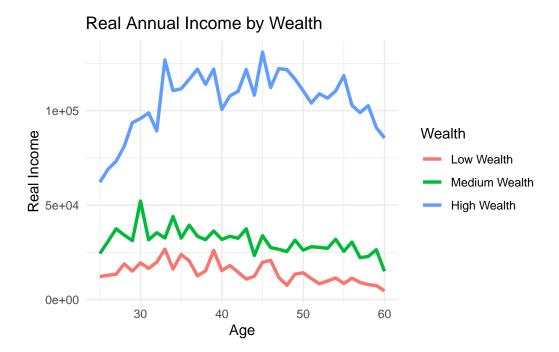
ggplot(hour_age_fe_wealth, aes(age, y_m, color = wealth_tectile)) +
    geom_line(size = 1.2) +
    labs(
        title = "Hours Worked per Week by Wealth",
        x = "Age",
        y = "Hours Worked",
        color = "Wealth"
    ) +
    theme_minimal()
```

Hours Worked per Week by Wealth



```
ggsave("hr_age_fe_wealth.pdf", width = 6, height = 4)

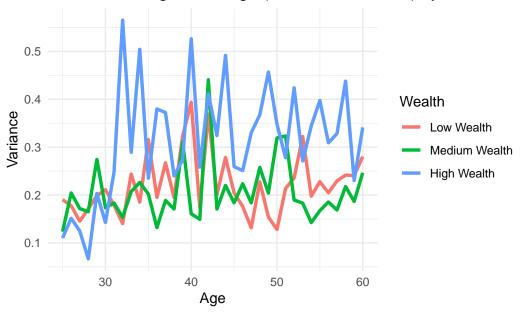
ggplot(inc_age_fe_wealth, aes(age, y_m, color = wealth_tectile)) +
    geom_line(size = 1.2) +
    labs(
        title = "Real Annual Income by Wealth",
        x = "Age",
        y = "Real Income",
        color = "Wealth"
    ) +
    theme_minimal()
```



```
ggsave("inc_age_fe_wealth.pdf", width = 6, height = 4)

ggplot(var_wage_age_wealth, aes(age, v, color = wealth_tectile)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Real Wage (Net of Year Effects) by Wealth",
        x = "Age",
        y = "Variance",
        color = "Wealth"
    ) +
    theme_minimal()
```

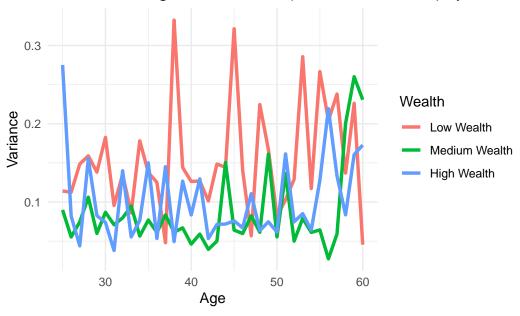
Variance of Log Real Wage (Net of Year Effects) by Wealth



```
ggsave("var_wage_age_wealth.pdf", width = 6, height = 4)

ggplot(var_hr_age_wealth, aes(age, v, color = wealth_tectile)) +
    geom_line(size = 1.2) +
    labs(
        title = "Variance of Log Hours Worked (Net of Year Effects) by Wealth",
        x = "Age",
        y = "Variance",
        color = "Wealth"
    ) +
    theme_minimal()
```

Variance of Log Hours Worked (Net of Year Effects) by Wealth



ggsave("var_hr_age_wealth.pdf", width = 6, height = 4)