

analysis_III_time_series_abs

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Crosswalk

```
# load in xwalk
xwalk <- data.table(read_excel("../ref/Census_integrated_occ_crosswalks.xlsx"))
xwalk_long <- melt(xwalk, id.vars = c("OCC1950", "Occupation category description"))
setnames(xwalk_long, c("OCC1950", "OCC1950_desc", "year", "orig_occ"))
xwalk_long[as.character(year) == "ACS 2000-02", year := "2000ACS"]
xwalk_long[as.character(year) == "ACS 2003-", year := "2018"]

# copy 1950 vals to 1940 for now xwalk_long
xwalk_long[, year := as.character(year)]
xwalk_long[year == 1950] %>%
  .[, year := 1940] %>%
  rbind(., xwalk_long) -> temp
xwalk_long[, orig_occ := as.numeric(orig_occ)]
census_1940[, occ := as.numeric(occ)]
# merge on census
census_1940 <- merge(census_1940, xwalk_long, by.y = c("year", "orig_occ"), by.x = c("year", "occ"), all=TRUE)

get_vars <- function(c.data, c.by_vars, c.by_vars_2, c.var_interest){
  out_dt_1 <- c.data[,.(w_i_ss = weighted.var(get(c.var_interest), perwt) * .N,
    N = .N,
    k = max(.GRP)),
    by = c(c.by_vars, c.by_vars_2)]
  out_2 <- c.data[,.(tot_ss=weighted.var(get(c.var_interest), perwt) * .N), by = c.by_vars_2]
  out_dt_1 <- merge(out_dt_1, out_2, by = c.by_vars_2)
  out_dt_1 <- out_dt_1[!is.na(tot_ss)& !is.na(w_i_ss) & !is.nan(tot_ss)& !is.nan(w_i_ss) &
    !is.infinite(tot_ss)& !is.infinite(w_i_ss),
    .(avg_within_var = sum(w_i_ss),
      avg_total_var = mean(tot_ss),
      avg_between_var = mean(tot_ss) - sum(w_i_ss),
      N = sum(N),
      k = length(unique(N[!is.na(w_i_ss)]))),
    by = c.by_vars_2]
  return(out_dt_1)
}

dem_var_gettr2 <- function(c.dat2, c.by_vars_2){
  occ_only <- get_vars(c.dat2,
    c.by_vars = c("origocc1950"),
    c.by_vars_2 = c.by_vars_2,
```

```

        c.var_interest = "log_incwage")
occ_only[, grouping := "Occupation"]
ind_only <- get_vars(c.dat2,
                    c.by_vars = c("origind1950"),
                    c.by_vars_2 = c.by_vars_2,

                    c.var_interest = "log_incwage")
ind_only[, grouping := "Industry"]

occ_ind <- get_vars(c.dat2,
                   c.by_vars = c("origocc1950", "origind1950"),
                   c.by_vars_2 = c.by_vars_2,
                   c.var_interest = "log_incwage")
occ_ind[, grouping := "Occ + Ind"]

out_dt <- rbindlist(list(occ_only, ind_only, occ_ind ))
return(out_dt)
}

temp <- dem_var_gettr2(census_1940, c.by_vars_2 = c("year"))

plot_dt2 <- temp

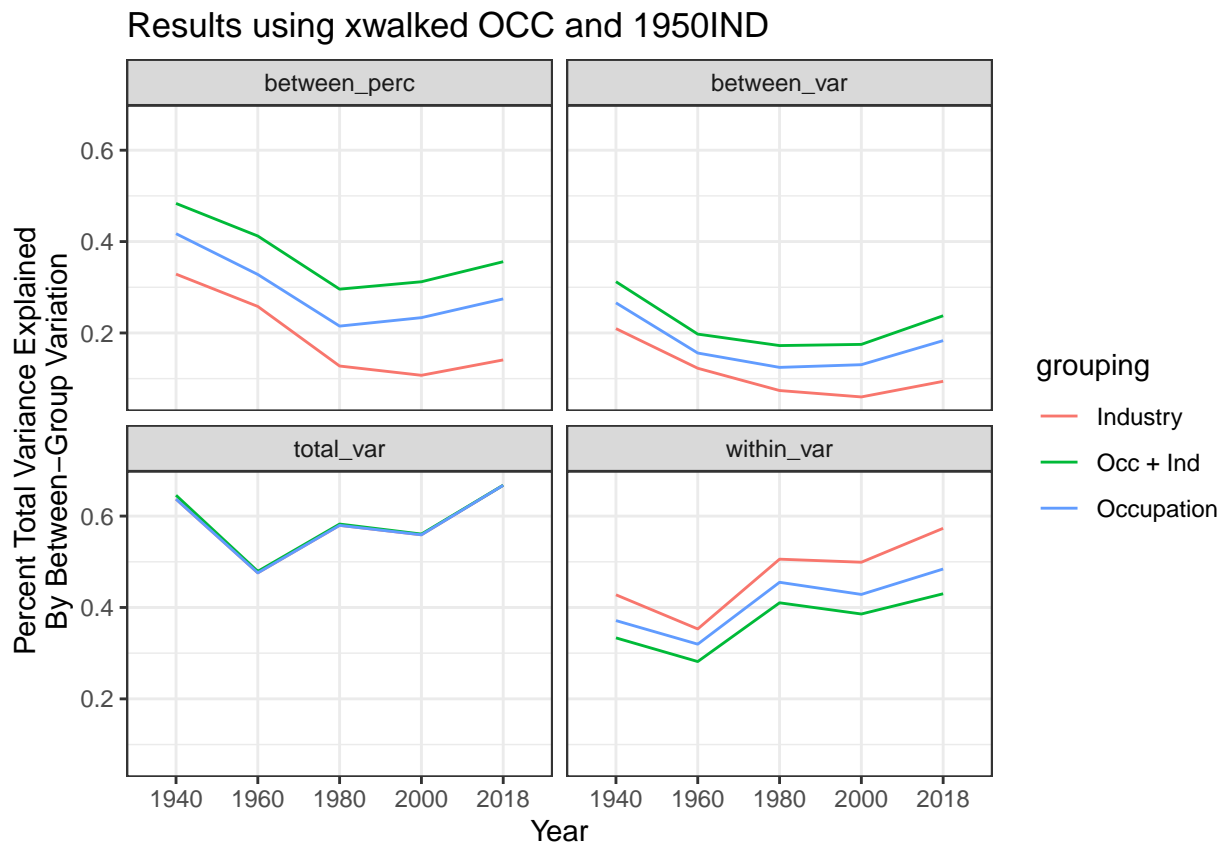
plot_dt2[, f_stat := (avg_between_var/(k-1))/((avg_within_var)/(N-k))]
plot_dt2[, ms_bw := (avg_between_var/(k-1))]
plot_dt2[, ms_wi := (avg_within_var/(N-k))]

plot_dt2[, within_perc :=
  avg_within_var/
  (avg_within_var+avg_between_var)]
plot_dt2[, between_perc :=
  avg_between_var/
  (avg_within_var+avg_between_var)]
plot_dt2[, bw_wi_perc_ratio := between_perc/within_perc]
plot_dt2[, total_var := avg_total_var/N]
plot_dt2[, within_var := avg_within_var/N]
plot_dt2[, between_var := avg_between_var/N]

# cast long
plot_dt2_long <- melt(plot_dt2, id.vars = c("year",
                                           "grouping"),
                     measure.vars = c("within_perc",
                                       "between_perc",
                                       "between_var",
                                       "bw_wi_perc_ratio",
                                       "total_var",
                                       "within_var",
                                       "ms_wi",
                                       "ms_bw"))

```

```
gg2 <- ggplot(plot_dt2_long[variable %like% "between_perc|total_var|within_var|between_var"]) +
  geom_line(aes(x = year, y = value,
                color = grouping, group = grouping))+
  facet_wrap(~variable)+
  labs(x = "Year", y = "Percent Total Variance Explained\nBy Between-Group Variation",
       title = "Results using xwalked OCC and 1950IND"
  )
print(gg2)
```



Task 2 - Use some specific occupations to examine specific trajectories

I'm using six relatively stable single occupational designations from the 1950 codings: teachers, industrial engineers, waiters/waitresses, accountants/auditors, lawyers and judges, clergymen.

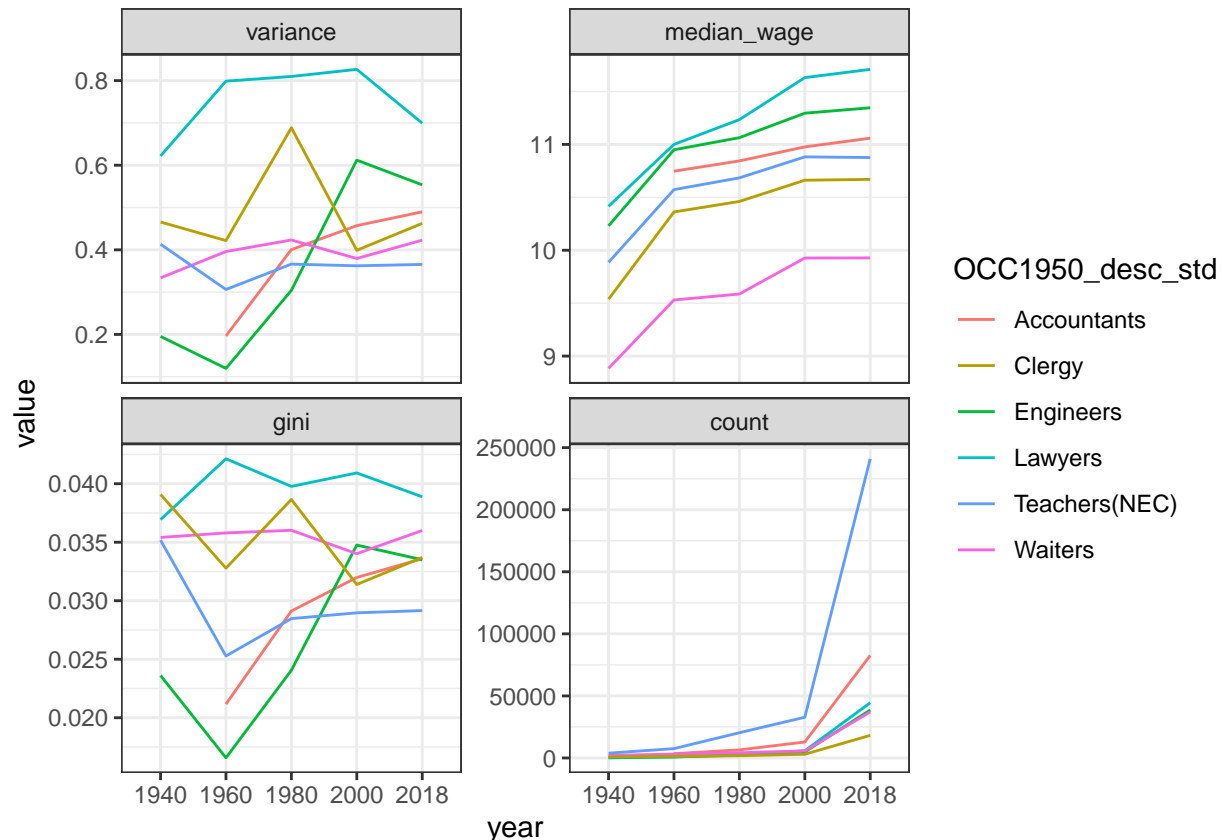
```
census_subset <- census_1940[OCC1950 %in% c(0, 784, 55, 45, 9, 93) & !is.na(origocc1950)]

# calculate variance by job, year
vars_by_job_year <- census_subset[,.(variance = var(log_incwage),
                                     median_wage = median(log_incwage),
                                     gini = DescTools::Gini(log_incwage),
                                     count = .N), by = .(OCC1950, year)]

# merge on desc
temp <- data.table(OCC1950 = as.character(c(0, 784, 55, 45, 9, 93)), OCC1950_desc_std = c("Accountants",
```

```
vars_by_job_year <- merge(vars_by_job_year, temp)

# plot
vars_by_job_year %>% melt(., id.vars = c("OCC1950_desc_std", "OCC1950", "year")) %>%
ggplot(.) +
  geom_line(aes(x = year, y = value, group = OCC1950, color = OCC1950_desc_std)) +
  facet_wrap(~variable, scales = "free_y")
```



Task 3 - do the above analysis for all occupations and see if there are any major outliers in terms of increased or decrease equality

Increased equality

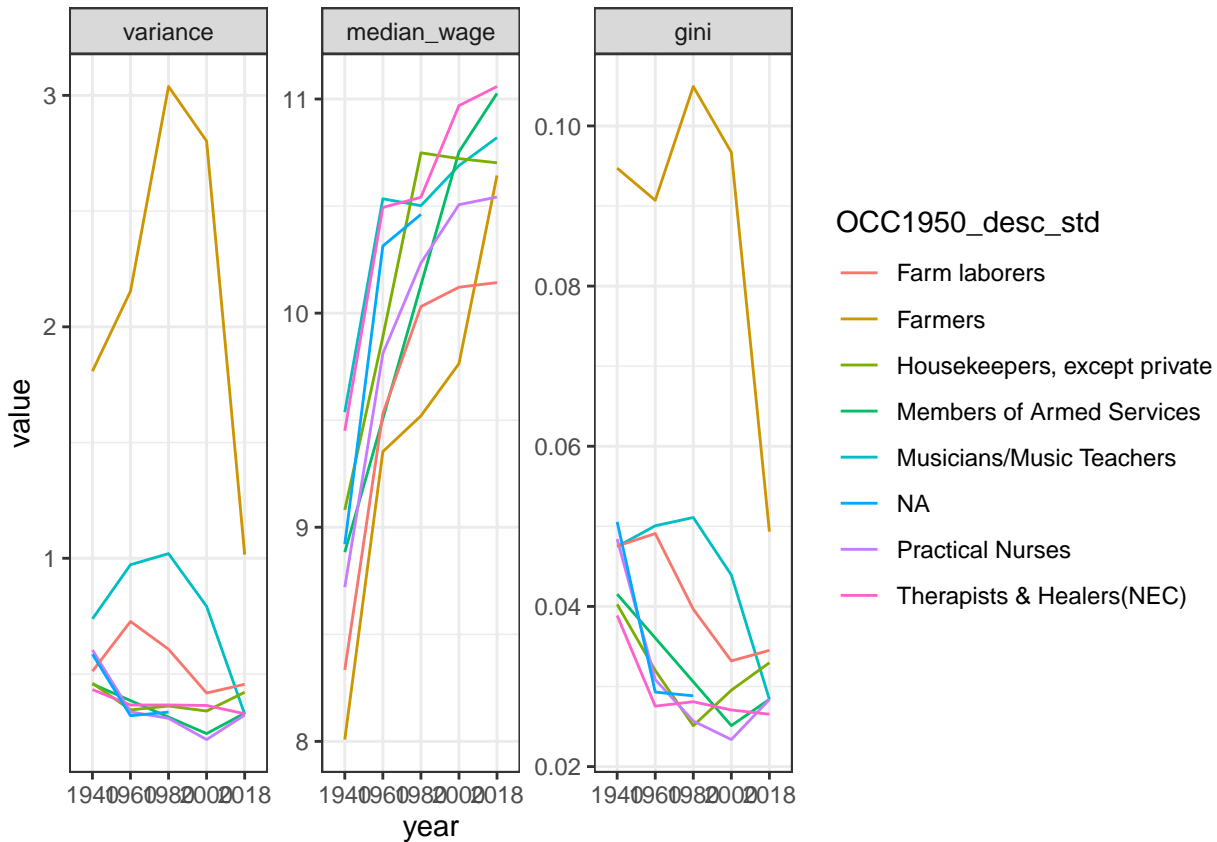
```
# calculate variance by job, year
vars_by_job_year <- census_1940[,.(variance = var(log_incwage),
  median_wage = median(log_incwage),
  gini = DescTools::Gini(log_incwage),
  count = .N), by = .(OCC1950, year)]

vars_by_job_year[,gini_diff := max(gini) - min(gini), by = .(OCC1950)]
vars_by_job_year[, median_count := median(count[year <= 2000]), by = .(OCC1950)]

# merge on desc
temp <- data.table(OCC1950 =as.character(c(57, 97, 100, 595, 764, 781, 820, 999)), OCC1950_desc_std = c
```

```
vars_by_job_year <- merge(vars_by_job_year, temp)

# plot
vars_by_job_year %>% melt(., id.vars = c("OCC1950_desc_std", "OCC1950", "year")) %>%
  .[variable %like%"var|wage|^gini$"] %>%
  ggplot(.) +
    geom_line(aes(x = year, y = value, group = OCC1950, color = OCC1950_desc_std)) +
    facet_wrap(~variable, scales = "free_y")
```



Decreased equality

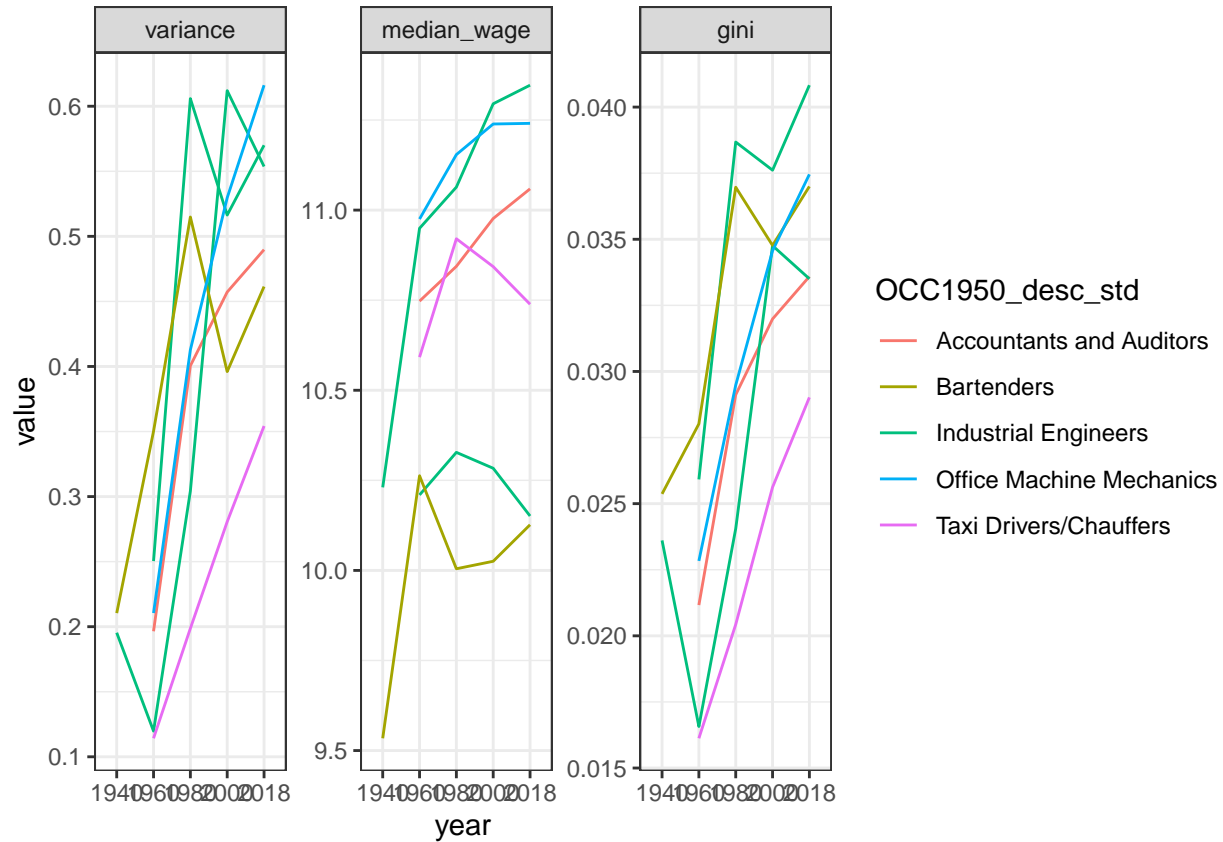
```
# calculate variance by job, year
vars_by_job_year <- census_1940[,.(variance = var(log_incwage),
  median_wage = median(log_incwage),
  gini = DescTools::Gini(log_incwage),
  count = .N), by = .(OCC1950, year)]

vars_by_job_year[,gini_diff := gini[year == min(year)] - gini[year == max(year)], by = .(OCC1950)]
vars_by_job_year[, median_count := median(count[year <= 2000]), by = .(OCC1950)]
vars_by_job_year <- vars_by_job_year[gini_diff < -0 & median_count > 500]

# merge on desc
temp <- data.table(OCC1950 =as.character(c(45, 750, 0, 81, 551, 682)), OCC1950_desc_std = c("Industrial",
  "Agriculture", "Service", "Healthcare", "Education", "Arts and Entertainment", "Government", "Manufacturing"))

vars_by_job_year <- merge(vars_by_job_year, temp)
```

```
# plot
vars_by_job_year %>% melt(., id.vars = c("OCC1950_desc_std", "OCC1950", "year")) %>%
  .[variable %like%"var|wage|^gini$"] %>%
  ggplot(.) +
    geom_line(aes(x = year, y = value, group = OCC1950, color = OCC1950_desc_std)) +
    facet_wrap(~variable, scales = "free_y")
```



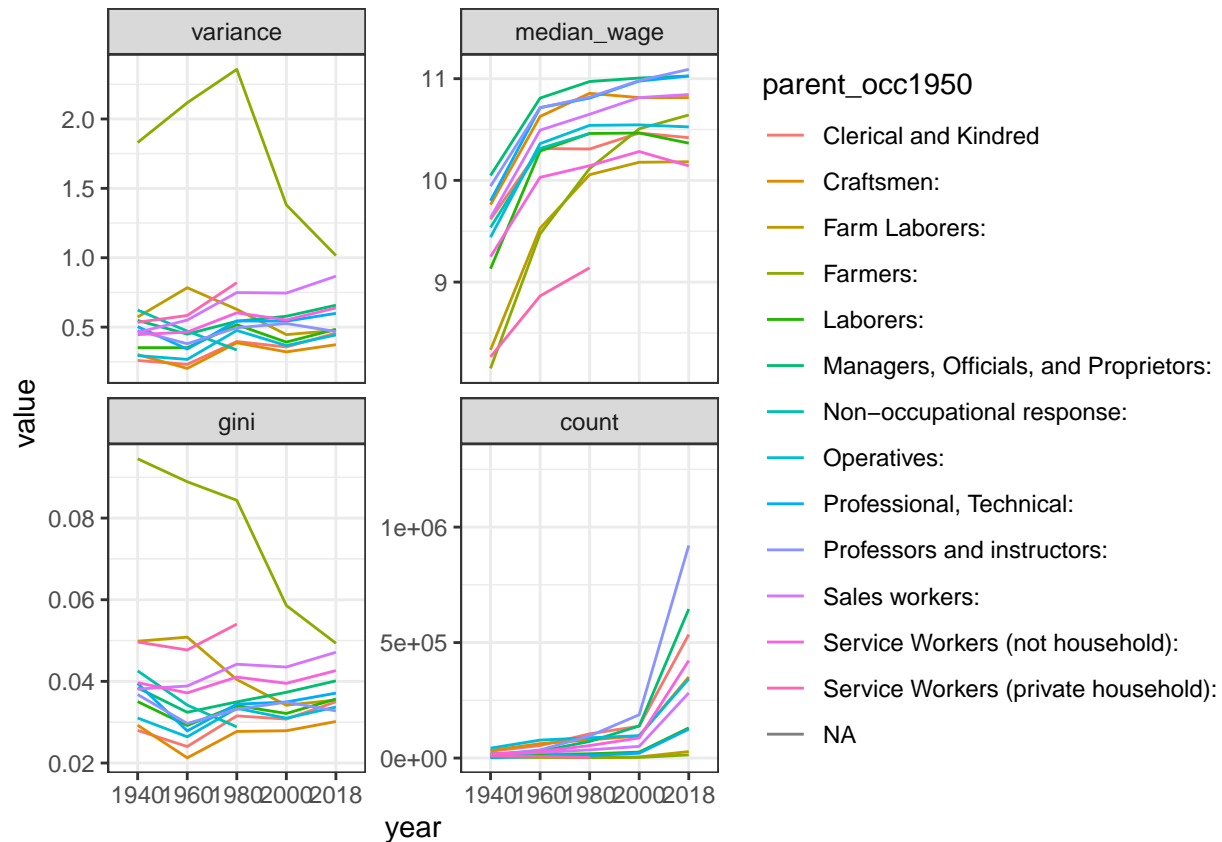
Aggregate up to less granular job titles using census hierarchy and repeat

```
# create crosswalk for this
base_xwalk <- read_excel("../ref/Census_integrated_occ_crosswalks.xlsx") %>% data.table()
base_xwalk <- base_xwalk[,.(OCC1950, `Occupation category description`)]
base_xwalk[OCC1950 == "#",parent_occ1950 := `Occupation category description`]
for(i in 2:nrow(base_xwalk)){
  if (is.na(base_xwalk[i, parent_occ1950])){
    base_xwalk[i, parent_occ1950 := base_xwalk[i-1, parent_occ1950]]
  }
}

census_1940 <- merge(census_1940, unique(base_xwalk[OCC1950 != "#",.(OCC1950, parent_occ1950)]), by = "OCC1950")

# calculate variance by job, year
vars_by_job_year <- census_1940[,.(variance = var(log_incwage),
  median_wage = median(log_incwage),
  gini = DescTools::Gini(log_incwage),
  count = .N), by = .(parent_occ1950, year)]
```

```
# plot
vars_by_job_year %>% melt(., id.vars = c("parent_occ1950", "year")) %>%
ggplot(.) +
  geom_line(aes(x = year, y = value, group = parent_occ1950, color = parent_occ1950)) +
  facet_wrap(~variable, scales = "free_y")
```



Characterize within and between occupation heterogeneity within each of these groupings

```
temp <- dem_var_gettr2(census_1940, c.by_vars_2 = c("year", "parent_occ1950"))

plot_dt2 <- temp

plot_dt2[, f_stat := (avg_between_var/(k-1))/((avg_within_var)/(N-k))]
plot_dt2[, ms_bw := (avg_between_var/(k-1))]
plot_dt2[, ms_wi := (avg_within_var/(N-k))]

plot_dt2[, within_perc :=
  avg_within_var/
  (avg_within_var+avg_between_var)]
plot_dt2[, between_perc :=
```

```

      avg_between_var /
      (avg_within_var + avg_between_var)]
plot_dt2[, bw_wi_perc_ratio := between_perc / within_perc]
plot_dt2[, total_var := avg_total_var / N]
plot_dt2[, within_var := avg_within_var / N]
plot_dt2[, between_var := avg_between_var / N]

# cast long
plot_dt2_long <- melt(plot_dt2, id.vars = c("year",
                                           "grouping",
                                           "parent_occ1950"),
                     measure.vars = c("within_perc",
                                       "between_perc",
                                       "between_var",
                                       "bw_wi_perc_ratio",
                                       "total_var",
                                       "within_var",
                                       "ms_wi",
                                       "ms_bw"))

gg2 <- ggplot(plot_dt2_long[variable %like% "between_perc|total_var|within_var|between_var" & grouping == "between_var"],
             aes(x = year, y = value,
                 color = parent_occ1950, group = parent_occ1950)) +
  facet_wrap(~variable, scales = "free") +
  labs(x = "Year", y = "Value",
       title = "Heterogeneity Explained Within Census Category by Occupation"
  )

```

Repeat by education

```

census_1940[as.numeric(educ) %in% 0:7, ed := "Less than High School"]
census_1940[as.numeric(educ) %in% 8:10, ed := "Some College"]
census_1940[as.numeric(educ) %in% 11, ed := "4-Year Degree"]
census_1940[as.numeric(educ) %in% 12, ed := "Post-Bachelors"]
census_1940[, ed := factor(ed, levels = c("Less than High School", "Some College", "4-Year Degree", "Post-Bachelors"))]

temp <- dem_var_gettr2(census_1940, c.by_vars_2 = c("year", "parent_occ1950", "ed"))

plot_dt2 <- temp

plot_dt2[, f_stat := (avg_between_var / (k-1)) / ((avg_within_var) / (N-k))]
plot_dt2[, ms_bw := (avg_between_var / (k-1))]
plot_dt2[, ms_wi := (avg_within_var / (N-k))]

plot_dt2[, within_perc :=
  avg_within_var /
  (avg_within_var + avg_between_var)]
plot_dt2[, between_perc :=
  avg_between_var /

```



```

      (avg_within_var+avg_between_var)]
plot_dt2[, bw_wi_perc_ratio := between_perc/within_perc]
plot_dt2[, total_var := avg_total_var/N]
plot_dt2[, within_var := avg_within_var/N]
plot_dt2[, between_var := avg_between_var/N]

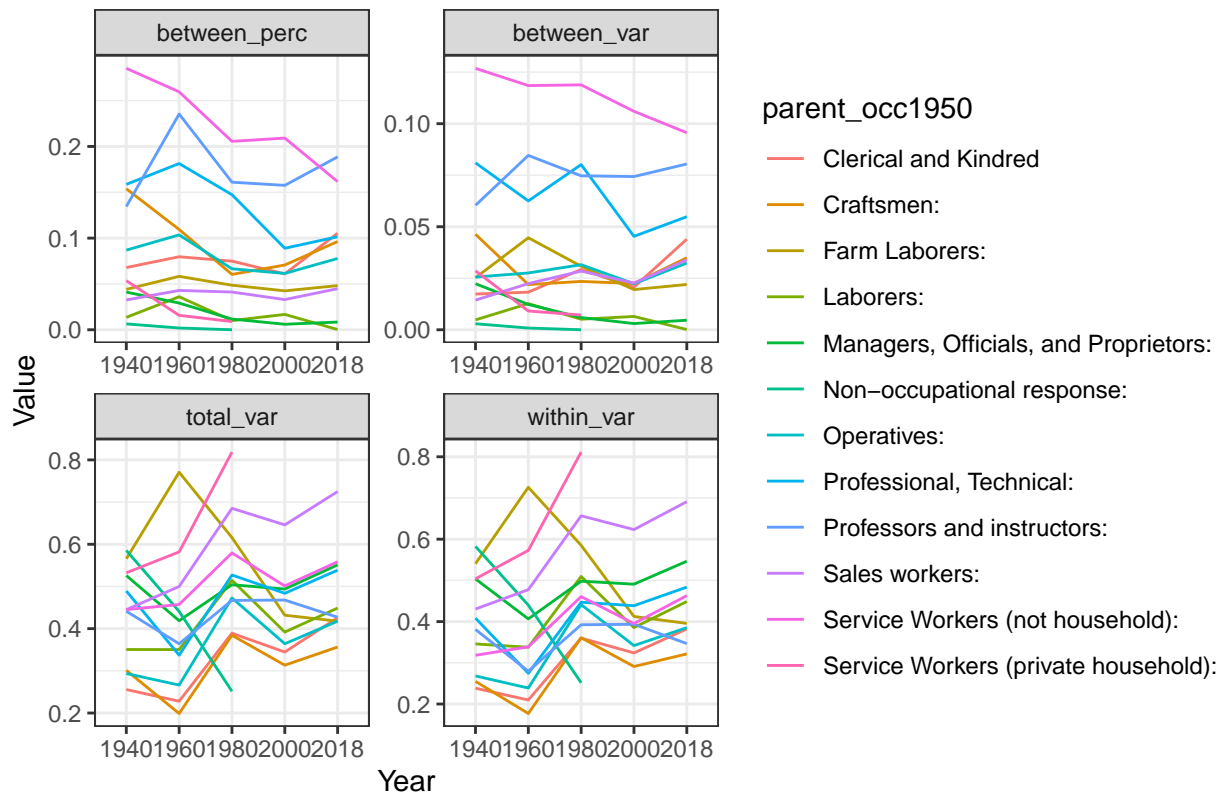
# cast long
plot_dt3_long <- melt(plot_dt2, id.vars = c("year",
                                           "grouping",
                                           "parent_occ1950",
                                           "ed",
                                           "N"),
                      measure.vars = c("within_perc",
                                       "between_perc",
                                       "between_var",
                                       "bw_wi_perc_ratio",
                                       "total_var",
                                       "within_var",
                                       "ms_wi",
                                       "ms_bw"))

plot_dt3_long <- plot_dt3_long[,.(value = weighted.mean(value, N)), by = .(year, grouping, parent_occ1950)]

#merge on dataset that didn't control for ed
setnames(plot_dt2_long, "value", "value_uncontrolled")
plot_dt3_long <- merge(plot_dt3_long, plot_dt2_long)
plot_dt3_long[, value_ratio := value/value_uncontrolled]

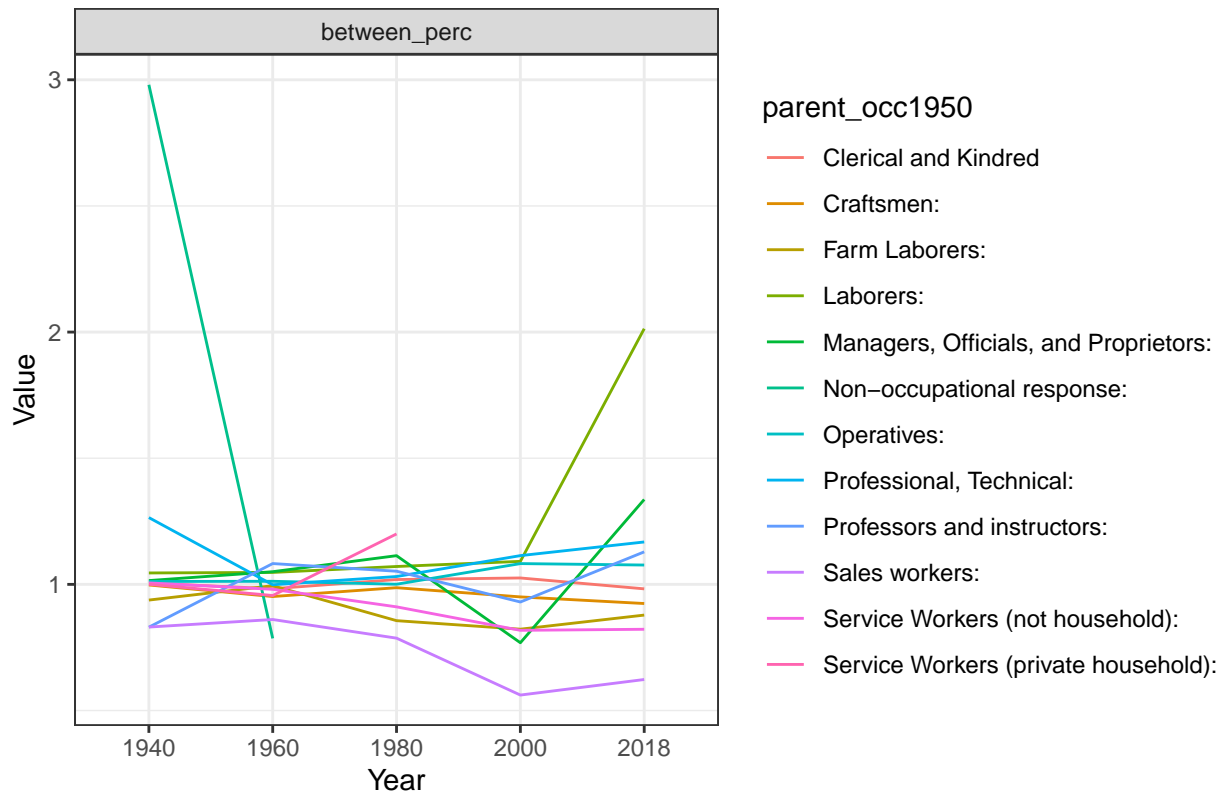
gg3 <- ggplot(plot_dt3_long[variable %like% "between_perc|total_var|within_var|between_var" & grouping == "N"],
              geom_line(aes(x = year, y = value,
                           color = parent_occ1950, group = parent_occ1950))+
              facet_wrap(~variable, scales = "free")+
              labs(x = "Year", y = "Value",
                   title = "")
              )
print(gg3)

```



```
gg4 <- ggplot(plot_dt3_long[variable %like% "between_perc" & grouping == "Occupation" & parent_occ1950
  geom_line(aes(x = year, y = value_ratio,
    color = parent_occ1950, group = parent_occ1950)))+
  facet_wrap(~variable, scales = "free")+
  labs(x = "Year", y = "Value",
    title = "Attenuation of Explained Variance When Controlling for Education"
  )
print(gg4)
```

Attenuation of Explained Variance When Controlling for Education



See which occupations adding industry helps explain variation

```
temp <- dem_var_gettr2(census_1940, c.by_vars_2 = c("year", "OCC1950"))

plot_dt2 <- temp

plot_dt2[, f_stat := (avg_between_var/(k-1))/((avg_within_var)/(N-k))]
plot_dt2[, ms_bw := (avg_between_var/(k-1))]
plot_dt2[, ms_wi := (avg_within_var/(N-k))]

plot_dt2[, within_perc :=
  avg_within_var/
  (avg_within_var+avg_between_var)]
plot_dt2[, between_perc :=
  avg_between_var/
  (avg_within_var+avg_between_var)]
plot_dt2[, bw_wi_perc_ratio := between_perc/within_perc]
plot_dt2[, total_var := avg_total_var/N]
plot_dt2[, within_var := avg_within_var/N]
plot_dt2[, between_var := avg_between_var/N]

# cast long
plot_dt2_long <- melt(plot_dt2, id.vars = c("year",
                                             "grouping",
```

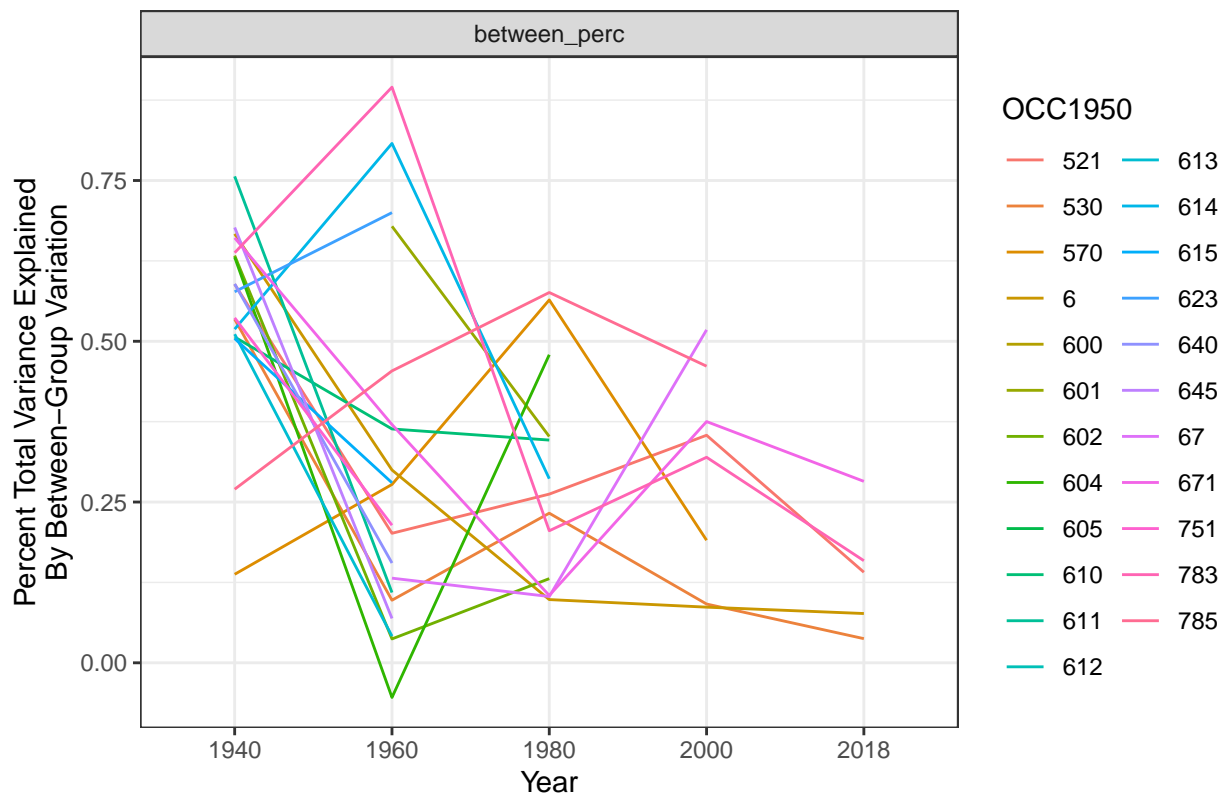
```

        "OCC1950"),
        measure.vars = c("within_perc",
                          "between_perc",
                          "between_var",
                          "bw_wi_perc_ratio",
                          "total_var",
                          "within_var",
                          "ms_wi",
                          "ms_bw"))
plot_dt2_long[variable %like% "between_perc" & grouping == "Industry" & value > .5, unique(OCC1950)] ->
gg2 <- ggplot(plot_dt2_long[variable %like% "between_perc" & grouping == "Industry" & OCC1950 %in% temp,
                           geom_line(aes(x = year, y = value,
                                           color = OCC1950, group = OCC1950)) +
                           facet_wrap(~variable) +
                           labs(x = "Year", y = "Percent Total Variance Explained\nBy Between-Group Variation",
                                title = "Results using xwalked OCC and 1950IND"
                                )
                           )

print(gg2)

```

Results using xwalked OCC and 1950IND



```
census_1940[OCC1950 %in% temp, .(OCC1950, OCC1950_desc)] %>% unique()
```

##	OCC1950	OCC1950_desc
## 1:	521	Engravers, except photoengravers
## 2:	530	Glaziers
## 3:	570	Pattern and model makers, except paper
## 4:	570	<NA>

##	5:	6	Authors
##	6:	600	Apprentice auto mechanics
##	7:	601	Apprentice bricklayers and masons
##	8:	602	Apprentice carpenters
##	9:	604	Apprentice machinists and toolmakers
##	10:	604	<NA>
##	11:	605	Apprentice mechanics, except auto
##	12:	610	Apprentice plumbers and pipe fitters
##	13:	611	Apprentices, building trades (n.e.c.)
##	14:	612	Apprentices, metalworking trades (n.e.c.)
##	15:	612	<NA>
##	16:	613	Apprentices, printing trades
##	17:	614	Apprentices, other specified trades
##	18:	615	Apprentices, trade not specified
##	19:	623	Boatmen, canalmen, and lock keepers
##	20:	640	Fruit, nut, and vegetable graders, and packers, except factory
##	21:	645	Milliners
##	22:	67	Mathematicians
##	23:	671	Photographic process workers
##	24:	751	Bootblacks
##	25:	783	Ushers, recreation and amusement
##	26:	785	Watchmen (crossing) and bridge tenders
##	27:	785	<NA>
##		OCC1950	OCC1950_desc