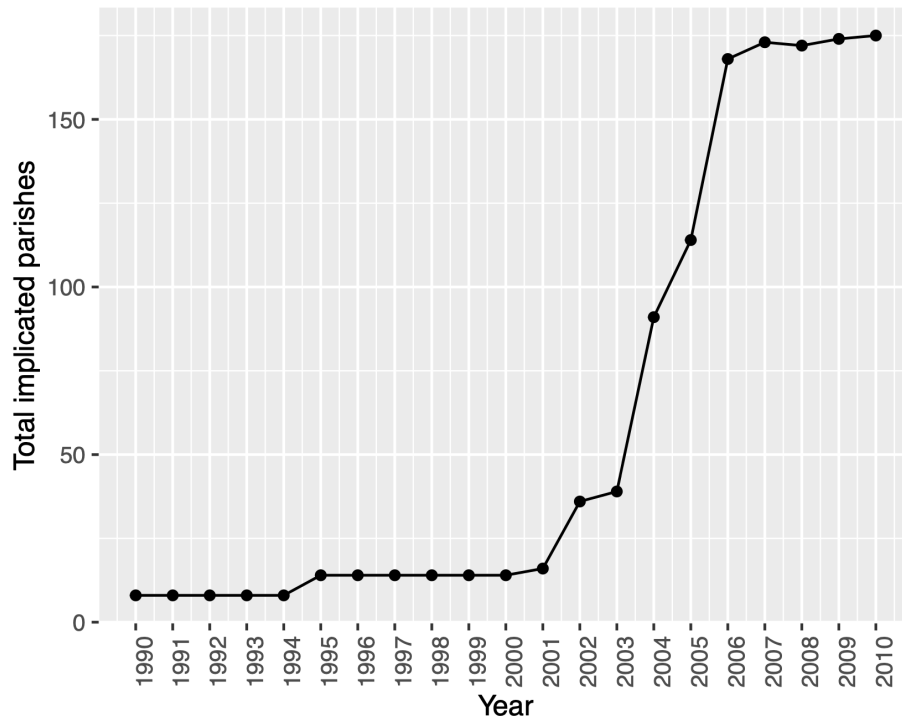


## ONLINE SUPPLEMENT

### The Relative Effects of a Scandal on Member Engagement in Rites of Integration and Rites of Passage: Evidence from a Child Abuse Scandal in the Catholic Archdiocese of Philadelphia

Figure A.1: Cumulative number of treated parishes



**Table A.1: Mean comparison tests**

| Variable                              | Mean values in 2003                                  |   |                          |
|---------------------------------------|--|---|--------------------------|
|                                       | Control parishes<br>(n = 63), not<br>treated by 2007 | Treated parishes<br>(n = 134), treated<br>between 2004-2007 | p-value of<br>difference |
| Rites of passage                      | 105.8571   | 133.3955  | 0.0206                   |
| Rites of integration                  | 1163.6030  | 1430.3410   | 0.0951                   |
| Organizational age                    | 0.4127   | 0.5373  | 0.1038                   |
| Organizational size (# members), '00s | 43.6886  | 50.0205   | 0.2163                   |
| Scandal pervasiveness                 | 0.1938   | 0.1457  | 0.0869                   |
| Local population, '00s                | 44.5161  | 42.0739   | 0.2589                   |
| Religious adherents (county), %       | 0.6802   | 0.6706  | 0.4779                   |
| Income per capita (county), '000s     | 41.0212  | 39.3512   | 0.2654                   |
| White population (county), %          | 0.7318   | 0.6975  | 0.2605                   |

The sample is limited to parishes that in 2003 had not yet been associated with an accused priest (197 parishes). By 2007 134 of these parishes were implicated in scandal (“treated” parishes), and 63 remained unimplicated (“control” parishes).

**Table A.2: Robustness test using the 2005 Grand Jury report as an exogenous shock**

| Variable   | Model 1               |                      | Chi-squared test (H1) | Model 2               |                      | Chi-squared test (H2) |
|--|-----------------------|----------------------|-----------------------|-----------------------|----------------------|-----------------------|
|  | Rites of passage      | Rites of integration |                       | Rites of passage      | Rites of integration |                       |
| Implication in scandal                             | -0.0658 ***<br>0.0003 | 0.0068<br>0.7332     | 7.8286 **<br>0.0026   | -0.0403<br>0.2403     | 0.0568<br>0.1323     |                       |
| Implication in scandal × Scandal pervasiveness     |                       |                      |                       | -0.0441<br>0.3958     | -0.0834<br>0.1443    | 0.2756<br>0.2998      |
| Implication in scandal × Organizational age        |                       |                      |                       |                       |                      |                       |
| Implication in scandal × Organizational size, '00s |                       |                      |                       |                       |                      |                       |
| Scandal pervasiveness                              | 0.0062 ***<br>0.0000  | 0.0209 ***<br>0.0000 |                       | 0.0061 ***<br>0.0000  | 0.0207 ***<br>0.0000 |                       |
| Organizational size (# members), '00s              |                       |                      |                       | -0.0011<br>0.9798     | -0.0448<br>0.3392    |                       |
| Local population, '00s                             | 0.0341 ***<br>0.0000  | 0.0164 **<br>0.0095  |                       | 0.0340 ***<br>0.0000  | 0.0159 *<br>0.0118   |                       |
| Religious adherents (county), %                    | -6.0007 ***<br>0.0000 | -2.6152 †<br>0.0583  |                       | -6.1080 ***<br>0.0000 | -2.9169 *<br>0.0350  |                       |
| Income per capita (county), '000s                  | 0.0025<br>0.6984      | 0.0064<br>0.3720     |                       | 0.0023<br>0.7274      | 0.0058<br>0.4189     |                       |
| White population (county), %                       | 7.9110 **<br>0.0011   | 0.4127<br>0.8767     |                       | 7.8490 **<br>0.0012   | 0.1034<br>0.9690     |                       |
| Constant   | -0.9366<br>0.3529     | 0.4450<br>0.6887     |                       | -0.8346<br>0.4130     | 0.7990<br>0.4759     |                       |
| Parish fixed effects                               | Yes                   | Yes                  |                       | Yes                   | Yes                  |                       |
| Year fixed effects                                 | Yes                   | Yes                  |                       | Yes                   | Yes                  |                       |
| R <sup>2</sup>                                     | 0.9680                | 0.9708               |                       | 0.9680                | 0.9710               |                       |
| N  | 984                   | 984                  |                       | 984                   | 984                  |                       |

Note: † $p < 0.10$ ; \* $p < 0.05$ ; \*\* $p < 0.01$ ; \*\*\* $p < 0.001$ ;  $p$ -values reported below coefficients

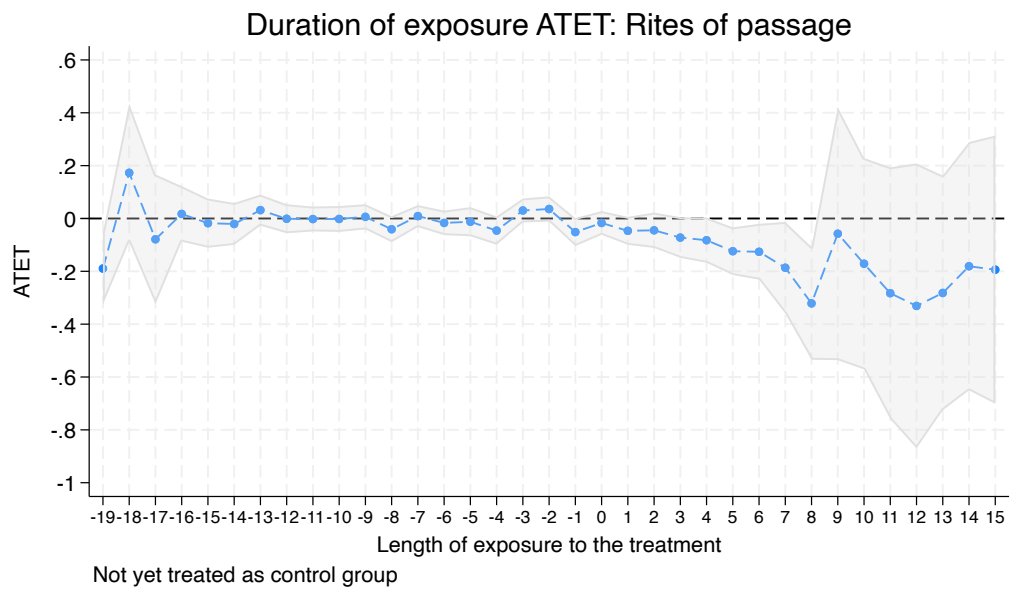
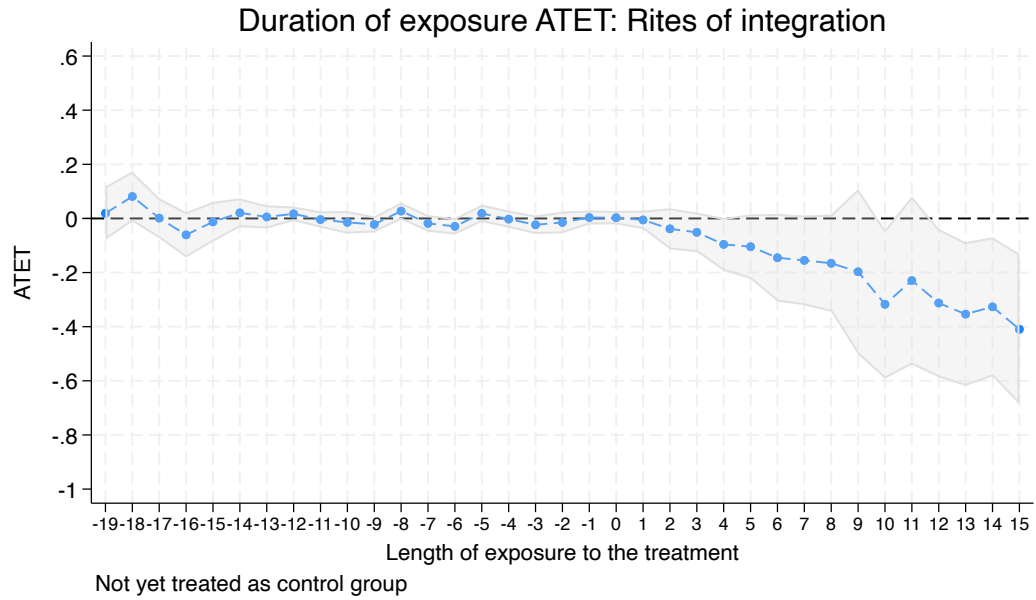
Sample of parish-years (2003-2007) using publication of the Grand Jury report as exogenous shock. Mirrors full sample analysis report in the paper. See Table R5 above for comparison of “treated” and “control” parishes in 2003 before any were treated.

**Table A.2 (continued): Robustness test using the 2005 Grand Jury report as an exogenous shock**

| Variable   | Model 3          |  |                      | Chi-squared test (H3) | Model 4          |  |                      | Chi-squared test (H4) |
|--|------------------|--|----------------------|-----------------------|------------------|--|----------------------|-----------------------|
|  | Rites of passage |  | Rites of integration |                       | Rites of passage |  | Rites of integration |                       |
| Implication in scandal                             | -0.0955 ***      |  | -0.0327              |                       | 0.0702 **        |  | 0.0392               |                       |
|  | 0.0000           |  | 0.1901               |                       | 0.0068           |  | 0.1806               |                       |
| Implication in scandal × Scandal pervasiveness     |                  |  |                      |                       |                  |  |                      |                       |
| Implication in scandal × Organizational age        | 0.0567 *         |  | 0.0753 **            | 0.2376                |                  |  |                      |                       |
|  | 0.0318           |  | 0.0096               | 0.3130                |                  |  |                      |                       |
| Implication in scandal × Organizational size, '00s |                  |  |                      |                       | -0.0027 ***      |  | -0.0007              | 13.7166 ***           |
|  |                  |  |                      |                       | 0.0000           |  | 0.1320               | 0.0001                |
| Scandal pervasiveness                              | 0.0059 ***       |  | 0.0205 ***           |                       | 0.0067 ***       |  | 0.0210 ***           |                       |
|  | 0.0000           |  | 0.0000               |                       | 0.0000           |  | 0.0000               |                       |
| Organizational size (# members), '00s              |                  |  |                      |                       |                  |  |                      |                       |
| Local population, '00s                             | 0.0339 ***       |  | 0.0162 *             |                       | 0.0282 ***       |  | 0.0150 *             |                       |
|  | 0.0000           |  | 0.0103               |                       | 0.0000           |  | 0.0188               |                       |
| Religious adherents (county), %                    | -5.8778 ***      |  | -2.4521 †            |                       | -4.2749 ***      |  | -2.2038              |                       |
|  | 0.0000           |  | 0.0751               |                       | 0.0006           |  | 0.1171               |                       |
| Income per capita (county), '000s                  | 0.0023           |  | 0.0061               |                       | 0.0029           |  | 0.0065               |                       |
|  | 0.7285           |  | 0.3976               |                       | 0.6535           |  | 0.3657               |                       |
| White population (county), %                       | 7.6519 **        |  | 0.0687               |                       | 6.7446 **        |  | 0.1347               |                       |
|  | 0.0015           |  | 0.9793               |                       | 0.0043           |  | 0.9597               |                       |
| Constant   | -0.8854          |  | 0.5129               |                       | -1.2598          |  | 0.3679               |                       |
|  | 0.3788           |  | 0.6432               |                       | 0.2005           |  | 0.7404               |                       |
| Parish fixed effects                               | Yes              |  | Yes                  |                       | Yes              |  | Yes                  |                       |
| Year fixed effects                                 | Yes              |  | Yes                  |                       | Yes              |  | Yes                  |                       |
| R <sup>2</sup>                                     | 0.9681           |  | 0.9710               |                       | 0.9696           |  | 0.9709               |                       |
| N  | 984              |  | 984                  |                       | 984              |  | 984                  |                       |

Note: † $p < 0.10$ ; \* $p < 0.05$ ; \*\* $p < 0.01$ ; \*\*\* $p < 0.001$ ;  $p$ -values reported below coefficients

Figure A.2: Dynamic treatment effect plots for each of the two dependent variables.



**Table A.3: ATETs for two independent heterogenous treatment difference-in-difference models**

| Exposure | ATET difference | Rites of passage |       | Rites of integration |       |
|----------|-----------------|------------------|-------|----------------------|-------|
|          |                 | ATET             | P>z   | ATET                 | P>z   |
| -19      | -0.209          | -0.189           | 0.006 | 0.019                | 0.703 |
| -18      | 0.094           | 0.175            | 0.192 | 0.081                | 0.087 |
| -17      | -0.083          | -0.084           | 0.496 | -0.001               | 0.986 |
| -16      | 0.076           | 0.015            | 0.779 | -0.060               | 0.161 |
| -15      | -0.002          | -0.022           | 0.654 | -0.020               | 0.594 |
| -14      | -0.039          | -0.015           | 0.704 | 0.024                | 0.410 |
| -13      | 0.035           | 0.036            | 0.248 | 0.001                | 0.970 |
| -12      | -0.039          | -0.007           | 0.807 | 0.032                | 0.056 |
| -11      | 0.011           | 0.012            | 0.661 | 0.001                | 0.961 |
| -10      | 0.004           | 0.001            | 0.970 | -0.003               | 0.884 |
| -9       | 0.020           | 0.007            | 0.782 | -0.013               | 0.397 |
| -8       | -0.044          | -0.028           | 0.260 | 0.015                | 0.322 |
| -7       | 0.008           | -0.006           | 0.803 | -0.014               | 0.393 |
| -6       | 0.012           | -0.016           | 0.522 | -0.028               | 0.089 |
| -5       | -0.035          | -0.017           | 0.567 | 0.018                | 0.307 |
| -4       | -0.049          | -0.055           | 0.043 | -0.006               | 0.725 |
| -3       | 0.044           | 0.024            | 0.365 | -0.019               | 0.262 |
| -2       | 0.038           | 0.017            | 0.507 | -0.021               | 0.313 |
| -1       | -0.033          | -0.033           | 0.205 | 0.000                | 0.994 |
| 0        | -0.020          | -0.024           | 0.331 | -0.004               | 0.843 |
| 1        | -0.037          | -0.052           | 0.045 | -0.015               | 0.527 |
| 2        | 0.006           | -0.040           | 0.250 | -0.045               | 0.270 |
| 3        | -0.023          | -0.078           | 0.047 | -0.056               | 0.149 |
| 4        | 0.016           | -0.083           | 0.060 | -0.099               | 0.053 |
| 5        | -0.019          | -0.131           | 0.006 | -0.111               | 0.067 |
| 6        | 0.018           | -0.132           | 0.016 | -0.150               | 0.065 |
| 7        | -0.054          | -0.216           | 0.020 | -0.162               | 0.051 |
| 8        | -0.167          | -0.342           | 0.003 | -0.175               | 0.051 |
| 9        | 0.065           | -0.133           | 0.631 | -0.198               | 0.222 |
| 10       | -0.011          | -0.317           | 0.182 | -0.306               | 0.030 |
| 11       | -0.088          | -0.312           | 0.214 | -0.224               | 0.181 |
| 12       | -0.020          | -0.355           | 0.199 | -0.335               | 0.023 |
| 13       | 0.088           | -0.296           | 0.189 | -0.384               | 0.008 |
| 14       | 0.129           | -0.226           | 0.350 | -0.355               | 0.008 |
| 15       | 0.216           | -0.194           | 0.454 | -0.409               | 0.004 |

Note that only 3% of parishes are observed 15 time periods after treatment.

## R Code for Section: Simulations Based on Individual- and Organizational-Level Assumptions

```
# Simulation code for:
# "The Relative Effects of a Scandal on Member Engagement in Rites of Integration and
Rites of Passage: Evidence from a Child Abuse Scandal in the Catholic Archdiocese of
Philadelphia"

library(data.table)
library(ggplot2)
library(scales)
library(gridExtra)

# Input:
# number of core and number of peripheral members at org (ratio)
# core members' likelihood to engage in rites of passage pre-scandal
# core members' likelihood to engage in rites of integration pre-scandal
# peripheral members' likelihood to engage in rites of passage pre-scandal
# peripheral members' likelihood to engage in rites of integration pre-scandal
# reaction of core members to the scandal
# reaction of peripheral members to the scandal
# post-scandal likelihood to engage in each type of rite for each type of member

# Output:
# the decrease in engagement in rites of passage / decrease in engagement in rites of
integration as result of scandal

# Set starting points using member engagement baselines from Table 1 in the paper.
# Note however that these values are irrelevant to the main simulation results
because the outcome is a *relative* change.
avg_member_count <- 4677 # average parish membership size
avg_rites_integration <- 1366.74
avg_rites_passage <- 128.11
baseline_prob_rites_passage <- avg_rites_passage/avg_member_count

main_sim <- function(sim_count, core_scandal_drop_random) {
  # Org-level storage of simulation output
  org_panel <- data.table(core_member_pct = numeric(), # parish-level % core members
                        core_scandal_drop = numeric(),
                        pre_rites_integration_total = numeric(), # total simulated
engagement in rites of integration pre-scandal
                        pre_rites_passage_total = numeric(), # total simulated
engagement in rites of passage pre-scandal
                        post_rites_integration_total = numeric(), # total simulated
engagement in rites of integration post-scandal
                        post_rites_passage_total = numeric()) # # total simulated
engagement in rites of passage post-scandal

  for(x in 1:sim_count) {

    ### STEP 0
    # Create a single simulated org
    simorg <- data.table(agent_ID=1:avg_member_count)

    # Define org-level parameters
    # Importance of rites of passage to each type of member:
```

```

core_passage_meaning <- 0.98 # meaning inputs are based on CARA, 2008 survey
periph_passage_meaning <- 0.815 # average number of baptisms and marriages from
CARA, 2008 survey; potentially conservative, alternatively use 89% which reflects
members who don't go less than weekly
# Effect of scandal on each type of member:
if(core_scandal_drop_random == T) {
  core_scandal_drop <- sample(c(.05, .10, .20, .25, .3), 1)
} else {
  core_scandal_drop <- 0.15 # 15% of core members (i.e., people that said they
attended mass at least weekly) went to mass less often because of scandal (Pew, 2019)
}
peripheral_scandal_drop <- 0.32 # 32% of peripheral members (i.e., people that
said they rarely attend mass) went to mass less often (Pew, 2019)

# Variables at the org level to examine sensitivity of assumptions
# Percent core/peripheral members in the org
core_member_pct <- runif(1, min = 0.01, max = .99) # 1% to 99% core members
# Peripheral member likelihood of engagement in rites of integration
peripheral_pre_rites_integration <- 6/52 # peripheral members engage in rites of
integration once every-other month

### STEP 1: Define different types of members
simorg[, member_type := as.character(rbinom(.I, 1, core_member_pct))]
simorg[member_type == 1]$member_type <- "core"
simorg[member_type == 0]$member_type <- "peripheral"

### STEP 2: Calculate member's *pre-scandal* engagement choices

# Likelihood of engaging in a rite of integration, pre-scandal
simorg[member_type == "core",
  pre_rites_integration := rbinom(.N, 1, 1)]
simorg[member_type == "peripheral",
  pre_rites_integration := rbinom(.N, 1,
peripheral_pre_rites_integration)]

# Likelihood of engaging in a rite of passage, pre-scandal
simorg[, pre_rites_passage := integer()]
simorg[member_type == "core",
  pre_rites_passage := rbinom(.N, 1, core_passage_meaning *
baseline_prob_rites_passage)]
simorg[member_type == "peripheral",
  pre_rites_passage := rbinom(.N, 1, periph_passage_meaning *
baseline_prob_rites_passage)]

### STEP 3 Calculate member's *post-scandal* engagement choices
simorg[, post_rites_integration := integer()]
simorg[, post_rites_passage := integer()]

# Likelihood of engaging in a rite of integration, post-scandal
simorg[member_type == "core",
  post_rites_integration := rbinom(.N, 1, (1 - core_scandal_drop))]
simorg[member_type == "peripheral",
  post_rites_integration := rbinom(.N, 1, (peripheral_pre_rites_integration
* (1-peripheral_scandal_drop)))]

```



```

# Likelihood of engaging in a rite of passage, post-scandal; highlighting
multiple scenarios
  simorg[member_type == "core",
    post_rites_passage := rbinom(.N, 1, core_passage_meaning *
baseline_prob_rites_passage * (1-core_scandal_drop))]
  simorg[member_type == "peripheral",
    post_rites_passage := rbinom(.N, 1, periph_passage_meaning *
baseline_prob_rites_passage * (1-peripheral_scandal_drop))]

# Store results
temp <- data.table(core_member_pct,
  core_scandal_drop,
  pre_rites_integration_total = simorg[,
sum(pre_rites_integration)],
  pre_rites_passage_total = simorg[, sum(pre_rites_passage)],
  post_rites_integration_total = simorg[,
sum(post_rites_integration)],
  post_rites_passage_total = simorg[, sum(post_rites_passage)])
org_panel <- rbind(org_panel, temp) # add row to panel
rm(temp, core_member_pct,
  core_passage_meaning, periph_passage_meaning,
  core_scandal_drop, peripheral_scandal_drop)
}

### Calculate total effects
org_panel[, scandal_effect_rites_integration := (post_rites_integration_total-
pre_rites_integration_total)/pre_rites_integration_total]
org_panel[, scandal_effect_rites_passage := (post_rites_passage_total-
pre_rites_passage_total)/pre_rites_passage_total]
org_panel[, relative_drops :=
scandal_effect_rites_passage/scandal_effect_rites_integration]

return(org_panel)
}

##### Run the above simulation code twice, once for each figure:

# For Figure 3a
fig_a_data <- main_sim(sim_count = 5000, core_scandal_drop_random = F)

# For Figure 3b
fig_b_data <- main_sim(sim_count = 25000, core_scandal_drop_random = T)

# Plot of outcomes ratio as function of core member %

# Fig (a)
ggplot(fig_a_data, aes(core_member_pct, relative_drops)) +
  geom_smooth() +
  geom_hline(yintercept = 1, linetype = 'dashed') +
  labs(x = "Pct. core members",
  y = "Drop in rites of passage\nrel to rites of integration",
  caption = paste0("Sim runs: ", prettyNum(nrow(fig_a_data), big.mark = ",")) +
  scale_linetype_manual(values=c(2,3,1,4,5)) +
  theme(text=element_text(family="Times New Roman", size=11)) +
  scale_x_continuous(breaks = c(.01, 0.25, .5, .75, .99)) +

```

```

scale_y_continuous(labels = label_number(accuracy = 0.01))
# ggsave("sim_scenarios_basic.png", width = 6, height = 5, units = "in")

# Fig (b)
ggplot(fig_b_data, aes(core_member_pct, relative_drops)) +
  geom_smooth(aes(color = sprintf("%0.2f", core_scandal_drop), linetype =
sprintf("%0.2f", core_scandal_drop))) +
  geom_hline(yintercept = 1, linetype = 'dashed') +
  labs(x = "Pct. core members",
       y = "Drop in rites of passage\nrel to rites of integration",
       color = "Core members'\nlikelihood of withdrawal\nafter scandal",
       linetype = "Core members'\nlikelihood of withdrawal\nafter scandal",
       caption = paste0("Sim runs: ", prettyNum(nrow(fig_b_data), big.mark = ",")) +
scale_linetype_manual(values=c(2,3,1,4,5)) +
theme(text=element_text(family="Times New Roman", size=11)) +
scale_x_continuous(breaks = c(.01, 0.25, .5, .75, .99)) +
scale_y_continuous(labels = label_number(accuracy = 0.01))
# ggsave("sim_scenarios_core_members.png", width = 6, height = 5, units = "in")

```