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# Why Do Incumbent Senators Win? Evidence from a Dynamic Selection Model

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## Question

- Politicians in office win elections more often than their challengers. For example, incumbent senators win more than 75% of the time. Why?
- We empirically disentangle different sources of incumbency advantage:
  - incumbents improve while in office: **tenure effects**
  - incumbents are by definition winners: **selection effect**
  - incumbents face weaker challengers: **candidate heterogeneity**

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## Previously...

- A vast reduced-form literature
- Focus on House incumbency advantage ( $\sim 90\%$ )
- Deals with selection bias in different ways
  - Sophomore surge (Erikson, 1971, Gelman and King, 1990)
  - Levitt and Wolfram, 1997
- Diermeier, Keane and Merlo (2003) - Samuelson (1987)

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## Our approach

- Estimate parameters of an optimizing dynamic model of voter behavior
- The entire history of a seat matters, not just data on current election
- We allow for tenure effects to be different by tenure, and estimate them separately from selection and the ability of incumbents to scare off weaker challengers

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## Quick intuition (more details later)

Senators **A** , **B** , with tenure of 1 term (i.e. same “tenure effects” )

**A** gained office by winning an **open seat**

**B** beat a **1 term incumbent**

If selection did not matter, these two incumbents would be indistinguishable to the econometrician (same probability of being reelected).

We can look at reelection probabilities of senators with identical tenure but different histories to provide clues about the importance of selection.

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## The model

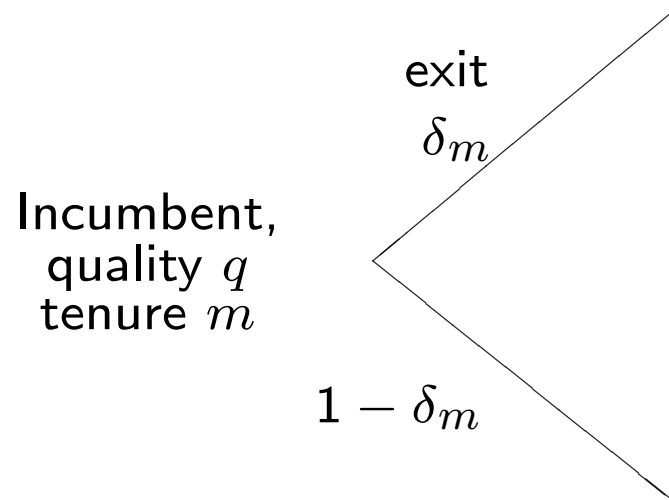
- Homogeneous voters value elected senators' quality. Utility flow:

$$u(q, m) = q + \tau_m$$

- Candidates draw permanent quality  $q \sim F$   
( $F$  identical for all candidates for now)
- Tenure specific effects  $\tau_m$ ,  $m$  = number of terms in office
- Voter observes  $q$  and  $\tau_m$  (econometrician: not)
- Incumbents exit with exogenous probability  $\delta_m$

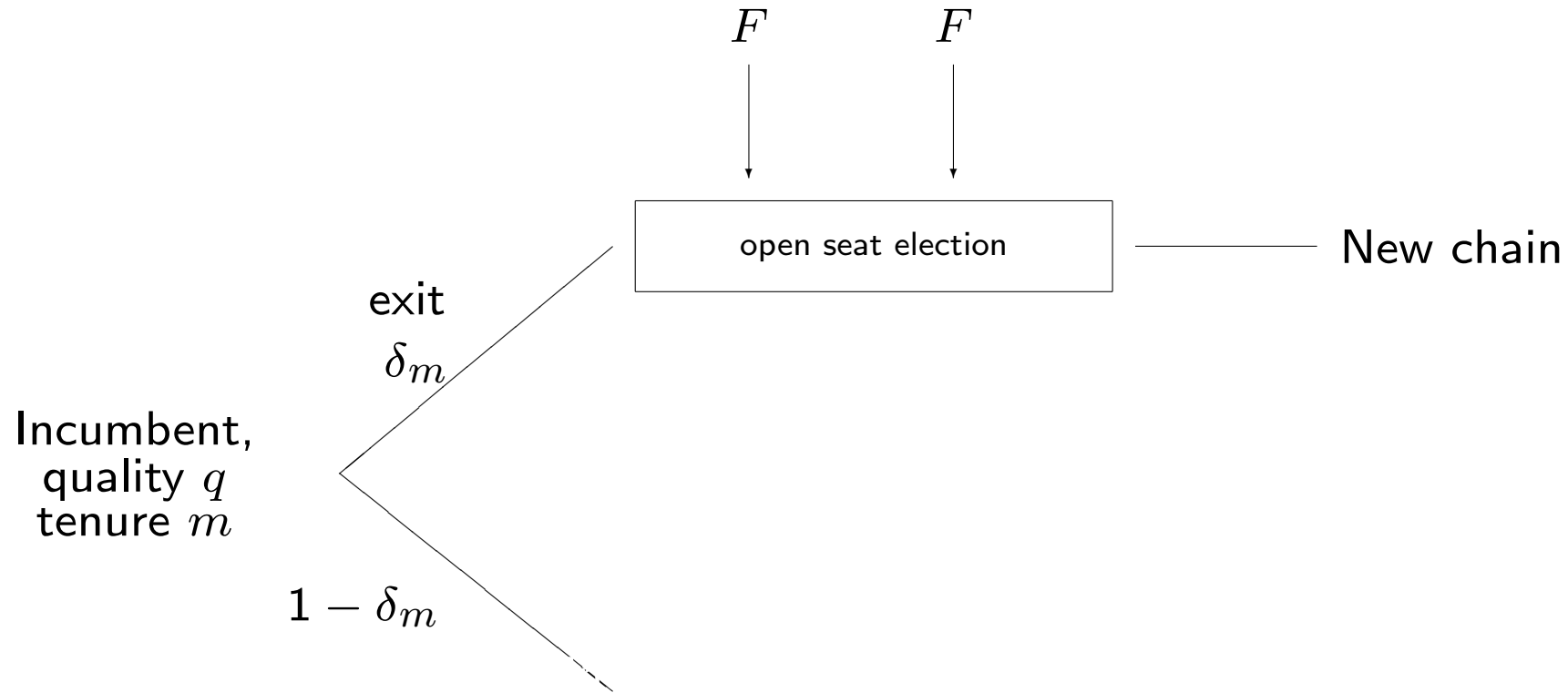
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# Timeline



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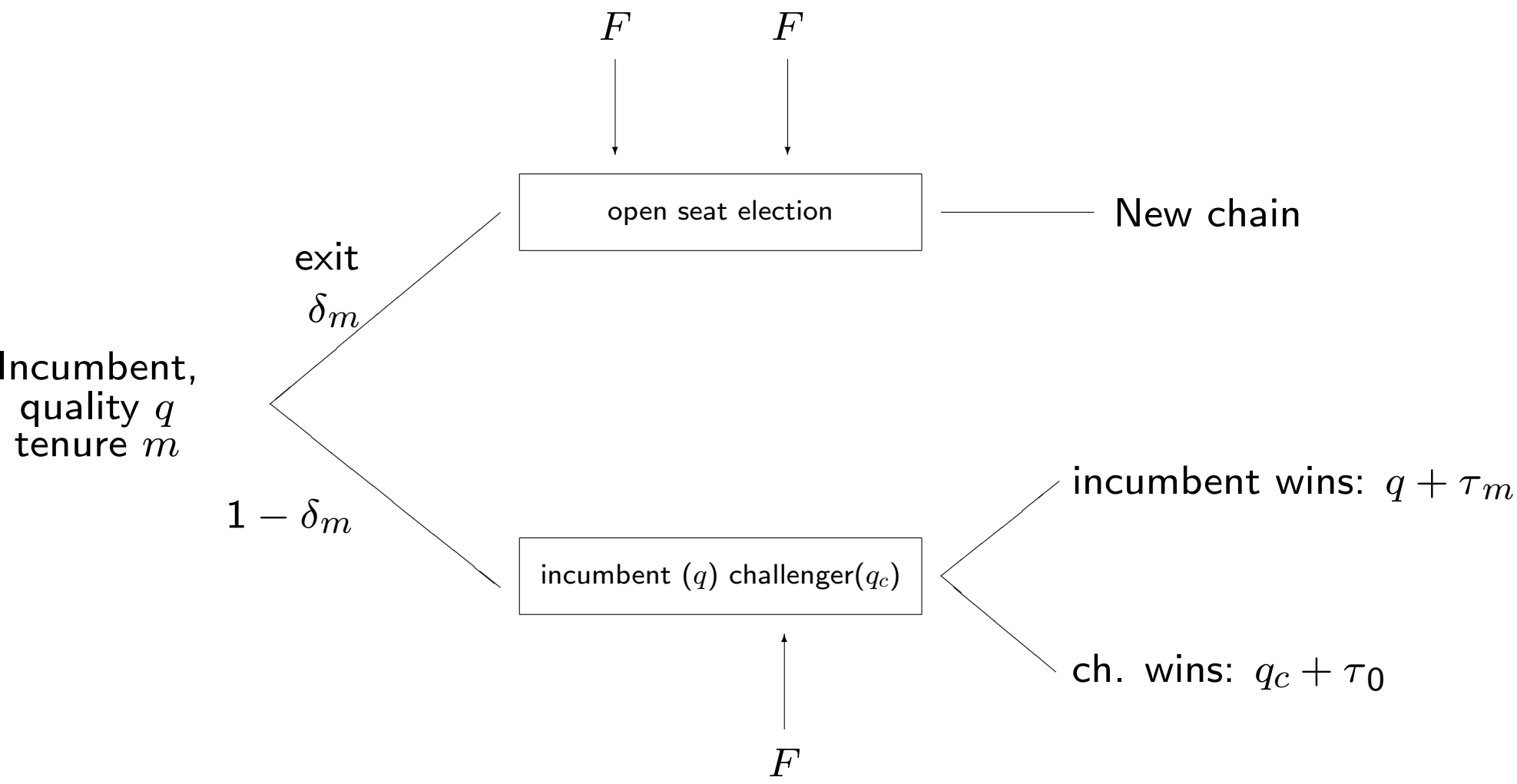
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## The dynamic problem

Bellman Equation: value of incumbent with quality  $q$  and tenure  $m$  :

$$V(q, m) = \delta_m W + (1 - \delta_m) \int_Q \max \left\{ \begin{array}{l} \text{incumbent wins} \\ \uparrow \\ q + \tau_m + \beta V(q, m + 1), \\ \\ q_c + \tau_0 + \beta V(q_c, 1) \\ \downarrow \\ \text{incumbent loses} \end{array} \right\} f(q_c) dq_c$$

$W$  : Value of open seat

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$W$  : Value of open seat

$$W = \int_Q \int_Q \max \left\{ \begin{array}{l} q + \tau_0 + \beta V(q, 1), \\ \\ q_c + \tau_0 + \beta V(q_c, 1) \end{array} \right\} f(q) dq f(q_c) dq_c.$$

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## The simplified problem

Denote decision rule  $\bar{q}(q, m)$ , (cutoff challenger quality)

$$V(q, m) = \delta_m \int_Q V(x, 0) df(x) dx$$

$$+(1 - \delta_m) \max_{\bar{q}} \left( \begin{array}{c} \text{incumbent wins} \\ \uparrow \\ F(\bar{q}) (q + \tau_m + \beta V(q, m + 1)) \\ + \int_{\bar{q}}^{\infty} (q_c + \tau_0 + \beta V(q_c, 1)) df(q_c) dq_c \\ \downarrow \\ \text{incumbent loses} \end{array} \right)$$

$V(x, 0)$  = value of entering an open seat election with one candidate of quality  $x$  (define using  $\delta_0 = 0$ )

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## Allowing for different distribution of challengers

$$F_m = F_o \text{ if } m = 0,$$

$$F_m = F_c \text{ if } m > 0$$

$$V(q, m) = \delta_m \int_Q V(x, 0) df_o(x) dx +$$

$$+(1 - \delta_m) \max_{\bar{q}} \left( \begin{array}{c} \text{incumbent wins} \\ \uparrow \\ F_m(\bar{q}) (q + \tau_m + \beta V(q, m + 1)) \\ + \int_{\bar{q}}^{\infty} (x + \tau_0 + \beta V(x, 1)) df_m(x) dx \\ \downarrow \\ \text{incumbent loses} \end{array} \right)$$

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## Intuition Revisited: history matters

Two histories  $\delta_m = \delta$

1960 (open seat)

(A) — B

1966

(A) — C

1972

A — (D)

1978

D — E

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**Hyp. 1:**  $\tau_m = \bar{\tau}$  (constant) : re-election depends on terms since open



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Hyp. 1:  $\tau_m = \bar{\tau}$  (constant): re-election depends on terms since open

Hyp. 2:  $\tau_2$  large,  $\tau_1$  small : re-election depends on tenure, history

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## Data

ICPSR: *Roster of congressional office holders*:

in each *congress* (a 2 year period) records who is holding a seat, their characteristics, why they entered, why they left

*Chain*: history of a seat between open seat elections

$$c = (c_1, c_2, \dots, c_I)$$

$I$  : number of elections between open seats

$c_i = 1$  if incumbent wins

$c_i = 0$  if incumbent loses

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## Institutional Details

Senators elected every 6 years since 1914.

Elections take place in November of even numbered years, office is taken the following January.

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Reasons to leave:

- (a) Lose a regular election/primary
- (b) Retirement/death/change jobs

If (b) happens before the natural end of the term, a Senator is nominated by the state governor and an election is held the next November (called *Special Election* unless the seat would have been up for election at that time)

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## Assumptions

- Both special elections and regular elections count as one term
  - imperfect: time period between terms is not always 6 years
  - interpretation of  $\tau$ : tenure effects depend on elections won, not years served

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  - imperfect: time period between terms is not always 6 years
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- Senators appointed by governor that subsequently run are treated as challengers in an open seat election
- Treat election and primary as one election

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## Statistics

Use chains that started after 1914.

- 389 chains, 593 different senators, 1330 elections.
- 72 chains start with a special election
- Incumbents win 78% of the times.
- 21% of incumbent losses occur in primary
- Longest chain: 7 senators and 15 elections.
- Only 23 senators served more than 5 terms (we assume  $\tau_m = \tau_5$  and  $\delta_m = \delta_5$  for all  $m \geq 5$ ).



## Evidence from data

		Terms since last open seat election				
		1	2	3	4	$\geq 5$
Terms of tenure	1	.79 (.02)				
	2		.78 (.03)			
	3			.81 (.04)		
	4				.81 (.06)	
	$\geq 5$					.89 (.05)
		Re-election probabilities (std. dev.)				

1) Constant diagonal: tenure effects are declining

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	3			.81 (.04)	1.00 (.00)	.79 (.07)
	4				.81 (.06)	.75 (.11)
	$\geq 5$					.89 (.05)
		Re-election probabilities (std. dev.)				

- 1) Constant diagonal: tenure effects are declining
- 2) Rows not increasing:  $\tau_1 \leq 0$
- 3) Rows declining: challengers of incumbents are worse on average

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# Maximum Likelihood Estimation

Fundamental parameters

$$\Theta = \begin{cases} \text{candidate quality densities} & f_c \sim N(\mu_c, \sigma), f_o \sim N(\mu_o, \sigma) \\ \text{tenure effects} & \tau_m \\ \text{exit probabilities} & \delta_m \\ \text{discount factor} & \beta \end{cases}$$

Model 1:  $\mu_c = \mu_o$

Model 2:  $\mu_c \neq \mu_o$

- Only  $\mu_c - \mu_o$  is identified in Model 2 (set  $\mu_c = 0$ )
- One of the tenure effects is not identified (set  $\tau_0 = 0$ )
- $\sigma$  not identified (set  $\sigma = 1$ )

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## Estimation - Strategy

- For a given parameter vector, solve the dynamic programming problem to get  $\bar{q}(q, m)$
- Generates a posterior distribution over incumbent quality, given election outcome, via Bayes' Rule
- Use this to get probability of a election outcomes given parameters
- Iterate over the parameter space to maximize log-likelihood

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## The likelihood function

Consider chain  $d$  of dimension  $T$

$h_t \equiv \langle d_1, \dots, d_{t-1} \rangle$  is the history up to  $t^{\text{th}}$  election .

$m_{h_t}$  is the number of terms served by the incumbent .

$$L(d|\Theta) = \prod_{t=1}^T \Pr(e_t = d_t | h_t; \Theta)$$



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## Likelihood: the density over the incumbent's quality

The quality distribution is updated using Bayes' Rule:

$$\begin{array}{l} \text{Posterior density given } d_{t-1} \\ g(q|d_{t-1}; h_{t-1}) \end{array} = \frac{\begin{array}{l} \text{Prior density} \\ \uparrow \\ p(q|h_{t-1}) \end{array} \cdot \begin{array}{l} \text{Probability of outcome } d_{t-1} \text{ given } q \\ \uparrow \\ \Pr(d_{t-1}|q; h_{t-1}) \end{array}}{\begin{array}{l} \Pr(d_{t-1}|h_{t-1}) \\ \downarrow \\ \text{Probability of election outcome } d_{t-1} \end{array}}$$



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## Results - Probabilities of leaving office

We use  $\beta = 0.96^6$  and consistently estimate the exit probabilities directly from data:

	N. obs.	Estimate
$\delta_1$	593	0.1484 (0.015)
$\delta_2$	358	0.2347 (0.022)
$\delta_3$	199	0.2915 (0.032)
$\delta_4$	100	0.3300 (0.047)
$\delta_5$	90	0.3500 (0.050)

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## Results: tenure effects estimates

	Model 1 ( $f_o = f_c$ )	Model 2 ( $f_o \neq f_c$ )
$\ln L$	-504.851	-486.751
$\tau_1$	-0.013 (0.281)	-0.646 (0.200)
$\tau_2$	0.116 (0.195)	-0.657 (0.211)
$\tau_3$	0.181 (0.251)	-0.615 (0.259)
$\tau_4$	-0.754 (0.581)	-1.495 (0.543)
$\tau_5$	0.241 (0.516)	0.738 (0.523)
$\mu_o - \mu_c$	0	0.742 (0.093)

Small, statistically insignificant or negative tenure effects.

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## Goodness of fit: re-election probabilities

Tenure	Data	Model 1 ( $f_o = f_c$ )	Model 2 ( $f_o \neq f_c$ )
1 ( $N = 474$ )	.755 (.020)	-0.029	-0.003
2 ( $N = 249$ )	.799 (.025)	+0.001	+0.006
3 ( $N = 122$ )	.820 (.035)	-0.010	+0.002
4 ( $N = 58$ )	.793 (.053)	-0.042	-0.036
$\geq 5$ ( $N = 38$ )	.895 (.050)	+0.021	+0.009
All ( $N = 941$ )	.783 (0.013)	-0.008	+0.007

Model 2, forcing  $f_o = f_c \implies$  incumbents win 63% of the time  
No quality differences: 50%.

## Goodness of fit: Model 1

Re-election probabilities, models and data (std. dev. in parentheses):  
 Cannot generate decreasing probabilities in any row

		Terms since last open seat election				
		1	2	3	4	≥ 5
Terms of tenure	1	.66	.76	.81	.84	.86
		.79 (.02)	.72 (.06)	.63 (.08)	.57 (.09)	.77 (.06)
	2		.75	.81	.86	.87
			.78 (.03)	.76 (.09)	.86 (.08)	.91 (.05)
	3			.78	.81	.86
				.81 (.04)	1.00 (.00)	.79 (.07)
4		Model 1			.71	.79
		Data (st. err.)			.81 (.06)	.75 (.11)
≥ 5					.92	.89 (.05)

## Goodness of fit: Model 2

Re-election probabilities, models and data (std. dev. in parentheses):

Can generate decreasing probabilities by row

		Terms since last open seat election				
		1	2	3	4	≥ 5
Terms of tenure	1	.77	.71	.73	.74	.75
		.79 (.02)	.72 (.06)	.63 (.08)	.57 (.09)	.77 (.06)
	2		.82	.77	.80	.78
			.78 (.03)	.76 (.09)	.86 (.08)	.91 (.05)
	3			.84	.78	.80
			.81 (.04)	1.00 (.00)	.79 (.07)	
4		Model 2			.78	.73
		Data (st. err.)			.81 (.06)	.75 (.11)
≥ 5						.90
						.89 (.05)

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## Additional information: house experience

Re-election frequencies  
(senators who just won an open seat)

House experience	81%
No house experience	78%

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## Additional information: party

Idea: voters have special preference for a party in some states / point in time

### Open seat winning frequency

Same party as previous sen.	39%
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With a positive local preference for a party we would expect this to be  $>50\%$ .

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## Unobserved heterogeneity

LogL -479.02327	Type 1	Type 2
$\tau_1$	5.86	-0.90
$\tau_2$	1.09	-0.67
$\tau_3$	7.99	-0.89
$\tau_4$	4.54	-1.88
$\tau_5$	1.76	-0.86
$\mu_o - \mu_c$	-3.40	0.953
Type Probabilities		
Post 1945, South	0.024	
Post 1945, No south	0	
Pre 1945, South	0.166	
Pre 1945, No south	0.281	



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## Summary

- Selection has a strong effect on incumbency advantage in Senate elections
- No strong evidence that being in the senate gives candidates a special ability to win that they didn't have as challengers
- Challengers being of lower quality accounts for about 50% of the incumbency advantage

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- Selection has a strong effect on incumbency advantage in Senate elections
- No strong evidence that being in the senate gives candidates a special ability to win that they didn't have as challengers
- Challengers being of lower quality accounts for about 50% of the incumbency advantage
- *Can compute the probability of senators winning based on seat history*

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The End

## Evidence from data

		Terms since last open seat election				
		1	2	3	4	$\geq 5$
Terms of tenure	1	.79 (.02) <i>N</i> = 308	.72 (.06) <i>N</i> = 50	.63 (.08) <i>N</i> = 41	.57 (.09) <i>N</i> = 28	.77 (.06) <i>N</i> = 47
	2		.78 (.03) <i>N</i> = 170	.76 (.09) <i>N</i> = 25	.86 (.08) <i>N</i> = 21	.91 (.05) <i>N</i> = 33
	3			.81 (.04) <i>N</i> = 79	1.00 (.00) <i>N</i> = 10	.79 (.07) <i>N</i> = 33
	4				.81 (.06) <i>N</i> = 42	.75 (.11) <i>N</i> = 16
	$\geq 5$					.89 (.05) <i>N</i> = 38

Re-election probabilities (std. dev.)

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## Likelihood - the posterior density: 3 cases

$t = 1$   
(open seat at  $t - 1$ )

$$g(q|h_0) = \frac{f_o(q) \cdot F_o(\bar{q}(q, 0))}{\int_Q f_o(x) \cdot F_o(\bar{q}(x, 0)) dx}$$

$t > 1, d_{t-1} = 1$   
(same incumbent)

$$g(q|h_t) = \frac{g(q|h_{t-1}) \cdot F_c(\bar{q}(q, m_{h_{t-1}}))}{\int_Q g(x|h_{t-1}) \cdot F_c(\bar{q}(x, m_{h_{t-1}})) dx}$$

$t > 1, d_{t-1} = 0$   
(new incumbent)

$$g(q|h_t) = \frac{f_c(q) \cdot \int_{z: \bar{q}(z, m_{h_{t-1}}) < q} g(z|h_{t-1}) dz}{\int_Q f_c(x) \cdot \int_{z: \bar{q}(z, m_{h_{t-1}}) < x} g(z|h_{t-1}) dz dx}$$

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## Unobserved heterogeneity (2)

$\ln L = -483.698$	Type 1	Type 2
$\tau_1$	8.00 (11.95)	-0.86 (0.21)
$\tau_2$	3.44 (12.10)	-0.68 (0.34)
$\tau_3$	8.00 (21.92)	-0.83 (0.39)
$\tau_4$	8.00 (15.12)	-1.84 (0.51)
$\tau_5$	3.62 ( 8.16)	-0.83 (0.50)
$\mu_o - \mu_c$	-3.55 (6.73)	0.901 (0.23)
Type prob.	0.091 (0.10)	

## Goodness of fit (2)

Re-election probabilities, models and data, standard deviation in parentheses

		Terms since last open seat election									
		1		2		3		4		$\geq 5$	
Terms of tenure	1	.66	.77	.76	.71	.81	.73	.84	.74	.86	.75
		.79 (.02)		.72 (.06)		.63 (.08)		.57 (.09)		.77 (.06)	
	2			.75	.82	.81	.77	.86	.80	.87	.78
				.78 (.03)		.76 (.09)		.86 (.08)		.91 (.05)	
	3					.78	.84	.81	.78	.86	.80
						.81 (.04)		1.00 (.00)		.79 (.07)	
4			Model 1	Model 2			.71	.78	.79	.73	
			Data	(st. err.)			.81 (.06)		.75 (.11)		
$\geq 5$									.92	.90	
									.89 (.05)		

## Goodness of fit (differences)

		Terms since last open seat election				
		1	2	3	4	$\geq 5$
Terms of tenure	1	(.02) -.13 -.03	(.06) +.04 -.01	(.08) +.18 +.09	(.09) +.26 +.17	(.06) +.09 -.02
	2		(.03) -.03 +.05	(.09) +.05 +.01	(.08) +.01 -.06	(.05) -.04 -.13
	3			(.04) -.03 +.03	(.00) -.19 -.22	(.07) +.07 +.01
	4		Model 1 Model 2		(.06) -.10 -.03	(.11) +.04 -.02
	$\geq 5$					(.05) +.02 +.01