

# PHIL 308S: Voting Theory and Fair Division

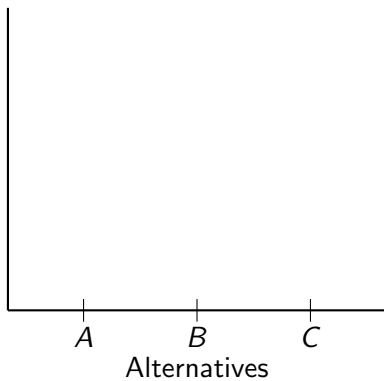
## Lecture 8

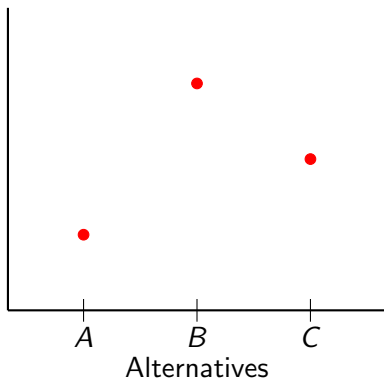
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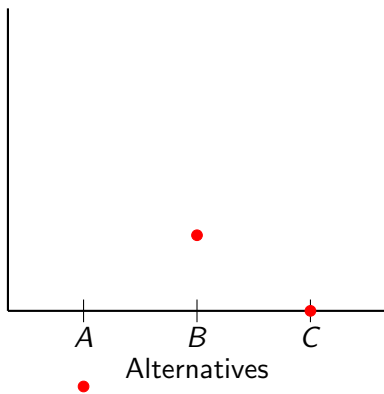
September 29, 2012

1	1	1
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<i>A</i>	<i>B</i>	<i>C</i>
<i>B</i>	<i>C</i>	<i>A</i>
<i>C</i>	<i>A</i>	<i>B</i>

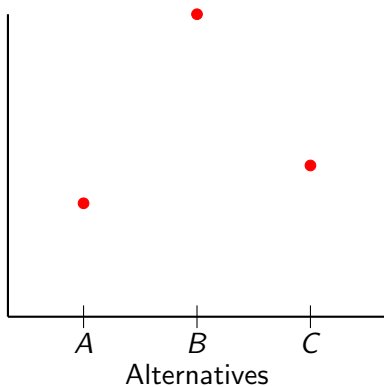




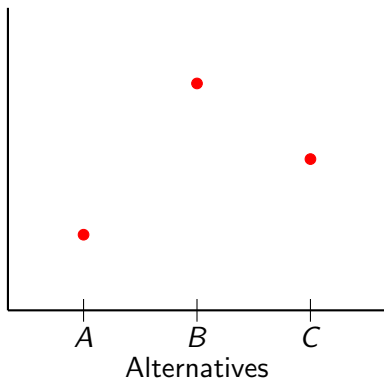
Plot  $B P_2 C P_2 A$



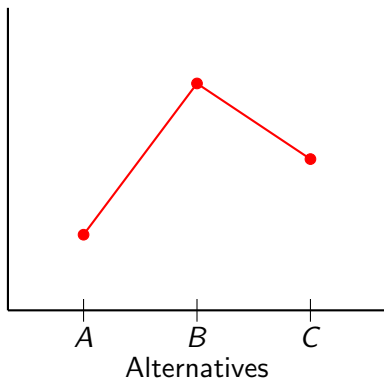
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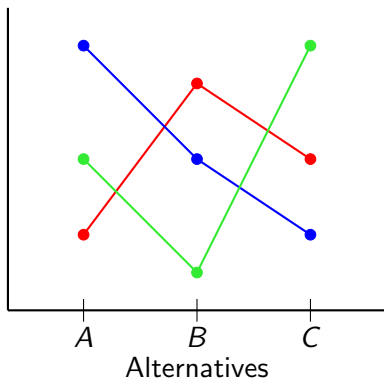
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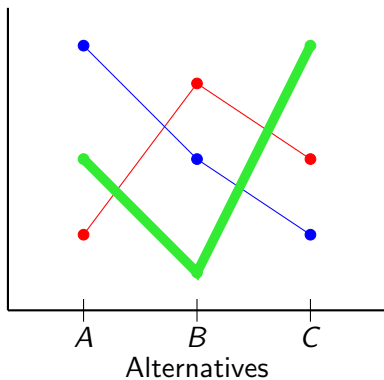
Plot  $B P_2 C P_2 A$



Plot A  $P_1$  B  $P_1$  C

Plot B  $P_2$  C  $P_2$  A

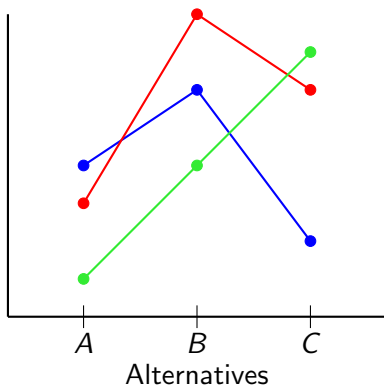
Plot C  $P_3$  A  $P_3$  B



Plot A  $P_1$  B  $P_1$  C

Plot B  $P_2$  C  $P_2$  A

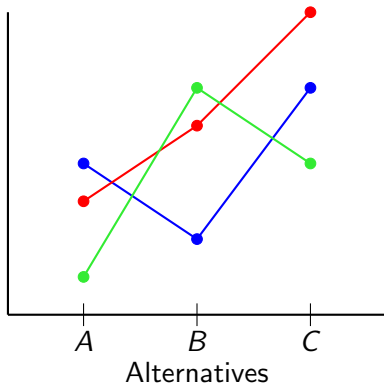
Plot C  $P_3$  A  $P_3$  B



Plot  $B P_1 A P_1 C$

Plot  $B P_2 C P_2 A$

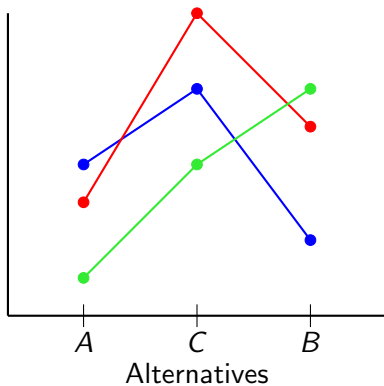
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Plot C  $P_1$  A  $P_1$  B

Plot C  $P_2$  B  $P_2$  A

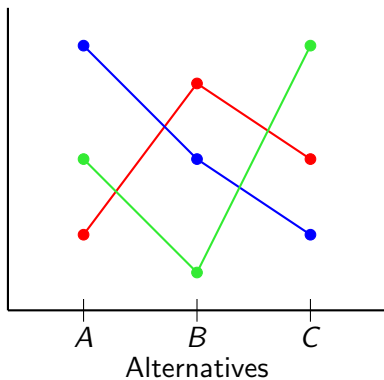
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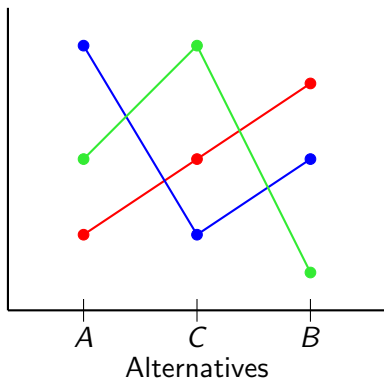
Plot B  $P_3$  C  $P_3$  A



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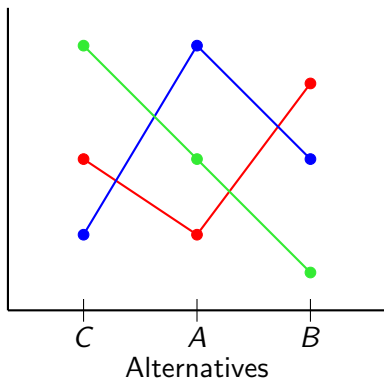
Plot C  $P_3$  A  $P_3$  B



Plot A  $P_1$  B  $P_1$  C

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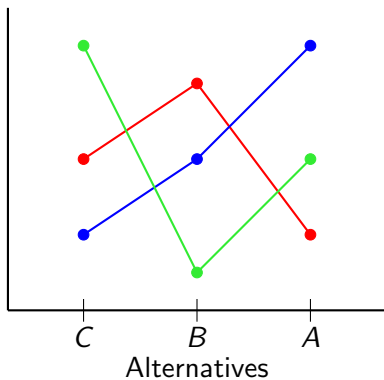
Plot C  $P_3$  A  $P_3$  B



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Plot A  $P_1$  B  $P_1$  C

Plot B  $P_2$  C  $P_2$  A

Plot C  $P_3$  A  $P_3$  B

D. Black. *On the rationale of group decision-making*. Journal of Political Economy, 56:1, pgs. 23 - 34, 1948.

**Single-Peakedness:** the preferences of group members are said to be single-peaked if the alternatives under consideration can be represented as points on a line and each of the utility functions representing preferences over these alternatives has a maximum at some point on the line and slopes away from this maximum on either side.

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**Theorem.** If there is an odd number of voters that display single-peaked preferences, then a Condorcet winner exists.

A. Sen. *A Possibility Theorem on Majority Decisions*. *Econometrica* 34, 1966, pgs. 491 - 499.

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Assume  $n$  voters ( $n$  is odd).

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**Triplewise value-restriction:** For every triple of distinct candidates  $x_1, x_2, x_3$  there exists an  $x_i \in \{x_1, x_2, x_3\}$  and  $r \in \{1, 2, 3\}$  such that no voter ranks  $x_i$  has her  $r$ th preference among  $x_1, x_2, x_3$ .

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**Theorem (Sen, 1966).** For every profile satisfying triplewise value-restriction, pairwise majority voting generates a transitive group preference ordering.

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Define a matrix  $M = (m_{ij})$  where

$$m_{ij} = \begin{cases} 1 & \text{if } x_i > x_j \\ 0 & \text{otherwise} \end{cases}$$

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Example:  $x_1 > x_2 > x_3$  is defined as follows:

$$M_{123} = \begin{matrix} & x_1 & x_2 & x_3 \\ x_1 & & & \\ x_2 & & & \\ x_3 & & & \end{matrix}$$

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Example:  $x_1 > x_2 > x_3$  is defined as follows:

$$M_{123} = \begin{array}{ccccc} & & x_1 & x_2 & x_3 \\ x_1 & 0 & 1 & 1 & \\ x_2 & 0 & 0 & 1 & \\ x_3 & 0 & 0 & 0 & \end{array}$$

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$$M_{123} = \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

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$$M_{123} = \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix} \quad M_{132} = \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 0 \\ 0 & 1 & 0 \end{pmatrix} \quad M_{213} = \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

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Let  $a_{hij}$  denote the number of voters holding the preference ordering  $x_h > x_i > x_j$

**Pairwise majority:**

$$S = a_{123}M_{123} + a_{132}M_{132} + a_{213}M_{213} + a_{231}M_{231} + a_{312}M_{312} + a_{321}M_{321}$$

3	2	5	1
$x_1$	$x_2$	$x_3$	$x_2$
$x_2$	$x_3$	$x_1$	$x_1$
$x_3$	$x_1$	$x_2$	$x_3$

$$S = a_{123}M_{123} + a_{231}M_{231} + a_{312}M_{312} + a_{213}M_{213}$$

3	2	5	1
$x_1$	$x_2$	$x_3$	$x_2$
$x_2$	$x_3$	$x_1$	$x_1$
$x_3$	$x_1$	$x_2$	$x_3$

$$S = a_{123}M_{123} + a_{231}M_{231} + a_{312}M_{312} + a_{213}M_{213}$$

$$= 3M_{123} + 2M_{231} + 5M_{312} + 1M_{213}$$

3	2	5	1
$x_1$	$x_2$	$x_3$	$x_2$
$x_2$	$x_3$	$x_1$	$x_1$
$x_3$	$x_1$	$x_2$	$x_3$

$$S = a_{123}M_{123} + a_{231}M_{231} + a_{312}M_{312} + a_{213}M_{213}$$

$$= 3 \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix} + 2 \begin{pmatrix} 0 & 0 & 0 \\ 1 & 0 & 1 \\ 1 & 0 & 0 \end{pmatrix} + 5 \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 1 & 1 & 0 \end{pmatrix} + 1 \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

3	2	5	1
$x_1$	$x_2$	$x_3$	$x_2$
$x_2$	$x_3$	$x_1$	$x_1$
$x_3$	$x_1$	$x_2$	$x_3$

$$S = a_{123}M_{123} + a_{231}M_{231} + a_{312}M_{312} + a_{213}M_{213}$$

$$= 3 \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix} + 2 \begin{pmatrix} 0 & 0 & 0 \\ 1 & 0 & 1 \\ 1 & 0 & 0 \end{pmatrix} + 5 \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 1 & 1 & 0 \end{pmatrix} + 1 \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

$$= \begin{pmatrix} 0 & 3 & 3 \\ 0 & 0 & 3 \\ 0 & 0 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 0 & 0 \\ 2 & 0 & 2 \\ 2 & 0 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 5 & 0 \\ 0 & 0 & 0 \\ 5 & 5 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

3	2	5	1
$x_1$	$x_2$	$x_3$	$x_2$
$x_2$	$x_3$	$x_1$	$x_1$
$x_3$	$x_1$	$x_2$	$x_3$

$$S = a_{123}M_{123} + a_{231}M_{231} + a_{312}M_{312} + a_{213}M_{213}$$

$$= 3 \begin{pmatrix} 0 & 1 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix} + 2 \begin{pmatrix} 0 & 0 & 0 \\ 1 & 0 & 1 \\ 1 & 0 & 0 \end{pmatrix} + 5 \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 0 \\ 1 & 1 & 0 \end{pmatrix} + 1 \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

$$= \begin{pmatrix} 0 & 3 & 3 \\ 0 & 0 & 3 \\ 0 & 0 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 0 & 0 \\ 2 & 0 & 2 \\ 2 & 0 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 5 & 0 \\ 0 & 0 & 0 \\ 5 & 5 & 0 \end{pmatrix} + \begin{pmatrix} 0 & 0 & 1 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}$$

$$= \begin{pmatrix} 0 & 8 & 4 \\ 3 & 0 & 6 \\ 7 & 5 & 0 \end{pmatrix}$$

$$S = \begin{pmatrix} 0 & a_{123} + a_{132} + a_{312} & a_{123} + a_{132} + a_{213} \\ a_{213} + a_{231} + a_{321} & 0 & a_{123} + a_{213} + a_{231} \\ a_{231} + a_{312} + a_{321} & a_{132} + a_{312} + a_{321} & 0 \end{pmatrix}$$

$x_i > x_j$  iff  $s_{ij} > s_{ji}$

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**Lemma.** If there is a majority cycle over  $x_1, x_2, x_3$  then  
 ( $a_{123} > a_{321}$  and  $a_{312} > a_{213}$  and  $a_{231} > a_{132}$ ) or ( $a_{321} > a_{123}$  and  
 $a_{213} > a_{312}$  and  $a_{132} > a_{231}$ )

$$S = \begin{pmatrix} 0 & a_{123} + a_{132} + a_{312} & a_{123} + a_{132} + a_{213} \\ a_{213} + a_{231} + a_{321} & 0 & a_{123} + a_{213} + a_{231} \\ a_{231} + a_{312} + a_{321} & a_{132} + a_{312} + a_{321} & 0 \end{pmatrix}$$

$x_i > x_j$  iff  $s_{ij} > s_{ji}$

**Lemma.** If there is a majority cycle over  $x_1, x_2, x_3$  then  $(a_{123} > a_{321}$  and  $a_{312} > a_{213}$  and  $a_{231} > a_{132})$  or  $(a_{321} > a_{123}$  and  $a_{213} > a_{312}$  and  $a_{132} > a_{231})$

**Lemma.** If  $(a_{123} = 0$  or  $a_{312} = 0$  or  $a_{231} = 0)$  and  $(a_{321} = 0$  or  $a_{213} = 0$  or  $a_{132} = 0)$ , then there is no majority cycle over  $x_1, x_2, x_3$ .

**Theorem** Suppose that for every triple of distinct candidates  $x_1, x_2, x_3$ , we have  $(a_{123} = 0 \text{ or } a_{312} = 0 \text{ or } a_{231} = 0)$  and  $(a_{321} = 0 \text{ or } a_{213} = 0 \text{ or } a_{132} = 0)$ , then pairwise majority generates a transitive ordering.

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**Theorem** A profile satisfies triplewise value-restriction iff for every triple of distinct candidates  $x_1, x_2, x_3$ , we have  $(a_{123} = 0 \text{ or } a_{312} = 0 \text{ or } a_{231} = 0)$  and  $(a_{321} = 0 \text{ or } a_{213} = 0 \text{ or } a_{132} = 0)$ .

$x_1$	$x_2$	$x_3$
is not ranked 1st		
$a_{123} = 0 \ \& \ a_{132} = 0$	$a_{213} = 0 \ \& \ a_{231} = 0$	$a_{312} = 0 \ \& \ a_{321} = 0$

$x_1$	$x_2$	$x_3$
is not ranked 2nd		
$a_{213} = 0 \ \& \ a_{312} = 0$	$a_{123} = 0 \ \& \ a_{321} = 0$	$a_{132} = 0 \ \& \ a_{231} = 0$

$x_1$	$x_2$	$x_3$
is not ranked 3rd		
$a_{231} = 0 \ \& \ a_{321} = 0$	$a_{132} = 0 \ \& \ a_{312} = 0$	$a_{123} = 0 \ \& \ a_{213} = 0$

C. List, R. Luskin, J. Fishkin and I. McLean. *Deliberation, Single-Peakedness, and the Possibility of Meaningful Democracy: Evidence from Deliberative Polls*. Manuscript, 2012.

# Taking Stock

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- ▶ Voting Paradoxes: Condorcet Paradox, Condorcet's Other Paradox, No-Show Paradox, Failures of Monotonicity (Plurality of Runoff), Failures of Independence (Borda), Multiple Districts Paradox

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- ▶ "Escape routes" to Arrow's Impossibility Result: Domain restrictions

## What's Next?

- ▶ “Epistemic Democracy” (Condorcet Jury Theorem) and distance-based rationalizations of voting methods
- ▶ Strategizing
- ▶ Changing the basic framework: Approval Voting, Voting by “grading”
- ▶ Voting on issues, judgement aggregation, and Sen’s Liberal Paradox

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*Fair Division*