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# Computational experiments on Contested Pile methods for the fair allocation of indivisible items


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COST action meeting  
Sibiu, Romania  
Oct. 20, 2014



- 
- A vertical photograph of a classical building facade, showing a statue on a pedestal, a balustrade, and columns.
- **Contested Pile procedures**
  - **Design parameters**
  - **Undercut procedure**
  - **Results**
    - Contested pile
    - Efficiency and fairness
    - Properties of undercut
  - **Strategic play**
  - **Conclusions**



- **Two players**
- **A finite set of indivisible items**
- **Players rank items differently**
- **Rankings are private information**
- **Task: allocate items to players so that allocation is**
  - efficient
  - fair
  - and procedure is not (easily) manipulable
- **Further assumptions (for computational experiments)**
  - Cardinal evaluation of item  $i$  for player  $j$ :  $v_{ij}$
  - Preferences are additive:  $u_i(S) = \sum_{j \in S} v_{ij}$



## Basic contested pile procedure

- **Both player simultaneously claim an (available) item**
- **If different items are claimed, each player receives the desired item**
- **If both claim the same item, that item is put on “contested pile”**
- **In both cases, the item(s) claimed are no longer available**
- **Repeat above steps until all items are assigned to players or placed on contested pile**

Note: at the end of the procedure, all items on contested pile are ranked identically by both players (assuming truthful behavior of players)



Item	$u_{1i}$	$u_{2i}$
A	4	1
B	3	3
C	2	4
D	1	2

Round	Player 1 claims	Player 2 claims	Result
1	A	C	Assigned
2	B	B	Contested
3	D	D	Contested

Note: both players prefer B over D





- **Generation phase**
  - Direction: Claim or reject
  - Number of items in each step
- **Splitting phase**
  - Methods to split CP
    - Balanced alteration
    - Borda max-min
    - Undercut





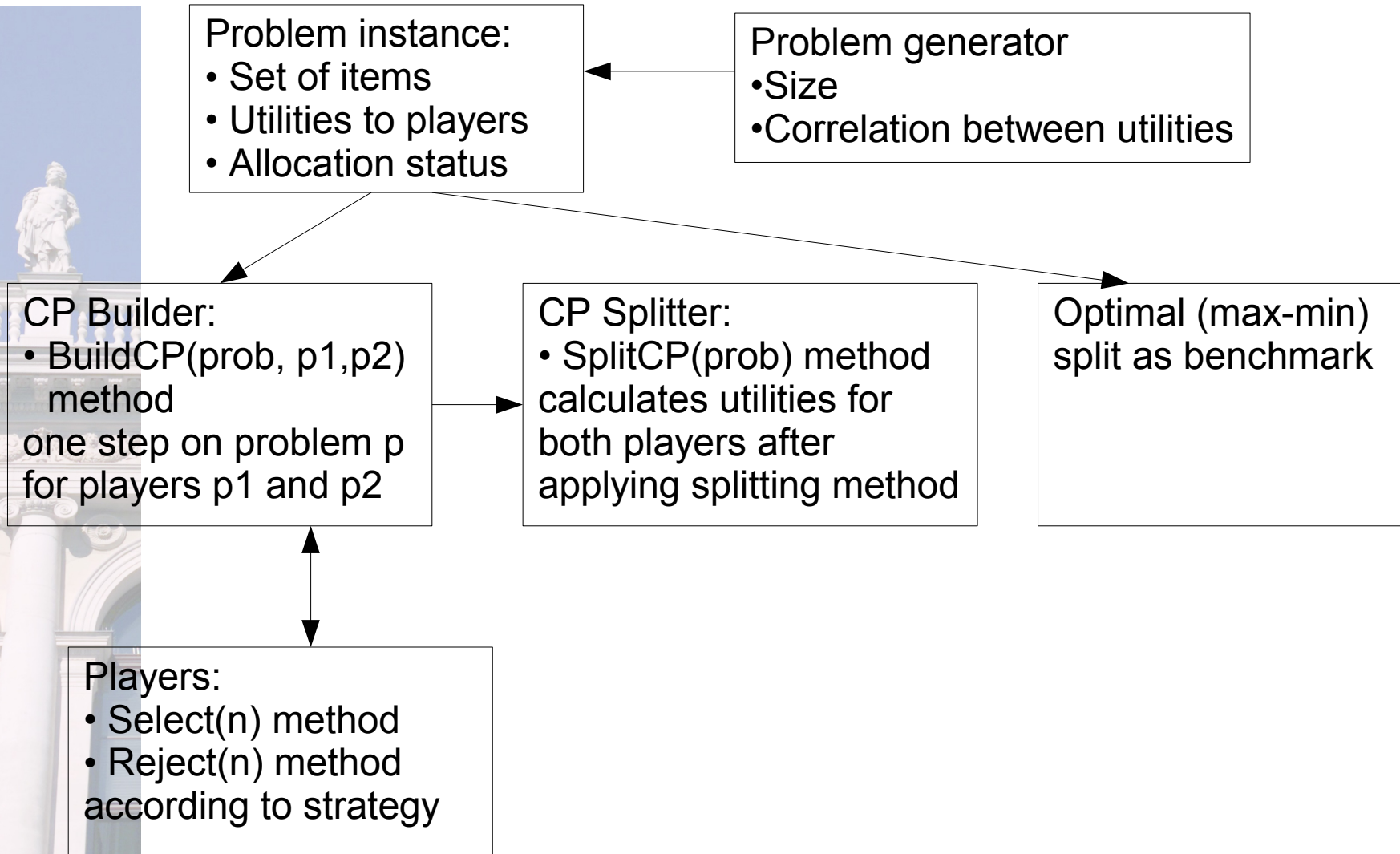
- **How does design of generation phase influence**
  - size and composition of contested pile
  - efficiency and fairness of outcomes
- **How does choice of splitting procedure influence efficiency and fairness of outcomes**
- **... in particular, how effective is the undercut procedure**
- **How strongly are different variants affected by strategic behavior?**





- **Round-robin tournament between different players**  
(sincere and different types of strategic behavior)
- **Each type plays against all types (including copy of itself)**
- **Randomly generated problems**  
pre-specified correlation of utilities
- **For each problem**
  - all generation methods
  - all splitting methods
- **For *evaluation*, assume cardinal utilities and additive preferences**







- **Direction should have no effect**  
both directions provide basically the same information
- **Claiming/rejecting more items in each round will decrease fairness and efficiency**  
since less information on preferences is provided
- **Claiming/rejecting more items in each round will make procedure less vulnerable to manipulation**  
since less information is provide, less can be manipulated
- **Undercut will perform better than other splitting methods**



Final allocation:  $(S_1, S_2): S_1 \cap S_2 = \emptyset ; S_1 \cup S_2 = S$

Utilities:  $u_i(S_i) = \sum_{j \in S_i} v_{ij}$

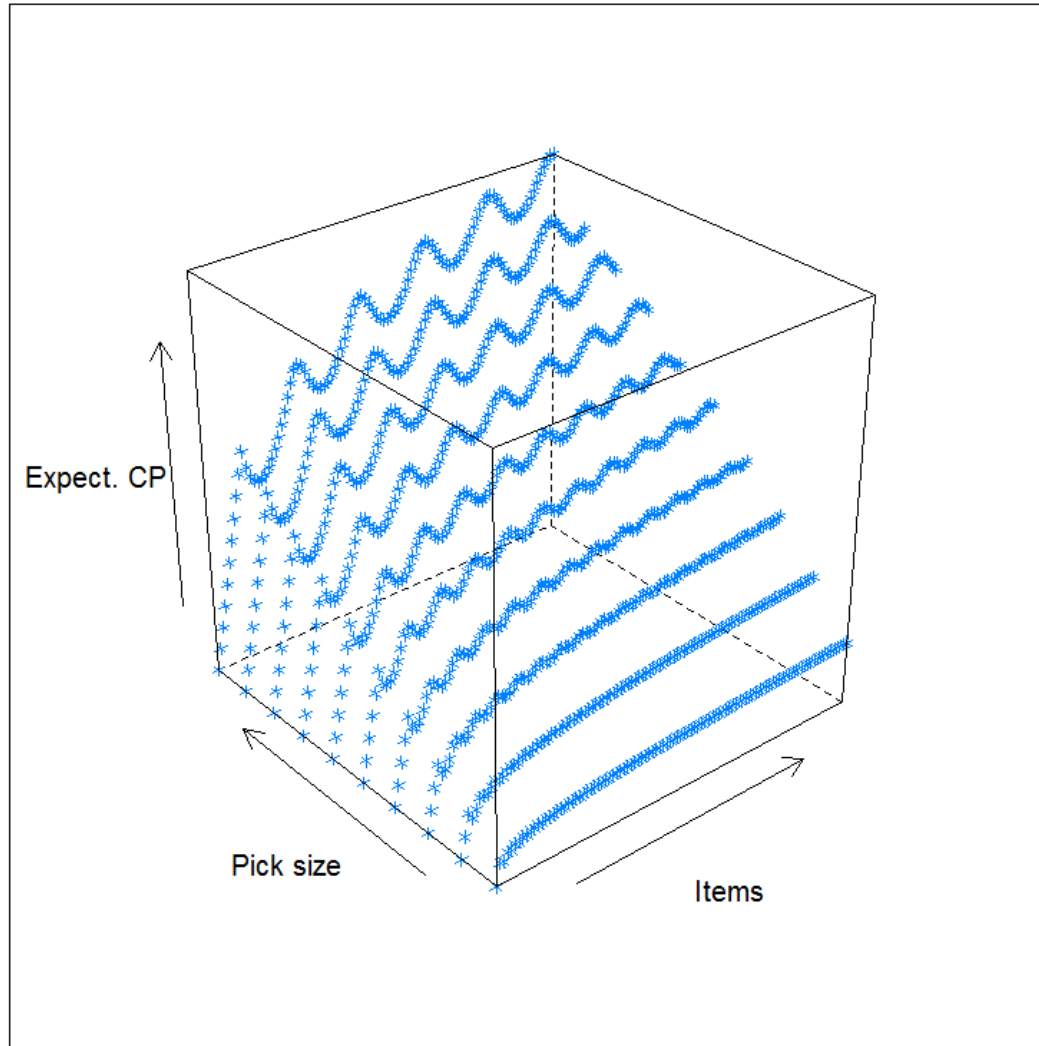
Efficiency: relative sum of utilities:

$$RelSum(S_1, S_2) = \frac{u_1(S_1) + u_2(S_2)}{\sum_j \max(v_{1j}, v_{2j})}$$

Fairness: relative position of weaker player

$$RelMin = \frac{\min(u_1(S_1), u_2(S_2))}{\min(u_1^*, u_2^*)}$$

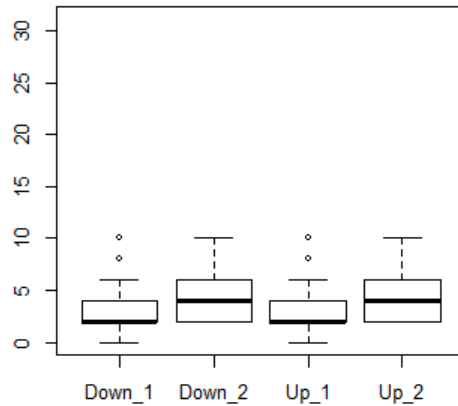
$u_1^*$ ,  $u_2^*$  ... utilities in max-min allocation



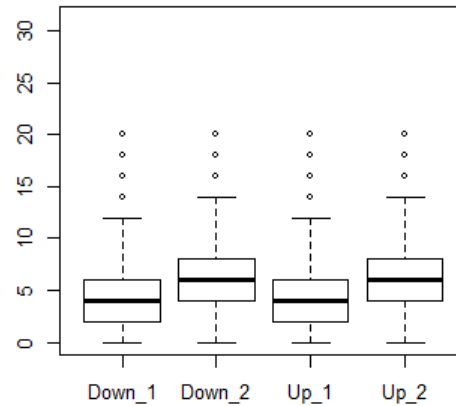


# Size of contested pile

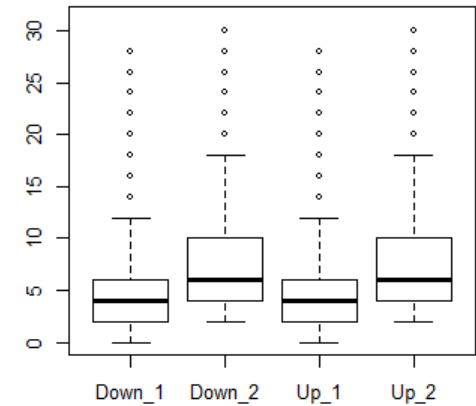
10 items



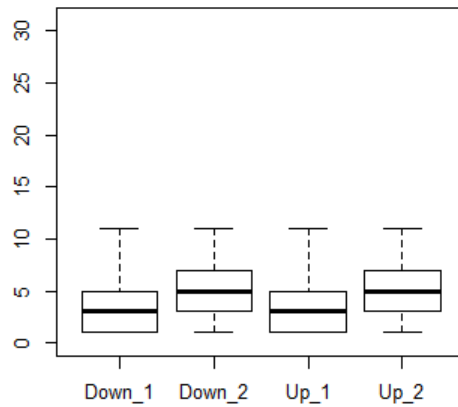
20 items



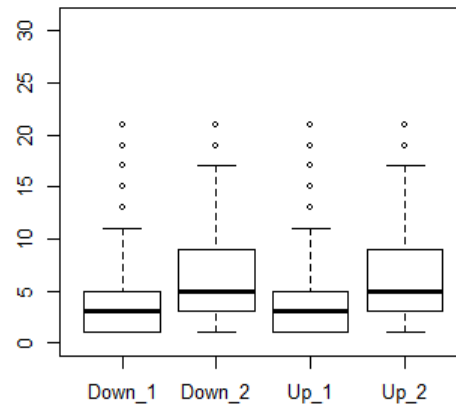
30 items



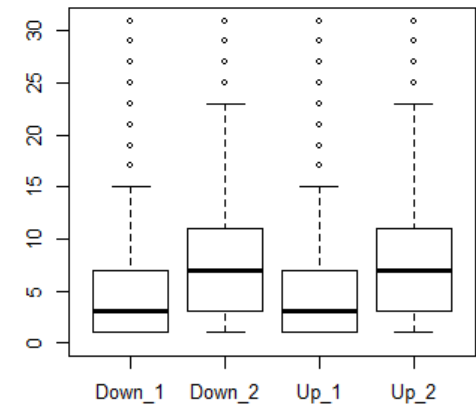
11 items



21 items

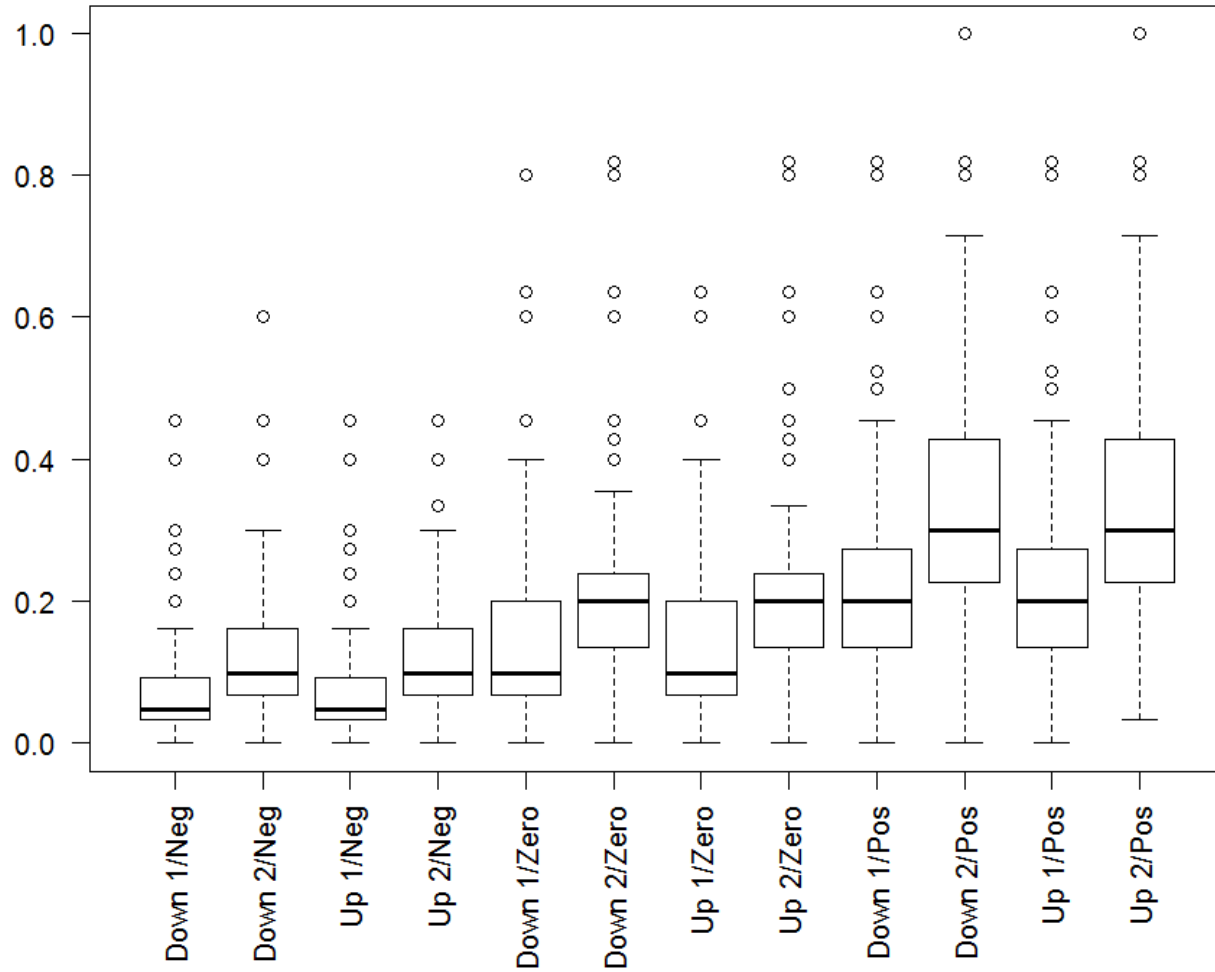


31 items





# Relative size of contested pile

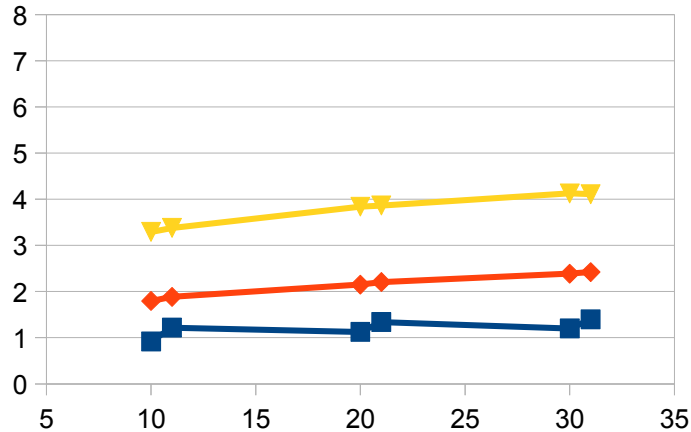




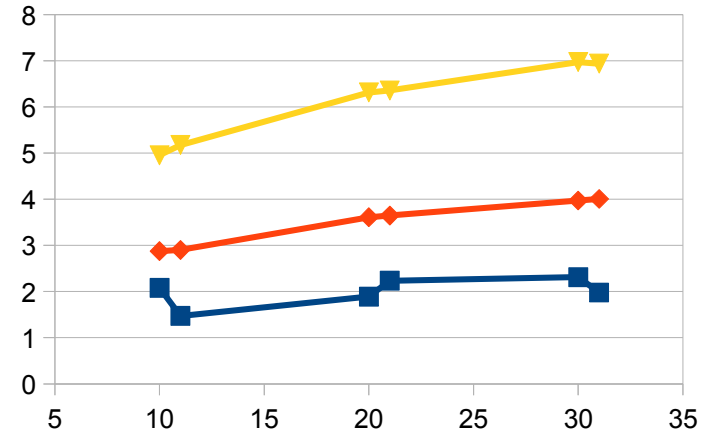


# Absolute size of contested pile

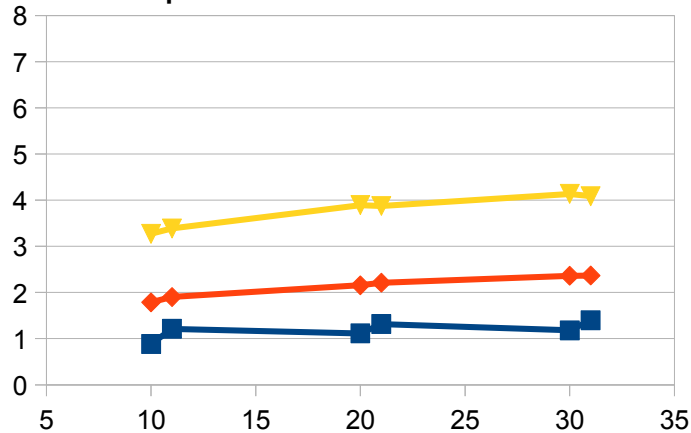
Down 1



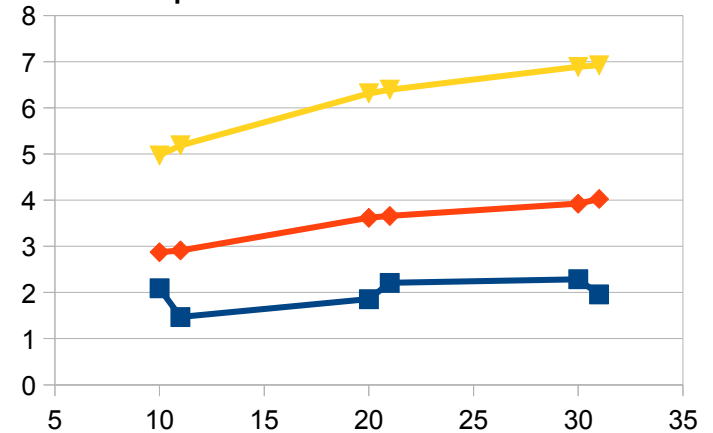
Down 2



Up 1



Up 2

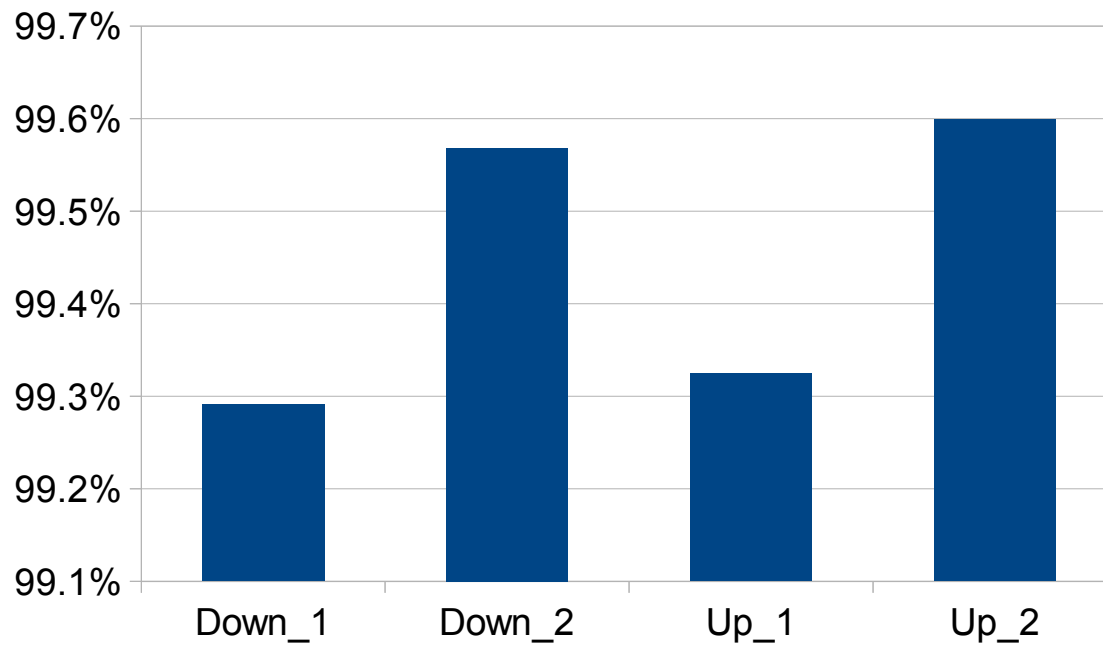


Positive Zero Negative correlation





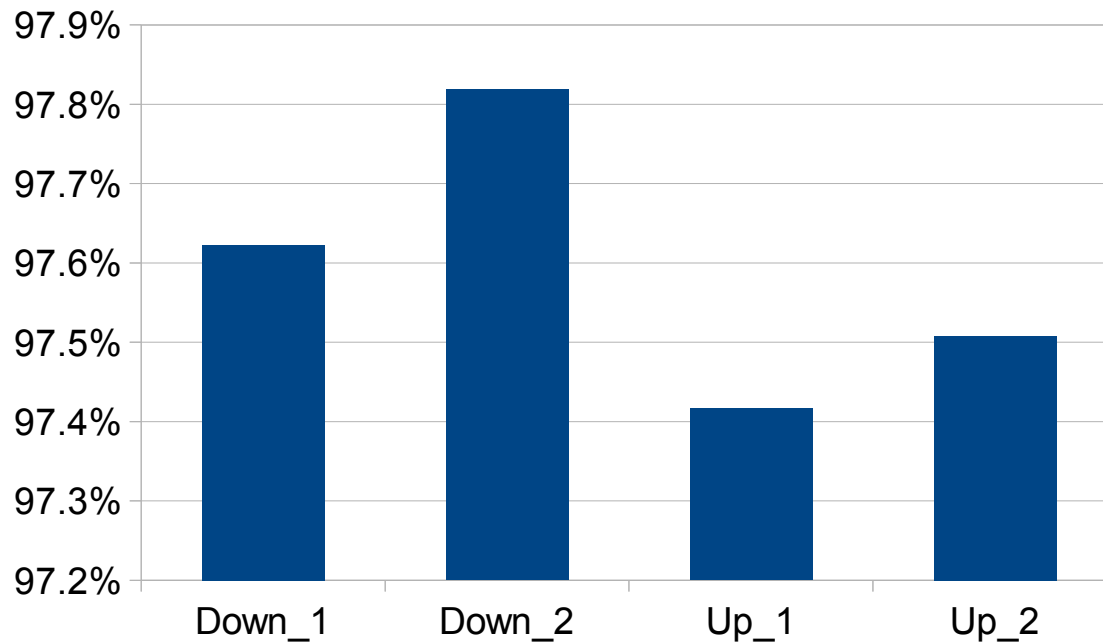
## Efficiency – Cases without CP



Larger pick size leads to higher efficiency?



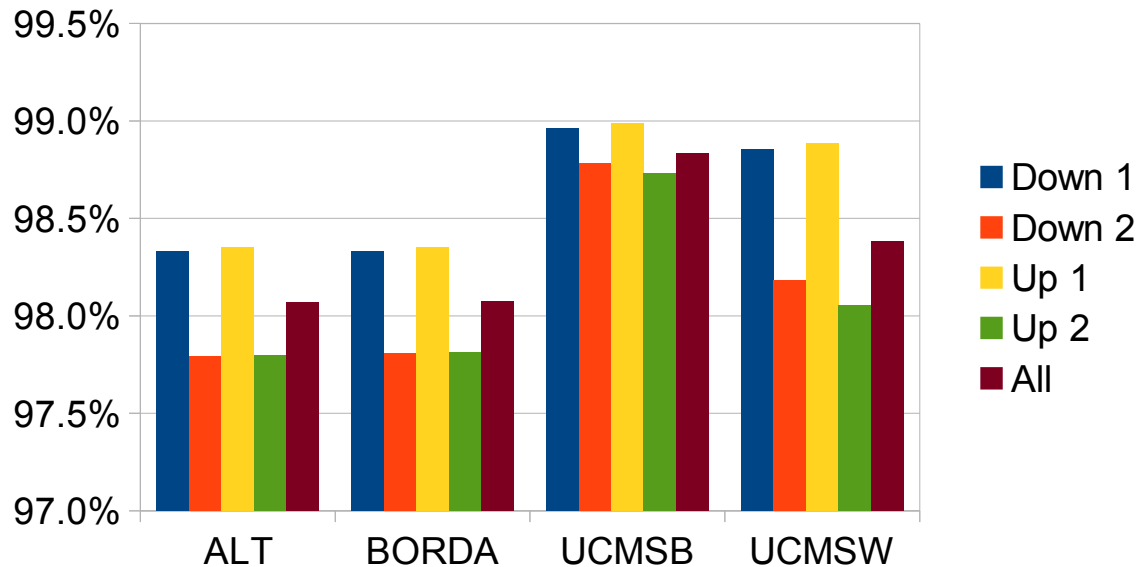
## Fairness - Cases without CP



- Larger pick size also better for fairness?
- Selecting is better than rejecting



# Results Efficiency



## Generation:

- Pick size 1 dominates 2
- Small differences between directions

## Split:

- Undercut dominates other methods



## Discussion efficiency

No CP (no split): larger pick size better

With CP: Smaller pick size better

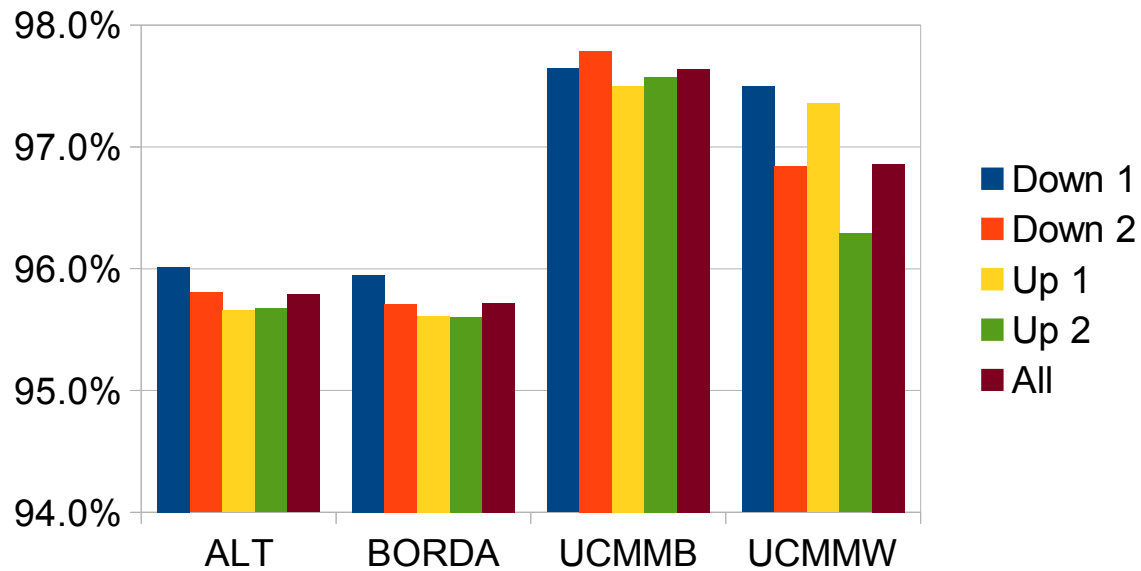
But: No CP will happen only if preferences are very distinct,  
and even more so with larger pick size:

→ No CP with larger pick size is “simple” problem





# Results fairness



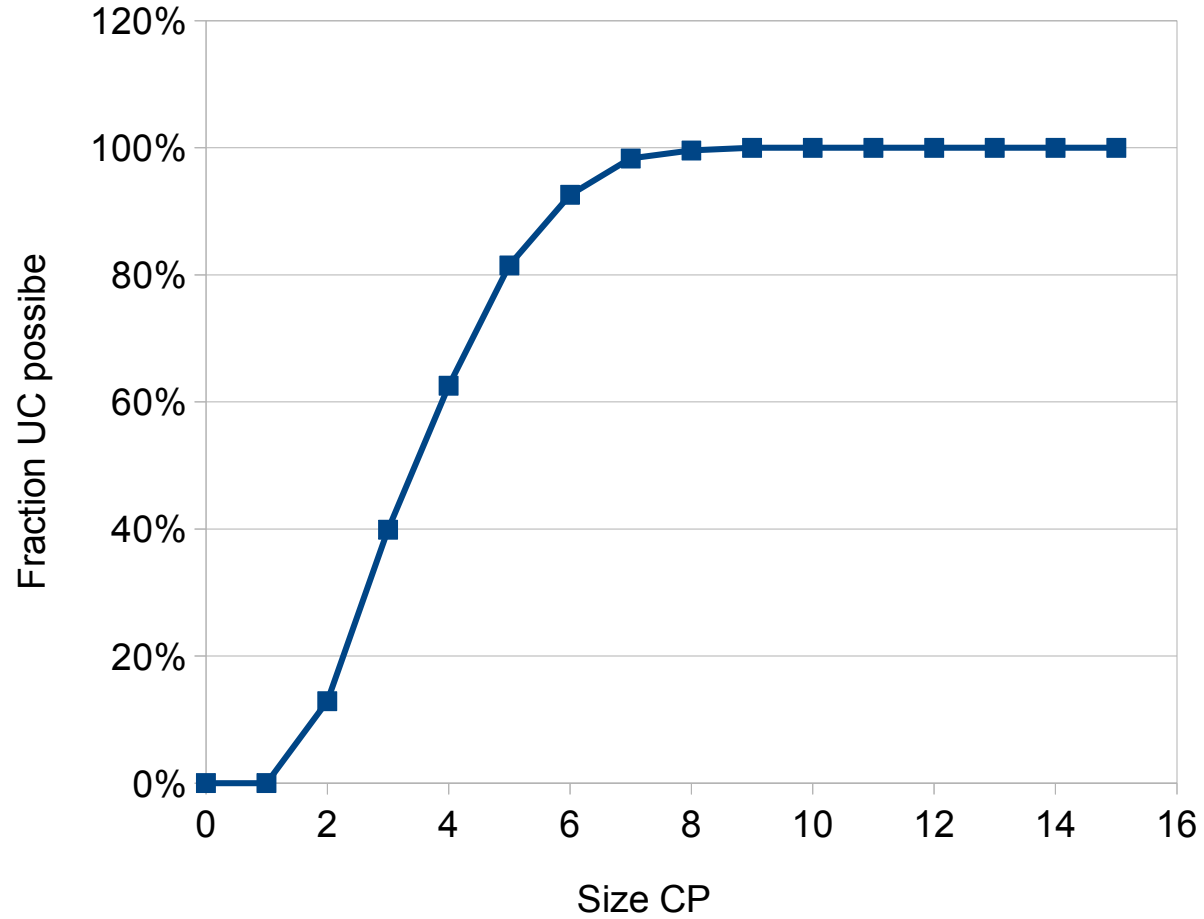
## Generation:

- Downward dominates upward
- Effects of pick size mixed

## Splitting

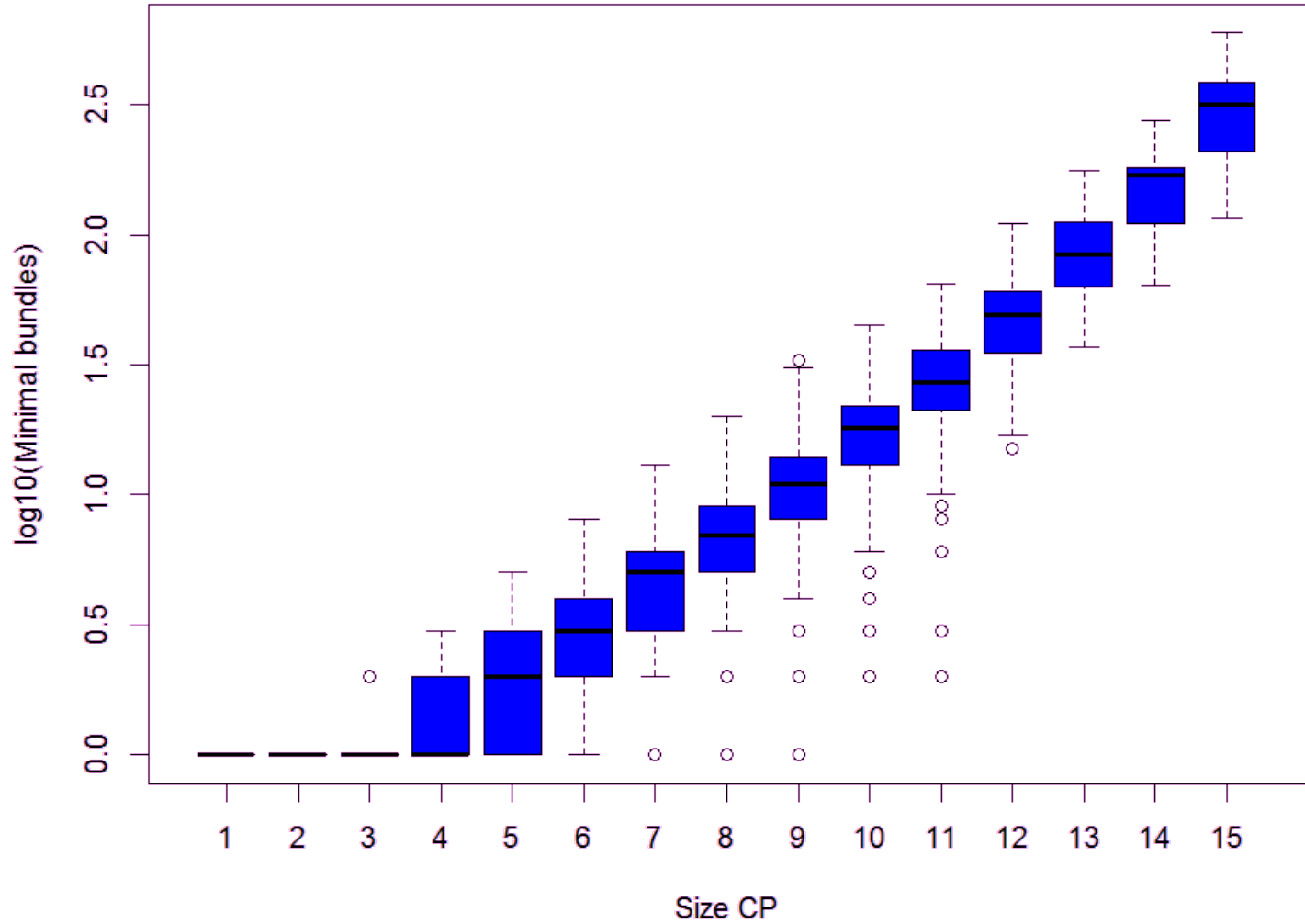
- Undercut dominates other methods





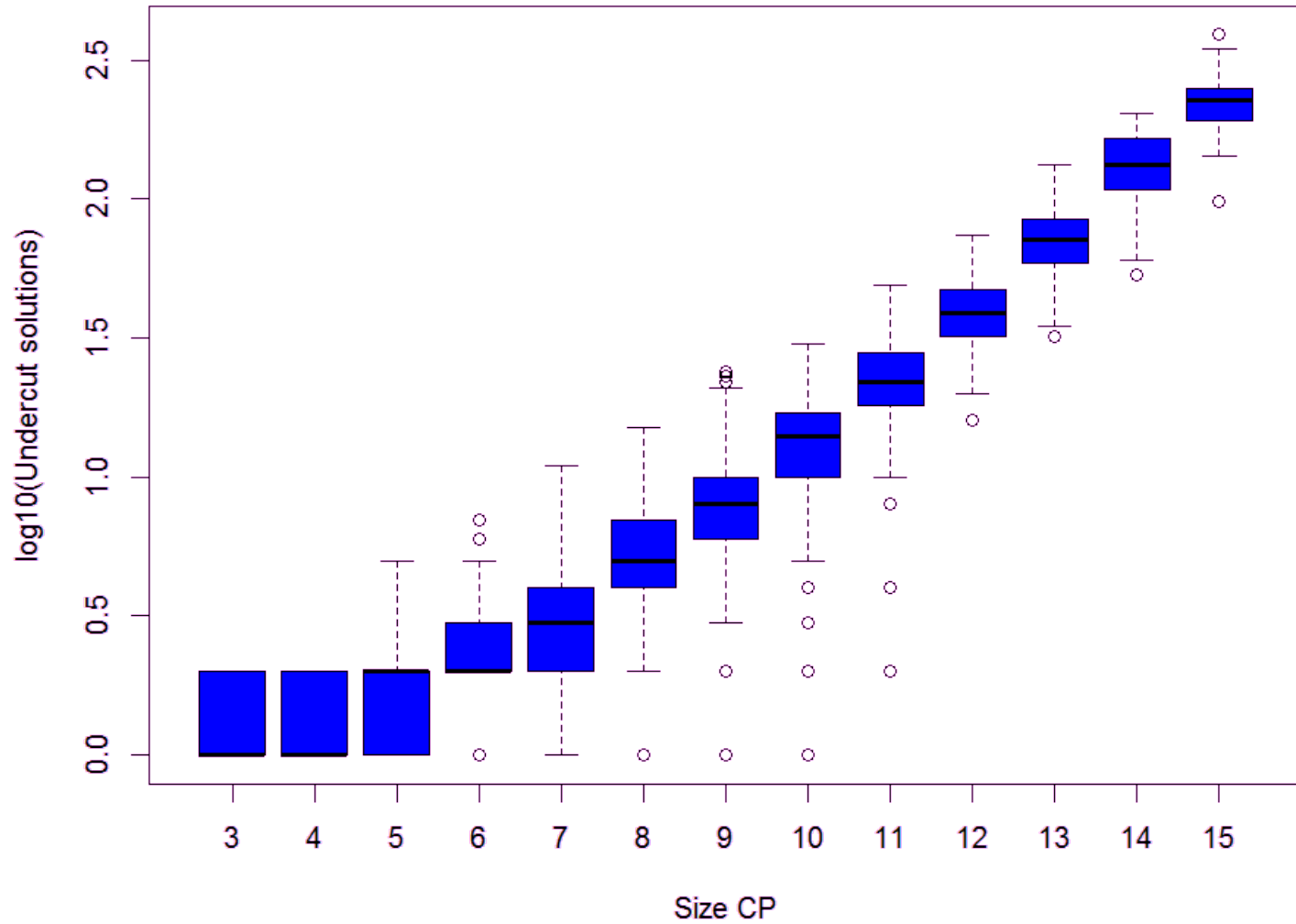


# Number minimal bundles





# Number undercut solutions





## Undercut evaluation

- **Outperforms other splitting methods**
- **Requires certain size of CP (works 60% for  $nCP=4$ , 80% for  $nCP=5$ )**
- **... but will be demanding for larger CP sizes ( $\approx$  minimal bundles for  $nCP=13$ )**
- **Suitable for medium sized CP**





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Note: both players prefer B over D



Item	$u_{1i}$	$u_{2i}$
A	4	1
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D	1	2

Round	Player 1 claims	Player 2 claims	Result
1	<b>B</b>	C	Assigned
2	A	D	Assigned

Strategic: Player 1 gets A and B for sure

Sincere: Player 1 gets A for sure and either B or D





- **Sincere**  
always acts according to true preferences (i.e. selects  $n$  best items, rejects  $n$  worst items)
- **Chance ( $m$ ):**  
randomly select/reject out of the  $m$  best/worst items (with linearly decreasing probability according to true ranks)
- **Scoring ( $w$ ):**  
select/reject items according to score:
- **Dynamic ( $w, d$ ):**  
solve limited ( $w$  items,  $d$  rounds) dynamic programming problem to find (locally) optimal strategy  
(not used in experiments on design parameters)

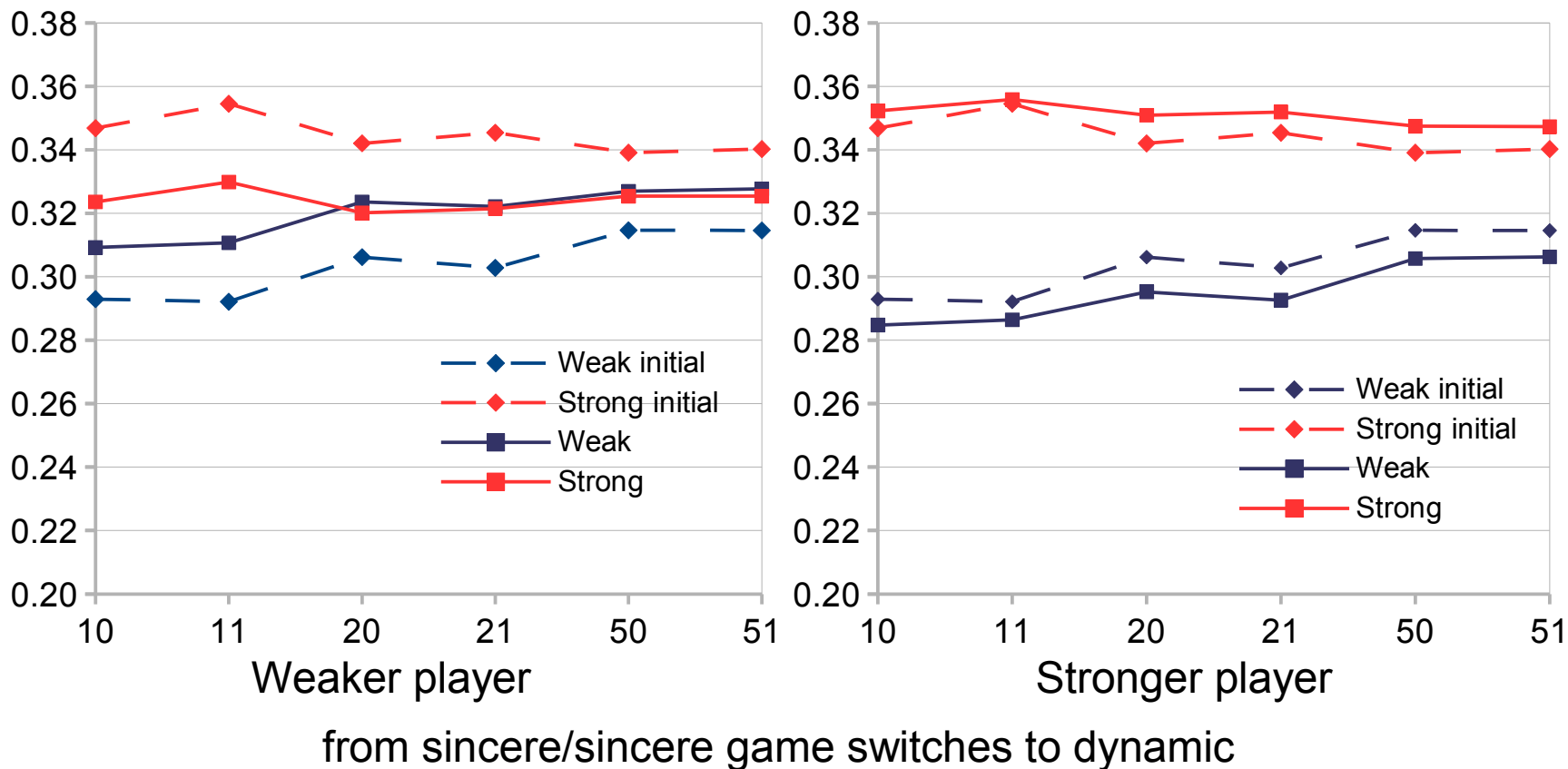
## Effects of strategic play

		Sincere	Chance	Scoring	Dynamic	All
Sincere		0.3243	0.3258	0.3175	0.3097	0.3193
Chance		0.3174	0.3188	0.3099	0.3040	0.3125
Scoring		0.3300	0.3303	0.3238	0.3212	0.3263
Dynamic		0.3355	0.3301	0.3216	0.3150	0.3256
Sincere vs. Chance	t	12.3268	12.9858	13.7982	10.0198	24.3488
	p	0.0000	0.0000	0.0000	0.0000	0.0000
Sincere vs. Scoring	t	-10.7658	-8.8210	-11.9415	-21.1370	-26.3143
	p	0.0000	0.0000	0.0000	0.0000	0.0000
Sincere vs. Dynamic	t	-21.6152	-8.5126	-7.8883	-9.4814	-23.3977
	p	0.0000	0.0000	0.0000	0.0000	0.0000
Chance vs. Scoring	t	-22.6950	-21.5393	-25.3351	-30.5677	-49.9217
	p	0.0000	0.0000	0.0000	0.0000	0.0000
Chance vs. Dynamic	t	-33.4020	-21.2479	-21.5547	-19.0602	-47.0422
	p	0.0000	0.0000	0.0000	0.0000	0.0000
Scoring. vs. Dynamic	t	-10.5638	0.3142	4.1852	11.2099	2.8589
	p	0.0000	0.7534	0.0000	0.0000	0.0043

significant effect in opposite direction

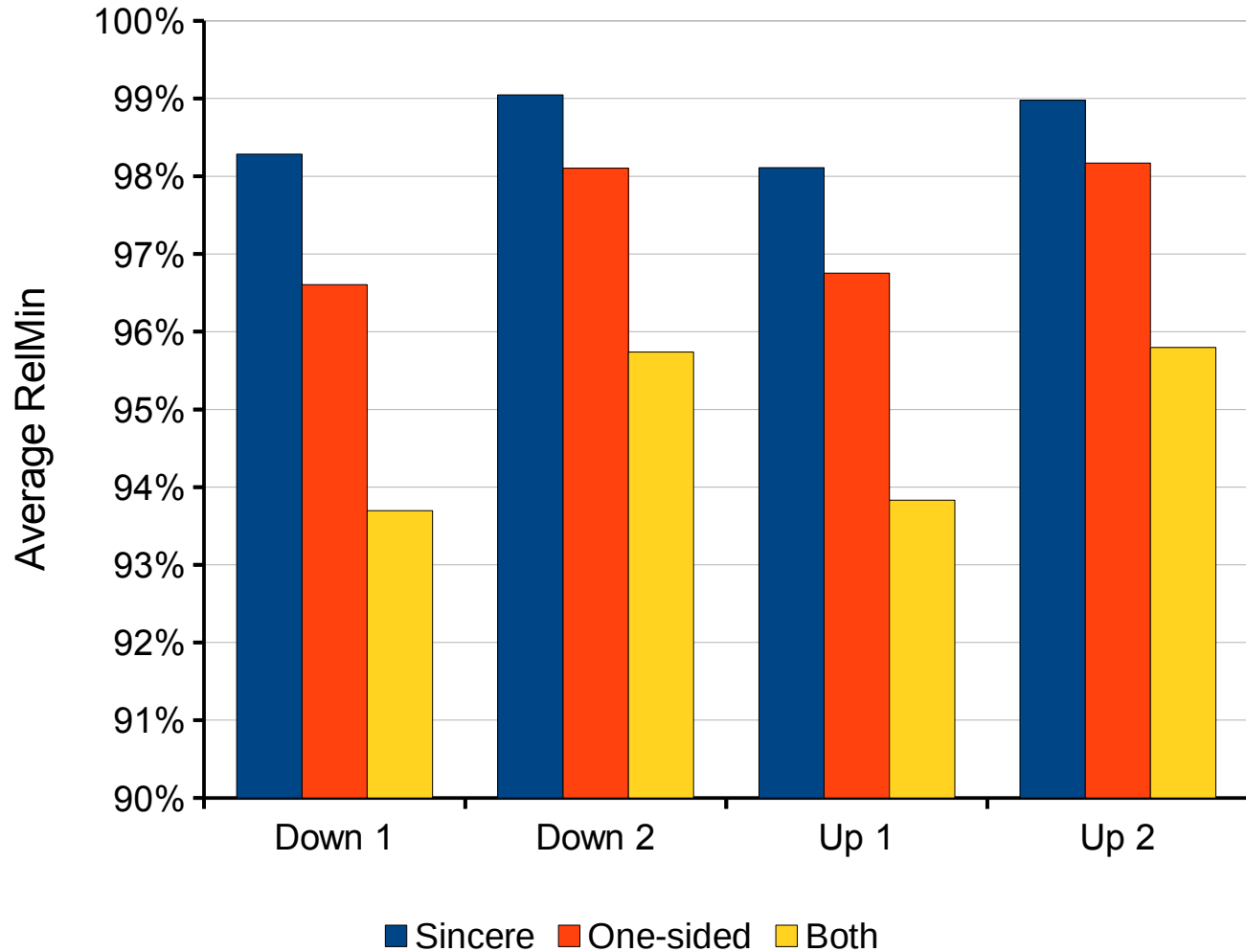


# Strategic play and fairness: Dynamic strategy and initial positions



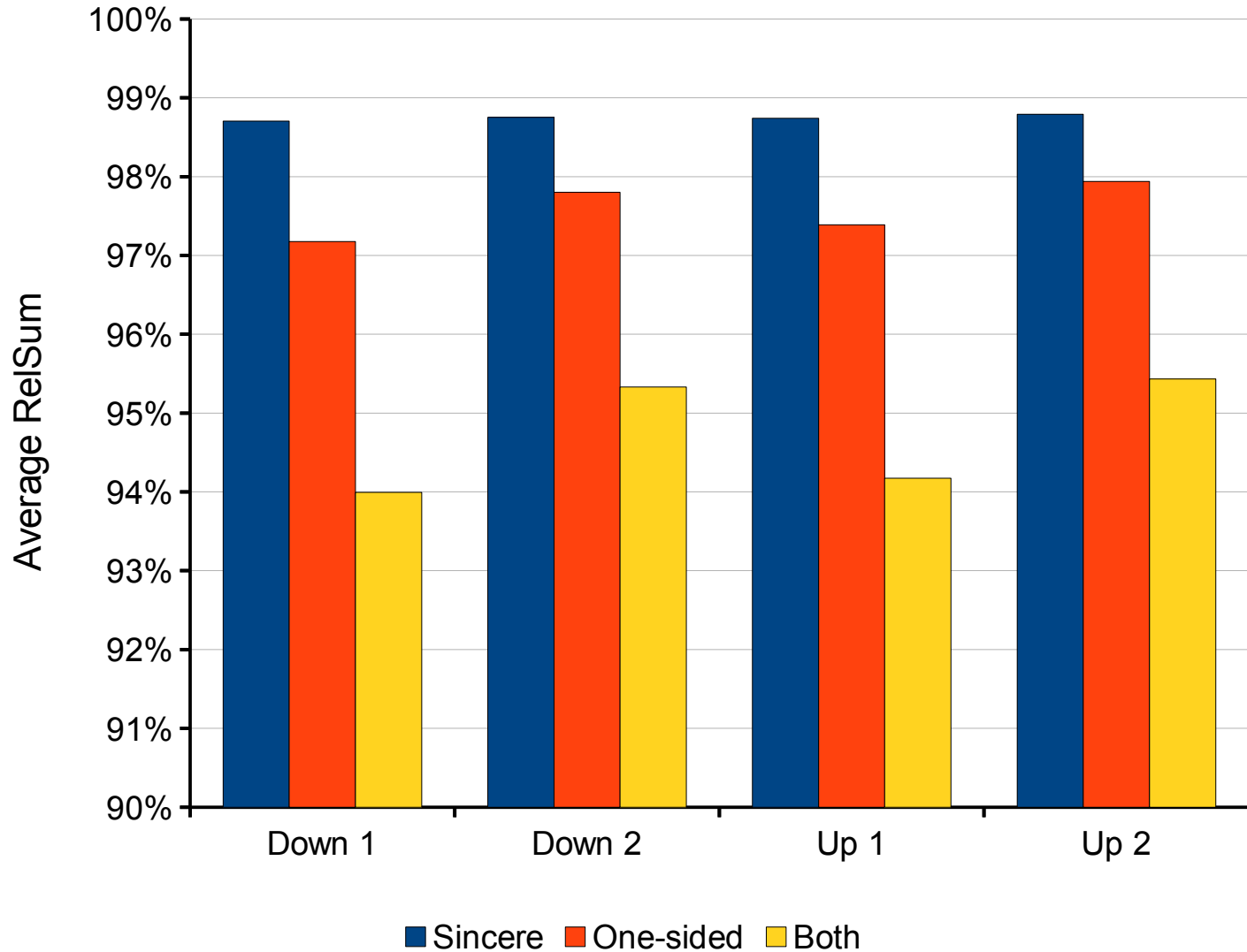


# Strategic play and design parameters: fairness





# Strategic play and design parameters: efficiency







- **Information trade-off (small vs. larger pick size)**
  - More information improves both efficiency and fairness
  - But provides more room for strategic play
- **As expected, direction (chose/reject items) has no effect**
- **Undercut procedure for splitting CP**
  - Outperforms other methods
  - But has narrow field of application in terms of CP size



- **Incomplete information in strategic play**
- **Add cardinal preference information ("bidding")**
- **Other mechanisms for splitting the CP**
- **Efficient algorithms for undercut**



*Thank you for your attention!*





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# Backup slides





Set of items  $X$

Preference relation  $P$  on items (same for both players if  $X$  is the CP)

Preferences on subsets of  $X$  are *responsive*:

$$x \in S, y \in X \setminus S: x R y \Leftrightarrow S \succ S \setminus \{x\} \cup \{y\}$$

(replacing an item with a less preferred item makes set less preferred)

$S \subseteq X$  is a *minimal bundle* iff

$$S \succ X \setminus S$$

$$\forall x \in S, y \notin S: X \setminus (S \setminus \{x\} \cup \{y\}) \succ S \setminus \{x\} \cup \{y\}$$



## Undercut procedure (2)

1. Find set  $S$ , which is a minimal bundle for one player (w.o.l.g player 1), but not for the other player
2. Propose to allocate  $S$  to player 1 and  $X \setminus S$  to player 2
3. Player 2 can “undercut”  
let for both players  $xPy, x \in S, y \in X \setminus S$   
Player 2 takes  $T = S \setminus \{x\} \cup \{y\}$   
Player 1 then receives  $X \setminus T$



Resulting allocation is envy-free:  
 $S$  is minimal bundle for player 1, but not for 2

Case 1:

Player 2 prefers complement over  $S$ :  
both get what they prefer

Case 2:

$S$  is more than minimal bundle for player 2:  
Player 2 can reduce  $S$  to a bundle  $T$ , which he  
still prefers over its complement  
Since  $S$  was minimal for player 1, player one  
prefers  $X \setminus T$  over  $T$





## Notation

$m$ .... items in total

$h$ .... items left to allocate in a given round

$q$ .... pick size

$r$ .... items contested in one round

Regular (not last) round:

$q - r$  items to player 1

$q - r$  items to player 2

$r$  items contested

$2q - r$  items allocated in total

Process terminates once  $h = 2q - r$

( $r$  must always be large enough for equality)



Probability that  $r$  items will be put on CP:  
w.l.o.g. player 1 picks items  $1..q$

$h > 2q$ : zero to  $q$  items can be contested

$$Pr_h(r) = \binom{r}{q} \binom{q-r}{h-q} / \binom{q}{h}$$

$q < h < 2q$ : at least  $2q - h$  items will be contested

$$Pr_h(r) = \begin{cases} 0 & r < 2q - h \\ \binom{r}{q} \binom{q-r}{h-q} / \binom{q}{h} & 2q - h \leq r \leq q \end{cases}$$

$h \leq q$ : all items are contested

$$Pr_h(r) = \begin{cases} 0 & r \neq h \\ 1 & r = h \end{cases}$$



Probability that CP contains  $i$  items

$$Pr_m(i) = \sum_{r=\max(2q-m,0)}^q Pr_{m-2q+r}(i-r) \binom{r}{q} \binom{q-r}{m-q} / \binom{q}{m}$$





# Expected size of CP: Example $m=6, q=2$

