



Sets with Bounded Cardinality

Jimmy Lee & Peter Stuckey



SetSelect Question Revised (baguaBounded-10-8.dzn)

- ⌘ Given a subset of numbers $1..nSpots$ for each symbol in SYMB, choose a subset of $1..nSpots$ **of at most size** size which includes at most one from each subset and maximize the damage points of the chosen set

```
nSpots = 10;  
damage = [10, 8, 4, 2, 6, 9, 5, 3, 8, 10];  
size = 3;  
SYMB = {'天', '澤', '火', '雷', '風', '水', '山', '地'};  
group = [{1,4,6}, {1,2,6,7}, {1,3,6,8}, {1,2,3},  
          {2,9,10}, {5,6,8,10}, {7,8,10}, {1,3,5}];
```



Bounded Cardinality Model (baguaBoundedSet.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

var set of SPOT: attacks;

constraint forall(s in SYMB)
    (card(attacks intersect group[s]) <= 1);
constraint card(attacks) <= size;

var int: totalDamages =
    sum(p in attacks) (damage[p]);
solve maximize (totalDamages);
```

3

Bounded Cardinality Model (baguaBoundedSet.mzn)

⌘ Executing the model

```
attacks: {1,10} & damage: 20;
```

4



Deciding a Set of Bounded Cardinality

- ⌘ What about an integer model?
- ⌘ An array of `size` values
 - `array[1..size] of var SPOTx: attacks`
 - extended SPOT: $SPOTx = SPOT \cup \{ \text{extra-value} \}$
 - extra value represents: no element
- ⌘ For example: $SPOT = 1..nSpots$
 - $SPOTx = 0..nSpots$

5

Two Critical Issues

- ⌘ Each solution in the model represents a solution in the problem
 - $[3,0,3]$ ✗ no repeated values
 - $[0,2,0]$ ✓ repeated extra values are OK
- ⌘ Each solution in the problem has just one solution representative in the model
 - $[0,2,0], [0,0,2], [2,0,0] = \{2\}$ ✗
 - $[0,1,2], [0,2,1], [1,0,2], [1,2,0], [2,0,1], [2,1,0]$ ✗
- ⌘ Add constraints to fix these issues

6



Bounded Cardinality Constraints

⌘ Constraints to fix

```
array[1..size] of var SPOTx: attacks;
```

⌘ Just order the values (decreasing)

```
forall(i in 1..size-1)  
  (attacks[i] > attacks[i+1]);
```

- ✗ No representative left for {2} e.g. [2,0,0]

⌘ No strict ordering

```
forall(i in 1..size-1)  
  (attacks[i] >= attacks[i+1]);
```

- ✗ solutions with repeats [3,2,2]

7

Bounded Cardinality Constraints

⌘ Combine the two: repeats of 0 allowed

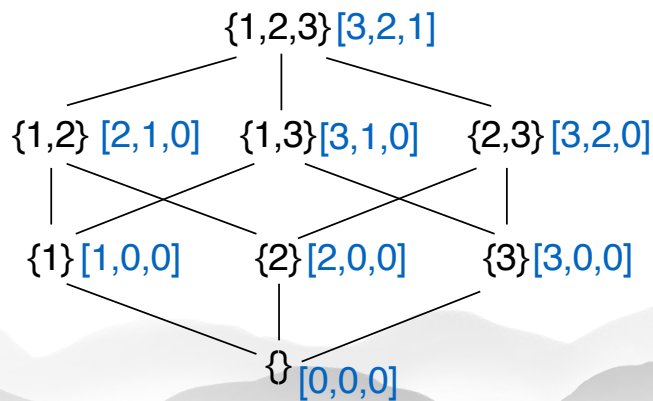
```
forall(i in 1..size-1)  
  (attacks[i] >=  
    (attacks[i] != 0) + attacks[i+1]);
```

8

Bounded Cardinality Representation

⌘ Representing `var set of {1,2,3}: x;`

`array[1..3] of var 0..3: x;`



9

Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

set of int: SPOTx = {0} union SPOT;
array[1..size] of var SPOTx: attacks;

constraint forall(i in 1..size-1) (attacks[i] >=
    (attacks[i] != 0) + attacks[i+1]);
constraint forall(s in SYMB) (sum(i in 1..size)
    (attacks[i] in group[s]) <= 1);

var int: totalDamages =
    sum(p in attacks) (damage[p]);
solve maximize (totalDamages);
```

10



Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;  
set of int: SPOT = 1..nSpots;  
array[SPOT] of int: damage;  
enum SYMB;  
array[SYMB] of set of SPOT: group;  
int: size;
```

Decisions

```
set of int: SPOTx = {0} union SPOT;  
array[1..size] of var SPOTx: attacks;
```

```
constraint forall(i in 1..size-1) (attacks[i] >=  
    (attacks[i] != 0) + attacks[i+1]);  
constraint forall(s in SYMB) (sum(i in 1..size)  
    (attacks[i] in group[s]) <= 1);
```

```
var int: totalDamages =  
    sum(p in attacks) (damage[p]);  
solve maximize (totalDamages);
```

11

Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;  
set of int: SPOT = 1..nSpots;  
array[SPOT] of int: damage;  
enum SYMB;  
array[SYMB] of set of SPOT: group;  
int: size;
```

Valid
representations

```
set of int: SPOTx = {0} union SPOT;  
array[1..size] of var SPOTx: attacks;
```

```
constraint forall(i in 1..size-1) (attacks[i] >=  
    (attacks[i] != 0) + attacks[i+1]);  
constraint forall(s in SYMB) (sum(i in 1..size)  
    (attacks[i] in group[s]) <= 1);
```

```
var int: totalDamages =  
    sum(p in attacks) (damage[p]);  
solve maximize (totalDamages);
```

12



Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

set of int: SPOTx = {0} union SPOT;
array[1..size] of var SPOTx: attacks;

constraint forall(i in 1..size-1) (attacks[i] >=
    (attacks[i] != 0) + attacks[i+1]);
constraint forall(s in SYMB) (sum(i in 1..size)
    (attacks[i] in group[s]) <= 1);

var int: totalDamages =
    sum(p in attacks) (damage[p]);
solve maximize (totalDamages);
```

At most one
intersection

13

Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

set of int: SPOTx = {0} union SPOT;
array[1..size] of var SPOTx: attacks;

constraint forall(i in 1..size-1) (attacks[i] >=
    (attacks[i] != 0) + attacks[i+1]);
constraint forall(s in SYMB) (sum(i in 1..size)
    (attacks[i] in group[s]) <= 1);

var int: totalDamages =
    sum(p in attacks) (damage[p]);
solve maximize (totalDamages);
```

Objective

14



Solving the Model

⌘ Executing the model

```
attacks: [9,7,5] & damage: 19;
```

15

Solving the model

⌘ Executing the model

```
attacks: [9,7,5] & damage: 19;
```

Wait a minute ...

⌘ Shouldn't we get instead the following?

```
attacks = [10,1,0] & damage: 20;
```

16



Bounded Cardinality Model (baguaBoundedIntW.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

set of int: SPOTx = {0} union SPOT;
array[1..size] of var SPOTx: attacks;

constraint forall(i in 1..size-1) (attacks[i] >=
    (attacks[i] != 0) + attacks[i+1]);
constraint forall(s in SYMB) (sum(i in 1..size)
    (attacks[i] in group[s]) <= 1);

var int: totalDamages =
    sum(p in attacks) (damage[p]);
solve maximize (totalDamages);
```

17

Bounded Cardinality Model (baguaBoundedInt.mzn)

```
int: nSpots;
set of int: SPOT = 1..nSpots;
array[SPOT] of int: damage;
enum SYMB;
array[SYMB] of set of SPOT: group;
int: size;

set of int: SPOTx = {0} union SPOT;
array[1..size] of var SPOTx: attacks;

constraint forall(i in 1..size-1) (attacks[i] >=
    (attacks[i] != 0) + attacks[i+1]);
constraint forall(s in SYMB) (sum(i in 1..size)
    (attacks[i] in group[s]) <= 1);

var int: totalDamages =
    sum(p in attacks where p > 0) (damage[p]);
solve maximize (totalDamages);
```

18



Summary

⌘ There are multiple ways to represent sets

- var set of OBJ
 - good if the solver natively supports sets
 - good when OBJ is not too big
- array[OBJ] of var bool / 0..1
 - good when OBJ is not too big
- array[1..u] of var OBJ
 - only for fixed cardinality u
 - good when u is small
- array[1..u] of var OBJx
 - need to represent the “null” object

19

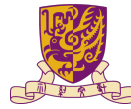
Summary

- ⌘ The SetSelect problem (without cardinality constraints) is known as the weighted set packing problem a well studied NP complete problem from combinatorics
- ⌘ Set packing is the dual of set covering, one of the most studied combinatorics problems

20



THE UNIVERSITY OF
MELBOURNE



香港中文大學
The Chinese University of Hong Kong

Image Credits

All graphics by Marti Wong, ©The Chinese University of Hong Kong and the University of Melbourne 2016

21