Topic 2: Basic Modelling (Version of 5th December 2018)

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Course 1DL441:

Combinatorial Optimisation and Constraint Programming,

whose part 1 is Course 1DL451:

Modelling for Combinatorial Optimisation



Outline

The MiniZinc Language

Modelling

Set Variables &Constraints 1. The MiniZinc Language

2. Modelling



Outline

The MiniZinc Language

Modelling

Set Variables &Constraints

1. The MiniZinc Language

2. Modelling



MiniZinc Model

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Set Variables &Constraints A MiniZinc model may comprise the following items:

- Parameter declarations
- Variable declarations
- Predicate and function definitions
- Constraints
- Objective
- Output command



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Types for Parameters

MiniZinc is strongly typed. The parameter types are:

- int: integer
- bool: Boolean
- enum: enumeration
- float: floating-point number
- string: string of characters
- set of τ : set of elements of type τ , which is int, bool, enum, float, or string
- array $[\rho]$ of τ : possibly multidimensional array of elements of type τ , which is not an array; each range in ρ is an enumeration or an integer interval $\alpha . . \beta$

Example

The parameter declaration int: n declares an integer parameter of identifier n. One can also write par int: n in order to emphasise that n is a parameter.



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Set Variables &Constraints

Types for (Decision) Variables

Decision variables are implicitly existentially quantified: the aim is to find satisfying (optimal) values in their domains.

The variable types for decision variables are:

- int: integer
- bool: Boolean
- enum: enumeration
- float: floating-point number (not used in this course)
- set of enum and set of int: set

A possibly multidimensional array can be declared to have variables of any variable type, but it is itself not a variable.

Example

The variable declaration var int: n declares a decision variable of domain int and identifier n.

Tight variable domains may accelerate the solving: see the next slides for how to do that.



Literals

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Modelling

Set Variables &Constraints The following literals (or: constants) can be used:

- Boolean: true and false
- Integers: in decimal, hexadecimal, or octal format
- Sets: between curly braces, for example {1,3,5}, or as integer intervals, for example 10..30
- 1d arrays: between square brackets, say [6,3,1,7]
- 2d arrays: A vertical bar | is used before the first row, between rows, and after the last row; for example [|11,12,13,14|21,22,23,24|31,32,33,34|]
- For higher-dimensional arrays, see slide 11

Careful: The indices of arrays start from 1 by default.



Declarations of Parameters and Variables

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```
1 int: n = 4;
2 par int: p;
3 p = 10;
4 set of int: Primes = {2,3,5,7,11,13};
5 var int: x;
6 var 0..23: hour = x + n;
7 var set of Primes: Taken;
```

- A parameter must be instantiated, once, to a literal; its declaration can be separated from its instantiation in the model (p), a datafile, the command line, or the IDE.
- A variable can be constrained at its declaration (hour).
- The domain of a decision variable can be tightened by replacing its type by a set of values of that type:
 - x must take an integer value.
 - hour must take an integer value between 0 and 23.
 - Taken must be a subset of {2,3,5,7,11,13}.



Array and Set Comprehensions

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Set Variables &Constraints An array or set can be built by a comprehension, using the notation $[\sigma|\gamma]$ or $\{\sigma|\gamma\}$, where σ is an expression evaluated for each element generated by the generator γ : a generator introduces one or more identifiers with values drawn from integer sets, optionally followed by a test.

Examples

```
1 [x * 2 | x in 1..8]
2     evaluates to [2,4,6,8,10,12,14,16]
3 [x * y | x, y in 1..3 where x < y]
4     evaluates to [2,3,6]
5 [x + 2*y | x in 1..3, y in 1..4]
6     evaluates to [3,5,7,9,4,6,8,10,5,7,9,11]
7 {x + 2*y | x in 1..3, y in 1..4}
8     evaluates to {3,4,5,6,7,8,9,10,11}</pre>
```



Indexing: Syntactic Sugar

For example,

sum(i, j in 1...5)(i*j)

is syntactic sugar for

sum([i*j | i, j in 1..5])

This works for any function or predicate that takes an array as unique argument. In particular:

```
forall(i in 1..9) (x[i+1] = x[i] + y[i]);
```

is syntactic sugar for

```
forall([x[i+1] = x[i] + y[i] | i in 1...9]);
```

where forall (array[int] of var bool: B) is a function that returns the conjunction of all expressions in B: it generalises the 2-ary logical-and connective $(/\)$.

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Array Manipulation

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Set Variables &Constraints Changing the number of dimensions and their ranges, provided the numbers of elements match:

```
array1d(5..10,[|3,2|5,4|6,1|])
array2d(1..2,1..3,[2,7,3,7,4,9])
and so on, until array6d.
```

Tip: Try and keep your ranges starting from 1:

- It is easier to read a model under this usual convention.
- · Subtle errors may occur otherwise.
- \blacksquare Concatenation: for example, [1,2] ++ [3,4].



Subtyping

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Set Variables &Constraints A parameter can be used wherever a variable is expected. This extends to arrays: for example, a predicate or function expecting an argument of type <code>array[int]</code> of <code>var int</code> can be passed an argument of type <code>array[int]</code> of <code>int</code>.

The types bool and int are disjoint, but one can coerce from bool to int using the bool2int function:

bool2int(false) = 0 and bool2int(true) = 1.

This coercion is automatic but should be explicit for clarity.

In mathematics we use the Iverson bracket for this purpose: we define $[\phi] = 1$ iff formula ϕ is true, and $[\phi] = 0$ otherwise.



Option Variables

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Set Variables &Constraints An option variable is a decision variable that can also take the special value \perp , to be read "bottom".

A variable is declared optional with the keyword opt.

For example, var opt 1..4: x declares a variable x of domain $\{1, 2, 3, 4, \bot\}$.

We will not cover the use of option variables in this course. However, one can see them:

- In the documentation:

 var int is a subtype of var opt int.
- In error messages:
 This is probably a sign that a model is too complicated.



Constraints

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Modelling

Set Variables &Constraints A constraint is the keyword constraint followed by a Boolean expression that must be true in every solution.

Examples

```
constraint x < y;
constraint sum(Q) = 0 /\ alldifferent(Q);
constraint if x < y then x = y else x > y endif;
```

Constraints separated by a semi-colon (;) are implicitly connected by the 2-ary logical-and connective ($/ \$).

What does constraint x = x + 1 mean? MiniZinc is declarative and has no destructive assignment: this equality constraint is not satisfied by any value for x.



Objective

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Set Variables &Constraints The solve item gives the objective of the problem:

- solve satisfy;
 The objective is to solve a satisfaction problem.
- solve minimize x;
 The objective is to minimise the value of variable x.
- solve maximize abs(x) * y;

 The objective is to maximise the value of the expression abs(x) * y.

MiniZinc does not support multi-objective optimisation yet: multiple objective functions must either be aggregated into a weighted sum, or be handled outside a MiniZinc model.



Output Command

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Set Variables &Constraints The output item prescribes what to print upon finding a solution: the keyword output is followed by a string array.

```
output [show(X)];
```

The function show returns a string representing the value of its argument expression.

```
output ["solution:"] ++ [if X[i]>0 then show(2*X[i])
++ ", " else " , " endif | i in 1..10];
```

The operator ++ concatenates two strings or two arrays.

```
"X = (X), " is equivalent to "X = "++show(X) ++",".
```



Tests

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Set Variables &Constraints Conditional expressions can be formulated as follows:

- Conditional: if θ then ϕ_1 else ϕ_2 endif
- Comprehension: [i | i in ρ where θ]

The expressions ϕ_1 and ϕ_2 must have the same type. Strong warning: The test θ after if or where can depend on variables: with great power comes great responsibility! For example:

```
enum N; set of int: M; array[N] of var M: X;
array[S] of var M: Y = [X[i] | i in N where X[i]>0];
constraint sum(Y) < 7;</pre>
```

This yields an error message with var opt (see slide 13) as the indices s cannot be determined when flattening and cannot just be set to s. But the following variant works:

```
constraint sum([X[i] | i in N where X[i]>0]) < 7;
```



Operators and Functions

The MiniZinc Language

Modelling

- Booleans: not, /\, \/, <->, ->, <-, xor, forall, exists, xorall, iffall, clause, bool2int Avoid arbitrarily nested Boolean expressions, such as forall...exists...forall...!
- Integers: +, -, *, div, mod, abs, pow, min, max, sum,
 product, =, <, <=, =>, >, !=, ...
 Avoid div, mod, and pow on variables, if possible!
- Sets: union, intersect, diff, symdiff, card, in, subset, superset, set2array, array_union, array intersect
- Strings: ++, concat, join
- Arrays: length, index_set, index_set_1of2, index_set_2of2,..., index_set_6of6, array1d, array2d,..., array6d



Predicates and Functions

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Set Variables &Constraints MiniZinc offers a large collection of predefined predicates and functions to enable a medium level at which models can be formulated: see Topic 3: Constraint Predicates.

Each predefined constrained function is defined by the use of the corresponding constraint predicate, possibly upon introducing a new variable.

Example

count (A, v) > m is replaced by count (A, v, c) / c > m.

It is also possible for modellers to define their own functions and predicates, as discussed at slide 24.



Reification

Reification enables the reasoning about the truth of a constraint or a Boolean expression.

Example

constraint x < y;

requires that x be smaller than y.

```
constraint b <-> x < y;
```

requires that the Boolean variable b be true if and only if (iff) x is smaller than y: the constraint x < y is said to be reified, and b is called its reification.

Reification is a powerful mechanism that enables:

- higher-level modelling;
- easier implementation of the logical connectives.

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The expression bool2int (γ) , for a constraint or Boolean expression γ , is an integer expression, with the truth of γ represented by 1 and its falsity by 0.

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Set Variables &Constraints

Example (Cardinality constraint)

Constrain one or two of three constraints γ_1 , γ_2 , γ_3 to hold: bool2int (γ_1) +bool2int (γ_2) +bool2int (γ_3) in {1,2}

Reification comes with some drawbacks:

- Inference and relaxation may be poor: slow solving.
- Not all constraints can be reified in MiniZinc.

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Photo Problem)

An enumeration Persons of n people lines up for a photo. array[1..q,1..2] of Persons: Pref;

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Set Variables &Constraints Preference k in 1..q denotes that person Pref[k, 1] wants to be next to person Pref[k, 2]. Maximise the number of satisfied preferences.

Let decision variable Pos[p] denote the position in 1..n, in left-to-right order, of person p in Persons on the photo.

The array Pos must form a permutation of the positions:

```
constraint alldifferent(Pos);
```

The objective is:

```
solve maximize sum(k in 1..q)
( bool2int(abs(Pos[Pref[k,1]]-Pos[Pref[k,2]])=1));
```



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wodening

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solve maximize sum(k in 1..q)
(          bool2int(abs(Pos[Pref[k,1]]-Pos[Pref[k,2]])=1));
```



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Set Variables &Constraints

Example (Soft Constraints: Weighted Photo Problem)

An enumeration Persons of n people lines up for a photo.

array[1..q,1..2] of Persons: Pref;

array[1..q] of int: Weight;

Preference k in 1..q denotes that person Pref[k,1]

wants to pay Weight[k] to be next to person Pref[k,2].

Maximise the weighted number of satisfied preferences.

Let decision variable Pos[p] denote the position in 1..n, in left-to-right order, of person p in Persons on the photo.

The array Pos must form a permutation of the positions:

```
constraint alldifferent (Pos);
```

The objective is:

```
solve maximize sum(k in 1..q)
(          bool2int(abs(Pos[Pref[k,1]]-Pos[Pref[k,2]])=1));
```



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Set Variables &Constraints

Example (Soft Constraints: Weighted Photo Problem)

An enumeration Persons of n people lines up for a photo.

array[1..q,1..2] of Persons: Pref;

array[1..q] of int: Weight;

Preference k in 1..q denotes that person Pref[k,1]

wants to pay Weight[k] to be next to person Pref[k,2].

Maximise the weighted number of satisfied preferences.

Let decision variable Pos[p] denote the position in 1..n, in left-to-right order, of person p in Persons on the photo.

The array Pos must form a permutation of the positions:

```
constraint alldifferent (Pos);
```

The objective is:

```
solve maximize sum(k in 1..q)
(Weight[k]*bool2int(abs(Pos[Pref[k,1]]-Pos[Pref[k,2]])=1));
```



Example (Sum of reified constraints)

The expression sum(i in 1..n) (bool2int(A[i]=v)) denotes the number of elements of array A that equal v.

This idiom is very common in constraint-based models. So:

Example (The count constraint predicate)

The constraint count(A, v, c) holds iff variable c has the number of variables of array A that equal variable v.

For other predicates, see Topic 3: Constraint Predicates.

Example (The count constrained function)

The expression count(A, v) denotes the number of variables of array A that equal variable v.

Functional constraint predicates are available as functions.

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Predicate and Function Definitions

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```
Examples
```

```
function int: double(int: x);
function var int: double(var int: x);

predicate pos(var int: x);
function var bool: neg(var int: x);
```

A predicate can be used as a function returning var bool. For example, bool2int (pos(a)) can be used.

Function and predicate names can be overloaded.



The body of a predicate or function definition is an expression of the same type as the returned value.

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```
Examples
```

```
function int: double(int: x) = 2 * x;
function var int: double(var int: x) = 2*x;

predicate pos(var int: x) = x > 0;
function var bool: neg(var int: x) = x < 0;</pre>
```

One can use if ... then ... else ... endif, predicates and functions, such as forall and exists, as well as let expressions (see next slide) in the body of a predicate or function definition.



Let Expressions

One can introduce local identifiers with a let expression.

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```
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```

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```
1 function int: double(int: x) =
 let { int: y = 2 * x } in y;
3
4 function var int: double(var int: x) =
 let { var int: y = 2 * x } in y;
6
7 function var int: double(var int: x) =
   let { var int: y;
          constraint y = 2 * x
   } in y;
10
```

The 2nd and 3rd functions are equivalent: each use adds a decision variable to the model.



Constraints in Let Expressions

What is the difference between the next two definitions?

```
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```

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```
predicate posProd(var int: x, var int: y) =
let { var int: z; constraint z = x * y
} in z > 0;

predicate posProd(var int: x, var int: y) =
let { var int: z
} in z = x * y /\ z > 0;
```

Their behaviour is different in a negative context, such as not posProd(a,b):

- The 1st one then ensures a * b = z / z <= 0.
- The 2nd one then ensures a * b != z \/ z <= 0 and leaves a and b unconstrained



Using Predicates and Functions

Advantages of using predicates and functions in a model:

- Software engineering good practice:
 - Reusability
 - Readability
 - Modularity
- The model might be solved more efficiently:
 - Better common-subexpression elimination.
 - The definitions can be technology- or solver-specific.
 If a predefined constraint predicate is a built-in of a solver, then its solver-specific definition is empty!

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Remarks

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- The order of model items does not matter.
- One can include other files.
 Example: include "globals.mzn".
- The following functions are useful for debugging:
 - assert (θ , "error message") If the Boolean expression θ evaluates to false, then abort with the error message, otherwise return true.
 - trace ("message", ϕ)
 Print the message and return the expression ϕ .
 - . . .



Other Modelling Languages

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- OPL: https://www.ibm.com/analytics/ optimization-modeling-interfaces
- Comet: https://mitpress.mit.edu/books/constraint-based-local-search
- Essence and Essence':
 https://constraintmodelling.org
- Zinc: https://dx.doi.org/10.1007/s10601-008-9041-4
- AIMMS: https://aimms.com
- AMPL: https://ampl.com
- FICO Xpress Insight: https://www.fico.com/en/products/fico-xpress-insight
- GAMS: https://gams.com
- SMT-lib: http://www.smt-lib.org
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Outline

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From a Problem to a Model

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Set Variables &Constraints What is a good model for a constraint problem?

- A model that correctly represents the problem
- A model that is easy to understand and maintain
- A model that is solved efficiently, that is:
 - short solving time to find one, all, or best solution(s)
 - · good solution within a limited amount of time
 - small search space (under constructive search)

Food for thought: What is correct, easy, short, good, ...?



Modelling Issues

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Set Variables &Constraints Modelling is still more an Art than a Science:

- Choice of the decision variables and their domains
- Choice of the constraint predicates, in order to model the objective function, if any, and the constraints
- Optional for CP and LCG:
 - Choice of the consistency for each constraint
 - Choice of the variable selection strategy for search
 - Choice of the value selection strategy for search

See Topic 8: Inference & Search in CP & LCG.

Make the model correct before making it efficient!



Choice of the Decision Variables

Examples (Alphametic Problems)

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Set Variables &Constraints SEND + MORE = MONEY:

Model without carry variables: 19 of 23 CP nodes visited:

$$1000 \cdot (S+M) + 100 \cdot (E+O) + 10 \cdot (N+R) + (D+E)$$

= 10000 \cdot M + 1000 \cdot O + 100 \cdot N + 10 \cdot E + Y

Model with carry variables: 23 of 29 CP nodes are visited:

$$D + E = 10 \cdot C_1 + Y \wedge N + R + C_1 = 10 \cdot C_2 + E$$

$$\wedge E + O + C_2 = 10 \cdot C_3 + N \wedge S + M + C_3 = 10 \cdot M + O$$

GERALD + DONALD = ROBERT:

The model with carry variables is more effective in CP: only 791 of 869 nodes are visited, rather than 13,795 of 16,651 search nodes for the model without carry variables.



Choice of the Constraint Predicates

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Set Variables &Constraints

Example (The alldifferent constraint predicate)

The constraint alldifferent ([A[i] | i in 1..n]) usually leads to faster solving than its definition by a conjunction of $\Theta(n^2)$ disequality constraints:

```
forall(i, j in 1..n where i < j) (A[i]!=A[j])
```

For more examples, see Topic 3: Constraint Predicates.



Guidelines: Reveal Problem Structure

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Modelling

Set Variables &Constraints

- Use few decision variables.
- Give tight domains to the decision variables.
- Avoid division and power constraints (div, mod, pow).
- Avoid the disjunction of constraints $(\/\/, <-, ->, <->)$.
- Express the problem concisely (Topic 3: Constraint Predicates).
- Precompute solutions to a sub-problem into a table (Topic 3: Constraint Predicates, Topic 4: Modelling).
- Use implied constraints (Topic 4: Modelling).
- Use different viewpoints (Topic 4: Modelling).
- Exploit symmetries (Topic 5: Symmetry).

Careful: These guidelines of course have their exceptions! It is important to test empirically several combinations of model, solver, and solving technology.



Use Few Decision Variables

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Set Variables &Constraints When appropriate, use a single integer variable instead of an array of Boolean variables:

Example

Assume Joe must be assigned to exactly one task in 1..n:

- Use a single integer variable, var 1..n: joesTask, representing which task Joe is assigned to.
- Don't use array[1..n] of var bool:joesTask, each element joesTask[t] representing whether (true) or not (false) Joe is assigned to task t, plus count (joesTask, true) = 1.

When appropriate, use a single set variable instead of an array of Boolean or integer variables: see slides 46 and 48.



Give Tight Domains to the Variables

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Modelling

Set Variables &Constraints Without doing all the work of the solver, manually tightening the domains of the variables may accelerate the solving. In particular, try and avoid var int:

Example

If the integer variable s represents the starting time of some task, then declare its domain with var 0..horizon: s, where horizon is suitably large, rather than var int: s.

Domain information may be exploited during flattening, so avoid setting a domain by constraints:

Counterexample

Do not reformulate var 0..horizon: s as follows:

```
var int: s; constraint 0<=s /\ s<=horizon;</pre>
```



Avoid Division and Power Constraints

The use of div and mod often slows the solving down. Try and use \star or table (see Topic 3: Constraint Predicates).

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Example

Modelling

Set Variables &Constraints

```
constraint q = x \operatorname{div} k / r = x \operatorname{mod} k;
over variables x, q, r and parameter k is equivalent to
  constraint x = q * k + r; var 0..k-1: r;
Similarly,
  solve minimize sum(X) div n; % minimise the average
over n variables X[i] and parameter n is equivalent to
  solve minimize sum(X); % minimise the sum
  output [show(sum(X) div n)]; % output the average
```

Try and avoid constraints containing pow(x, y) for x^y .



Avoid the Disjunction of Constraints

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Set Variables &Constraints The disjunctive combination of constraints (with \setminus /, <-, ->, or <->) often makes the solving slow. Try and express disjunctive combinations of constraints otherwise.

Example

```
constraint x = 0 \/ x = 9;
is logically equivalent to
  constraint x in {0,9};
and, even better, to
```

var {0,9}: x;

Disjunction or other sources of slow solving may also be introduced by not, so try and avoid negation as well.



Example

The MiniZinc Language

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Set Variables &Constraints

```
constraint b \rightarrow x = 9;
constraint (not b) \rightarrow x = 0;
```

is logically equivalent to (recall that bool2int (true) =1)

```
constraint x = 9 * bool2int(b);
```

and to (note that array indexing starts at 1)

```
constraint x = [0, 9][1+bool2int(b)];
```

But beware of such premature fine-tuning of a model!

The following versions are clearer and often good enough:

```
constraint x = if b then 9 else 0 endif;
```

and

```
constraint if b then x=9 else x=0 endif;
```



Express the Problem Concisely

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Modelling

Set Variables &Constraints Whenever possible, use a single predefined constraint predicate instead of a long-winded formulation.

Example (The alldifferent constraint predicate)

The constraint alldifferent ([A[i] | i in 1..n]) usually leads to faster solving than its definition by a conjunction of $\Theta(n^2)$ disequality constraints:

```
forall(i, j in 1... where i < j) (A[i]!=A[j])
```

For more examples, see Topic 3: Constraint Predicates.



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3. Set Variables & Constraints



Motivating Example 1

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Set Variables &Constraints

Example (Agricultural experiment design, AED)

	plot1	plot2	plot3	plot4	plot5	plot6	plot7
barley							
corn							
millet							
oats							
rye							
spelt wheat							
wheat							

Constraints to be satisfied:

- 1 Equal growth load: Every plot grows 3 grains.
- 2 Equal sample size: Every grain is grown in 3 plots.
- 3 Balance: Every grain pair is grown in 1 common plot.

Instance: 7 plots, 7 grains, 3 grains/plot, 3 plots/grain, balance 1.



Motivating Example 1

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Example (Agricultural experiment design, AED)

	plot1	plot2	plot3	plot4	plot5	plot6	plot7
barley	√	1	✓	_	_	_	_
corn	✓	_	_	✓	✓	_	_
millet	✓	_	_	_	_	✓	✓
oats	_	1	_	✓	_	✓	_
rye	_	1	_	_	✓	_	✓
spelt	_	_	✓	\	_	ı	✓
wheat	_	_	√	_	1	1	_

Constraints to be satisfied:

- 1 Equal growth load: Every plot grows 3 grains.
- 2 Equal sample size: Every grain is grown in 3 plots.
- 3 Balance: Every grain pair is grown in 1 common plot.

Instance: 7 plots, 7 grains, 3 grains/plot, 3 plots/grain, balance 1.



Example (BIBD *integer* model: $\checkmark \rightsquigarrow 1$ and $- \rightsquigarrow 0$)

```
The MiniZinc
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```

Set Variables &Constraints

```
1 int: nbrBlocks; int: nbrVarieties;
2 set of int: Blocks = 1..nbrBlocks;
3 set of int: Varieties = 1..nbrVarieties;
4 int: blockSize; int: sampleSize; int: balance;
5 array[Varieties,Blocks] of var 0..1: BIBD;
6 solve satisfy;
7 constraint forall(b in Blocks)
8 (blockSize = sum(BIBD[..,b]));
9 constraint forall(v in Varieties)
10 (sampleSize = sum(BIBD[v,.]));
11 constraint forall(v, w in Varieties where v < w)
12 (balance = sum(b in Blocks) (BIBD[v,b]*BIBD[e,b]));</pre>
```

At Topic 1: Introduction, we used count instead of sum.

Example (Instance data for our AED)

```
1 nbrBlocks = 7; nbrVarieties = 7;
2 blockSize = 3; sampleSize = 3; balance = 1;
```



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Set Variables &Constraints

Example (Idea for another BIBD model)

barley	{plot1, plot2, plo	}	
corn	{plot1,	plot4, plot5	}
millet	{plot1,	plot6	s, plot7}
oats	{ plot2,	plot4, plot6	}
rye	{ plot2,	plot5,	plot7}
spelt	{ plo	plot7}	
wheat	{ plo	ot3, plot5, plot6	}

Constraints to be satisfied:

- 1 Equal growth load: Every plot grows 3 grains.
- Equal sample size: Every grain is grown in 3 plots.
- 3 Balance: Every grain pair is grown in 1 common plot.

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Example (BIBD set model: a block set per variety)

```
1 . . .
3 . . .
5 array[Varieties] of var set of Blocks: BIBD;
6 . . .
7 . . .
8 (blockSize =
    sum(v in Varieties)(bool2int(b in BIBD[v]));
10 (sampleSize = card(BIBD[v]));
11
12 (balance = card(BIBD[v] intersect BIBD[w]));
```

At Topic 1: Introduction, bool2int was not covered yet.

Example (Instance data for our AED)

```
1 nbrBlocks = 7; nbrVarieties = 7;
2 blockSize = 3; sampleSize = 3; balance = 1;
```



Motivating Example 2¹

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Set Variables &Constraints

Example (Hamming code: problem)

The Hamming distance between two same-length strings is the number of positions at which the two strings differ. Examples: h(10001, 01001) = 2 and h(11010, 11110) = 1.

ASCII has codewords of m = 8 bits for $n = 2^m$ symbols, but the least Hamming distance is d = 1: no robustness!

Toward high robustness in data transmission, we want to generate a codeword of m bits for each of the n symbols of an alphabet, such that the Hamming distance between any two codewords is at least some given constant d.

¹Based on material by Christian Schulte



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Example (Hamming code: model)

We encode a codeword of m bits as the set of positions of its unit bits, the least significant bit being at position 1. Example: 10001 is encoded as $\{1,5\}$, and 01001 as $\{1,4\}$. In general: $b_m \cdots b_1$ is encoded as $\{1 \cdot b_1, \ldots, m \cdot b_m\} \setminus \{0\}$. So the Hamming distance between two codewords is u - i, where u is the size of the union of their encodings and i is the size of the intersection of their encodings, that is the size of the symmetric difference of their encodings. Hence:

```
array[1..n] of var set of 1..m: C;
constraint forall(i, j in 1..n where i < j)
  (card(C[i] symdiff C[j]) >= d);
```

Definition

A set (decision) variable takes a set as value, and has a set of sets as domain. For its domain to be finite, a set variable must be a subset of a finite set.



Set-constraint predicates exist for the following semantics:

■ Cardinality: |S| = n

■ Membership: $n \in S$

■ Equality: $S_1 = S_2$

■ Disequality $S_1 \neq S_2$

■ Subset: $S_1 \subseteq S_2$

■ Union: $S_1 \cup S_2 = S_3$

■ Intersection: $S_1 \cap S_2 = S_3$

■ Difference: $S_1 \setminus S_2 = S_3$

■ Symmetric difference: $(S_1 \cup S_2) \setminus (S_1 \cap S_2) = S_3$

■ Order: $S_1 \subseteq S_2 \vee \min((S_1 \setminus S_2) \cup (S_2 \setminus S_1)) \in S_1$

■ Strict order: $S_1 \subset S_2 \vee \min((S_1 \setminus S_2) \cup (S_2 \setminus S_1)) \in S_1$

where the S_i are set variables and n is an integer variable. Avoid set variables in M4CO: few solvers support them well.

Language Modelling

The MiniZinc

Set Variables &Constraints