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MELBOURNE



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Multiple Modeling

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Judging Heroes Cooking Wine



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The Joy of Food-Wine Pairing



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Another Pure Assignment Problem

- ⌘ To determine a function $f: \text{DOM} \rightarrow \text{COD}$ again
 - DOM = food and COD = wine
- ⌘ Constraint: Pair up each dish with a different drink
- ⌘ Objective: maximize the joyfulness of the culinary (and political) occasion

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The Cooking Wine Problem (foodToWine.mzn)

```
include "globals.mzn";

enum FOOD;
enum WINE;
array[FOOD, WINE] of int: joy;

array[FOOD] of var WINE: drink;

constraint alldifferent(drink);

solve maximize sum(f in FOOD)(joy[f, drink[f]]);
```

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Solving the Food-Wine Model

```
Pair Food CHILIFISHHEAD with Wine HUADIAO
Pair Food MAPOTOFU with Wine GRAPE
Pair Food SNAKESOUP with Wine RICE
Pair Food GONGBAOFROG with Wine GAOLIANG
```

```
Joy: 21
-----
=====
```

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Multiple Models

- Discrete optimization problems often have
 - multiple viewpoints on the same problem
- We can build two (or more) completely distinct models to solve the same problem
- We can also combine them

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Viewpoints

- Function $f: \text{DOM} \rightarrow \text{COD}$ is special when
 - $|\text{DOM}| = |\text{COD}|$
 - Function f is a bijection
- A viewpoint looks at the decisions of the problem from a specific angle
- This is a complete matching:
 - match each d in DOM with a different c in COD
 - or, equivalently, match each c in COD with a different d in DOM
 - two different viewpoints \implies two complementary models

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Complete Matching

- ⌘ A bijective function has **two viewpoints**
- ⌘ The (usual) function
`array[DOM] of var COD: f;`
- ⌘ And the **inverse** function
`array[COD] of var DOM: finv;`
- ⌘ As much as we can pair drinks to food, we can also pair food to drinks
- ⌘ In the **Cooking Wine** problem, the inverse function is

```
array[WINE] of var FOOD: eat;
```

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The Cooking Wine Problem (wineToFood.mzn)

```
include "globals.mzn";

enum FOOD;
enum WINE;
array[FOOD, WINE] of int: joy;

array[WINE] of var FOOD: eat;

constraint alldifferent(eat);

solve maximize sum(w in WINE)(joy[eat[w], w]);
```

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Solving the Inverse Wine-Food Model

```
Pair Food MAPOTOFU with Wine GRAPE
Pair Food SNAKESOUF with Wine RICE
Pair Food GONGBAOFROG with Wine GAOLIANG
Pair Food CHILIFISHHEAD with Wine HUADIAO
```

```
Joy: 21
-----
=====
```

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Matching Food and Wine

⌘ Which model is likely better?

- Original

```
alldifferent(drink);
maximize sum(f in FOOD) (joy[f, drink[f]]);
```

- Inverse

```
alldifferent(eat);
maximize sum(w in WINE) (joy[eat[w], w]);
```

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Channeling Constraints

- ⌘ Some constraints of the problem may be easier to express using the function, or its inverse
- ⌘ Why not **use both**!?

- ⌘ We can **combine** the two models
- ⌘ We need to make the two functions agree by using **channeling constraints**

```
forall(w in WINE, f in FOOD)
  (eat[w] = f <->
   drink[f] = w);
```

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Combining Models Using **inverse**

- ⌘ This channeling can also be captured by the global constraint
 - `inverse(eat, drink)`
 - **or** `inverse(drink, eat)`
 - Note we can **remove** the `alldifferent` constraints, made redundant by `inverse`
- ⌘ **Why** would we combine models?

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The Cooking Wine Problem (combined.mzn)

```
include "globals.mzn";

enum FOOD;
enum WINE;
array[FOOD, WINE] of int: joy;

array[FOOD] of var WINE: drink;
array[WINE] of var FOOD: eat;

constraint inverse(eat, drink);

solve maximize sum(f in FOOD)(joy[f, drink[f]]);
% solve maximize sum(w in WINE)(joy[eat[w], w]);
```

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The Cooking Wine Problem (combined.mzn)

```
include "globals.mzn";

enum FOOD;
enum WINE;
array[FOOD, WINE] of int: joy;

array[FOOD] of var WINE: drink;
array[WINE] of var FOOD: eat;

constraint inverse(eat, drink);

solve maximize sum(f in FOOD)(joy[f, drink[f]]);
% solve maximize sum(w in WINE)(joy[eat[w], w]);
```

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Why Combining Models?

- ⌘ CP-based solvers can benefit from combining models to improve solving efficiency if done properly
- ⌘ **Ease** of expression of constraints.
 - The **Cooking Wine** problem, as is, is a pure assignment. **NO!**
 - But what about **side constraints**?

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Example Side Constraints

- ⌘ Richness in taste



3 2 1 4

```
array[FOOD] of int: taste;
```

- ⌘ The dish paired with GAOLIANG should be richer in taste than that paired with GRAPE wine

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Example Side Constraints

Richness in taste



3

2

1

4

```
array[FOOD] of int: taste;
```

- The dish paired with GAOLIANG should be richer in taste than that paired with GRAPE wine

```
taste[eat[GRAPE]] < taste[eat[GAOLIANG]];
```

- This constraint is **difficult**, if not impossible, to express in the food-wine model

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Example Side Constraints

Alcohol contents



1

3

4

2

```
array[WINE] of int: alcohol;
```

- The drink paired with GONGBAOFROG should be stronger in alcohol than that paired with SNAKESOUP

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Example Side Constraints

Alcohol contents



```
array[WINE] of int: alcohol;
```

- The drink paired with GONGBAOFROG should be stronger in alcohol than that paired with SNAKESOUP

```
alcohol[drink[SNAKESOUP]] <  
    alcohol[drink[GONGBAOFROG]];
```

- This constraint is **difficult**, if not impossible, to express in the wine-food model

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Example Side Constraints

- MAPOTOFU is paired with RICE wine if and only if SNAKESOUP is paired with HUADIAO wine

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Example Side Constraints

- MAPOTOFU is paired with RICE wine if and only if SNAKESOUP is paired with HUADIAO wine

```
eat[RICE] = MAPOTOFU <->  
eat[HUADIAO] = SNAKESOUP;  
OR  
drink[MAPOTOFU] = RICE <->  
drink[SNAKESOUP] = HUADIAO;  
OR  
eat[RICE] = MAPOTOFU <->  
drink[SNAKESOUP] = HUADIAO;  
OR  
drink[MAPOTOFU] = RICE <->  
eat[HUADIAO] = SNAKESOUP;
```

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Summary

- Multiple viewpoints of the problem leads to
 - multiple models
- Different viewpoints can express different constraints
 - more naturally and succinctly
 - better for the solvers (usually succinct is better)
- Channeling constraints make the viewpoints agree and unite them
- Combining the models can sometimes improve solving efficiency on either single model

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