

# Constraint Satisfaction Problems

Mathematical Background: Sets, Relations, and Graphs

Malte Helmert and Stefan Wöfl

Albert-Ludwigs-Universität Freiburg

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# Sets

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Sets:

Naive understanding:

a set is a “well-defined” collection of objects.

Sets

Set-Theoretical  
Principles

Sets and  
Boolean  
Algebras

Relations

Graphs

## Principles (ZF):

- **Extensionality:** Two sets are equal if and only if they contain the same elements.
- **Empty set:** There is a set,  $\emptyset$ , with no elements.
- **Pairs:** For any pair of sets  $x, y$ ,  $\{x, y\}$  is a set.
- **Union:** For any set  $x$ , there exists a set,  $\bigcup x$ , whose elements are precisely the elements of at least one of the elements of  $x$ .
- **Separation:** For any set  $x$  and any property  $F(y)$ , there is a subset of  $x$ ,  $\{y \in x : F(y)\}$ , containing precisely the elements  $y$  of  $x$  for which  $F(y)$  holds.
- **Foundation:** Each non-empty set  $x$  contains some element  $y$  such that  $x$  and  $y$  are disjoint sets.
- **Power set:** For any set  $x$  there exists a set  $2^x$  such that the elements of  $2^x$  are precisely the subsets of  $x$ .
- ... (axiom of replacement, infinite set axiom, axiom of choice)

# Definitions

## Definition

Binary set operations:

$$A \cup B := \{x : x \in A \text{ or } x \in B\}$$

$$A \cap B := \{x \in A : x \in B\}$$

$$A \setminus B := \{x \in A : x \notin B\}$$

$A \subseteq B$ ,  $A \subsetneq B$ , etc., are defined as usual.

(Ordered) pairs:

$$(x, y) := \{\{x\}, \{x, y\}\}$$

$$(x_1, \dots, x_n) := ((x_1, \dots, x_{n-1}), x_n)$$

$$A \times B := \{(a, b) : a \in A \text{ and } b \in B\}$$

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Set-Theoretical  
Principles

Sets and  
Boolean  
Algebras

Relations

Graphs

# Boolean Algebra

## Definition

A **Boolean algebra (with complements)** is a set  $A$  with

- two binary operations  $\cap$ ,  $\cup$ ,
- a unary operation  $-$ , and
- two distinct elements  $0$  and  $1$

such that for all elements  $a$ ,  $b$  and  $c$  of  $A$ :

$$a \cup (b \cap c) = (a \cup b) \cap c \qquad a \cap (b \cup c) = (a \cap b) \cup c \quad \text{Ass}$$

$$a \cup b = b \cup a \qquad a \cap b = b \cap a \quad \text{Com}$$

$$a \cup (a \cap b) = a \qquad a \cap (a \cup b) = a \quad \text{Abs}$$

$$a \cup (b \cap c) = (a \cup b) \cap (a \cup c) \qquad a \cap (b \cup c) = (a \cap b) \cup (a \cap c) \quad \text{Dis}$$

$$a \cup -a = 1 \qquad a \cap -a = 0 \quad \text{Compl}$$

# Sets and Boolean Algebras

## Definition

A **set algebra** on a set  $A$  is a non-empty subset  $B \subseteq 2^A$  that is closed under unions, intersections, and complements.

Note: a set algebra on  $A$  contains  $A$  and  $\emptyset$  as elements.

## Lemma

*Each set algebra defines a Boolean algebra. Each finite Boolean algebra “can be written as” (is isomorphic to) the full set algebra on some finite set.*

## Theorem (Tarski)

*Each Boolean algebra can be represented as a set algebra.*

Constraint  
Satisfaction  
Problems

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Sets

Set-Theoretical  
Principles

Sets and  
Boolean  
Algebras

Relations

Graphs

# Relations

## Definition

A **relation** over sets  $X_1, \dots, X_n$  is a subset

$$R \subseteq X_1 \times \dots \times X_n.$$

The number  $n$  is referred to as **arity** of  $R$ .

An  **$n$ -ary relation** on a set  $X$  is a subset

$$R \subseteq X^n := X \times \dots \times X \quad (n \text{ times}).$$

Since relations are sets, set-theoretical operations (union, intersection, complement) can be applied to relations as well.

Constraint  
Satisfaction  
Problems

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Sets

Relations

Relations

Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

# Binary Relations

For binary relations on a set  $X$  we have some special operations:

## Definition

Let  $R, S$  be binary relations on  $X$ .

The **converse** of relation  $R$  is defined by:

$$R^{-1} := \{(x, y) \in X^2 : (y, x) \in R\}.$$

The **composition** of relations  $R$  and  $S$  is defined by:

$$R \circ S := \{(x, z) \in X^2 : \exists y \in X \text{ s.t. } (x, y) \in R \text{ and } (y, z) \in S\}.$$

The **identity relation** is:

$$\Delta_X := \{(x, y) \in X^2 : x = y\}.$$

Constraint  
Satisfaction  
Problems

S. Wöfl,  
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Sets

Relations

Relations  
Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs



# Relation Algebra

## Definition (Tarski)

A **relation algebra** is a set  $A$  with

- binary operations  $\cap$ ,  $\cup$ , and  $\circ$
- unary operations  $-$  and  $^{-1}$ , and
- distinct elements  $0$ ,  $1$ , and  $\delta$  such that

(a)  $(A, \cap, \cup, -, 0, 1)$  is a Boolean algebra.

(b) For all elements  $a$ ,  $b$  and  $c$  of  $A$ :

$$a \circ (b \circ c) = (a \circ b) \circ c$$

$$a \circ (b \cup c) = (a \circ b) \cup (a \circ c)$$

$$\delta \circ a = a \circ \delta = a$$

$$(a^{-1})^{-1} = a \text{ and } (-a)^{-1} = -(a^{-1})$$

$$(a \cup b)^{-1} = a^{-1} \cup b^{-1}$$

$$(a \circ b)^{-1} = b^{-1} \circ a^{-1}$$

$$(a \circ b) \cap c^{-1} = 0 \text{ if and only if } (b \circ c) \cap a^{-1} = 0$$

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Relations

Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

# Relations and Relation Algebras

## Definition

An **algebra of relations** (or: **concrete relation algebra**) on a set  $A$  is a non-empty subset  $B \subseteq 2^{A \times A}$  that is closed under unions, intersections, compositions, complements, and converses, and contains  $\Delta_A$  as an element.

## Lemma

*Each concrete relation algebra defines a relation algebra.*

The converse of the lemma is not true, even if we restrict to finite relation algebras.

Constraint  
Satisfaction  
Problems

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Sets

Relations

Relations

Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

# Example: Point Algebra

Consider a Boolean algebra  $A$  with (exactly) three **atoms**  $\delta, a, b$ , i. e.,  $x \cap y = 0$  for  $x, y \in \{\delta, a, b\}$  and  $x \neq y$ , and  $1 = \delta \cup a \cup b$ .

Define converses of atoms by:

$$^{-1} : \text{Atom}(A) \rightarrow \text{Atom}(A), \quad \delta \mapsto \delta, \quad a \mapsto b, \quad b \mapsto a$$

Furthermore, define composition of atoms

$$\circ : \text{Atom}(A) \times \text{Atom}(A) \rightarrow A$$

by a **composition table**:

$\circ$	$\delta$	$a$	$b$
$\delta$	$\delta$	$a$	$b$
$a$	$a$	$a$	$1$
$b$	$b$	$1$	$b$

Obtain a relation algebra (check it!) by extending these functions to functions  $^{-1} : A \rightarrow A$  and  $\circ : A \times A \rightarrow A$  as follows:

$$(x \cup y)^{-1} = x^{-1} \cup y^{-1}$$

$$(x_1 \cup y_1) \circ (x_2 \cup y_2) = (x_1 \circ x_2) \cup (x_1 \circ y_2) \cup (x_2 \cup y_1) \cup (x_2 \cup y_2)$$

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# Example: Representing the Point Algebra

**Task:** Find a concrete relation algebra  $B$  (with 8 elements) on some set  $X$  and a (bijective) map  $\phi: A \rightarrow B$  such that for all  $x, y \in A$

$$\phi(x * y) = \phi(x) * \phi(y), \quad \text{for } * \in \{\cap, \cup, \circ\}$$

$$\phi(-x) = (X \times X) \setminus \phi(x)$$

$$\phi(x^{-1}) = \phi(x)^{-1}$$

$$\phi(0) = \emptyset$$

$$\phi(1) = X \times X$$

$$\phi(\delta) = \Delta_X$$

**Solution:** Consider a dense linear order  $(X, <_X)$  without endpoints (e.g., the linear order on  $\mathbb{Q}$ ). Define  $\phi$  by

$$a \mapsto <_X \quad \text{and} \quad b \mapsto >_X.$$

The crucial point to prove is that  $\phi(x \circ y) = \phi(x) \circ \phi(y)$ .

Constraint  
Satisfaction  
Problems

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Sets

Relations

Relations

Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

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# Example: The Pentagraph Algebra

Consider the same Boolean algebra as in the case of the point algebra.

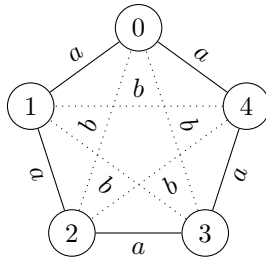
Define converses of atoms by:

$$\delta \mapsto \delta, a \mapsto a, b \mapsto b.$$

Define composition by:

$\circ$	$\delta$	$a$	$b$
$\delta$	$\delta$	$a$	$b$
$a$	$a$	$\delta \cup b$	$a \cup b$
$b$	$b$	$a \cup b$	$\delta \cup a$

The resulting algebra can be represented by a pentagraph:



# Relations over Variables

Let  $V$  be a set of variables. For each  $v \in V$ , let  $\text{dom}(v)$  (the **domain of  $v$** ) be a non-empty set (of values).

## Definition

A **relation** over (pairwise distinct) variables  $v_1, \dots, v_n \in V$  is an  $n + 1$ -tuple

$$R_{v_1, \dots, v_n} := (v_1, \dots, v_n, R)$$

where  $R$  is a relation over  $\text{dom}(v_1), \dots, \text{dom}(v_n)$ .

The sequence  $v_1, \dots, v_n$  is referred to as **range** of  $R_{v_1, \dots, v_n}$ .  
 $R$  is referred to as **graph** of  $R_{v_1, \dots, v_n}$ .

We will not always distinguish between the relation and its graph, e. g., we write

$$R_{v_1, \dots, v_n} \subseteq \text{dom}(v_1) \times \dots \times \text{dom}(v_n).$$

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Relations  
Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs



# Constraint Networks

## Definition

A **constraint network** is a triple

$$\mathcal{C} = \langle V, \text{dom}, C \rangle$$

where:

- $V$  is a non-empty and finite set of **variables**.
- $\text{dom}$  is a function that assigns a non-empty (value) set (**domain**) to each variable  $v \in V$ .
- $C$  is a set of relations over variables of  $V$  (**constraints**), i. e., each constraint is a relation  $R_{v_1, \dots, v_n}$  over some variables  $v_1, \dots, v_n$  in  $V$ .

# Solvability of Networks

## Definition

A constraint network is **solvable** (or: **satisfiable**) if there exists an **assignment**

$$a : V \rightarrow \bigcup_{v \in V} \text{dom}(v)$$

such that

- (a)  $a(v) \in \text{dom}(v)$ , for each  $v \in V$ ,
- (b)  $(a(v_1), \dots, a(v_n)) \in R_{v_1, \dots, v_n}$  for all constraints  $R_{v_1, \dots, v_n}$ .

A **solution** of a constraint network is an assignment that solves the network.

# Selections, ...

## Definition

Let  $\bar{v} := (v_1, \dots, v_n)$  and let  $R_{\bar{v}}$  be a relation over  $\bar{v}$ .  
Let  $a_1 \in \text{dom}(v_{i_1}), \dots, a_k \in \text{dom}(v_{i_k})$  be fixed values.  
Then

$$\sigma_{v_{i_1}=a_1, \dots, v_{i_k}=a_k}(R_{\bar{v}}) := \{(x_1, \dots, x_n) \in R_{\bar{v}} : x_{i_j} = a_j, 1 \leq j \leq k\}$$

is a relation over  $\bar{v}$ .

The (unary) operation  $\sigma_{v_{i_1}=a_1, \dots, v_{i_k}=a_k}$  is called **selection** or **restriction**.

Constraint  
Satisfaction  
Problems

S. Wöfl,  
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Sets

Relations

Relations  
Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

## ... Projections, ...

Let  $(i_1, \dots, i_k)$  be a  $k$ -tuple of pairwise distinct elements of  $\{1, \dots, n\}$  ( $k \leq n$ ). For an  $n$ -tuple  $\bar{x} = (x_1, \dots, x_n)$ , define  $\bar{x}_{i_1, \dots, i_k} := (x_{i_1}, \dots, x_{i_k})$ .

### Definition

Let  $\bar{v} := (v_1, \dots, v_n)$  and let  $R_{\bar{v}}$  be a relation over  $\bar{v}$ .  
Then

$$\pi_{v_{i_1}, \dots, v_{i_k}}(R_{\bar{v}}) := \left\{ \bar{y} \in \prod_{1 \leq j \leq k} \text{dom}(v_{i_j}) : \bar{y} = \bar{x}_{i_1, \dots, i_k}, \text{ for some } \bar{x} \in R_{\bar{v}} \right\}$$

is a relation over  $\bar{v}_{i_1, \dots, i_k}$ .

The (unary) operation  $\pi_{v_{i_1}, \dots, v_{i_k}}$  is called **projection**.

## ... Joins

Let  $R_{\bar{v}}$  and  $S_{\bar{w}}$  be relations over variables  $\bar{v}$  and  $\bar{w}$ , respectively.

For tuples  $\bar{x}$  and  $\bar{y}$  define:

- $\bar{x} - \bar{y}$ : the subsequence of elements in  $\bar{x}$  that do not occur in  $\bar{y}$ .
- $\bar{x} \cap \bar{y}$ : the subsequence of  $\bar{x}$  with elements that occur in  $\bar{y}$ .
- $\bar{x} \cup \bar{y}$ : the sequence resulting from  $\bar{x}$  by adding  $\bar{y} - \bar{x}$ .

### Definition

$$R_{\bar{v}} \bowtie S_{\bar{w}} := \{ \bar{x} \cup \bar{y} : \bar{x} \in R_{\bar{v}}, \bar{y} \in S_{\bar{w}}, \text{ and } \bar{x}_{\bar{v} \cap \bar{w}} = \bar{y}_{\bar{v} \cap \bar{w}} \}$$

is a relation over  $\bar{v} \cup \bar{w}$ , the **join** of  $R_{\bar{v}}$  and  $S_{\bar{w}}$ .

Note: For binary relations  $R$  and  $S$ :

$$R_{x,y} \circ R_{y,z} = \pi_{x,z}(R_{x,y} \bowtie R_{y,z}).$$

# Examples

Consider relations  $R := R_{x_1, x_2, x_3}$  and  $R' := R'_{x_2, x_3, x_4}$  defined by:

$x_1$	$x_2$	$x_3$
$b$	$b$	$c$
$c$	$b$	$c$
$c$	$n$	$n$

$x_2$	$x_3$	$x_4$
$a$	$a$	1
$b$	$c$	2
$b$	$c$	3

Then  $\sigma_{x_3=c}(R)$ ,  $\pi_{x_2, x_3}(R)$ ,  $\pi_{x_2, x_1}(R)$ , and  $R \bowtie R'$  are:

$x_1$	$x_2$	$x_3$
$b$	$b$	$c$
$c$	$b$	$c$

$x_2$	$x_3$
$b$	$c$
$b$	$c$
$n$	$n$

$x_2$	$x_1$
$b$	$b$
$b$	$c$
$n$	$c$

$x_1$	$x_2$	$x_3$	$x_4$
$b$	$b$	$c$	2
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$c$	$b$	$c$	3

# Normalized Constraint Networks

Let  $\mathcal{C} = \langle V, \text{dom}, C \rangle$  be a constraint network.

According to our definition it is possible that  $C$  contains constraints

$$R_{v_{i_1}, \dots, v_{i_k}} \quad \text{and} \quad S_{v_{j_1}, \dots, v_{j_k}}$$

where  $(j_1, \dots, j_k)$  is just a permutation of  $(i_1, \dots, i_k)$ .

In this case, we can simplify the network by deleting  $S_{v_{j_1}, \dots, v_{j_k}}$  from  $C$  and rewriting  $R_{v_{i_1}, \dots, v_{i_k}}$  as follows:

$$R_{v_{i_1}, \dots, v_{i_k}} \leftarrow R_{v_{i_1}, \dots, v_{i_k}} \cap \pi_{v_{i_1}, \dots, v_{i_k}}(S_{v_{j_1}, \dots, v_{j_k}}).$$

Given an arbitrary order on the set of variables  $V$ , we can systematically delete-and-refine constraints. The result is a constraint network that contains *exactly one constraint for each subset of variables*. This network is referred to as a **normalized constraint network**.

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Relations  
Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

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Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Relations

Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs



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Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Relations  
Binary Relations  
and Relation  
Algebras

Relations over  
Variables

Normalized  
Constraint  
Networks

Graphs

# Undirected Graph

## Definition

An **(undirected)** graph is an ordered pair

$$G := \langle V, E \rangle$$

where:

- $V$  is a finite set (of **vertices, nodes**);
- $E$  is a set of two-element subsets of (not necessarily distinct) nodes (called **edges**).

The **order** of a graph is the number of vertices  $|V|$ . The **size** of a graph is the number of edges  $|E|$ . The **degree** of a vertex is the number of vertices to which it is connected by an edge.

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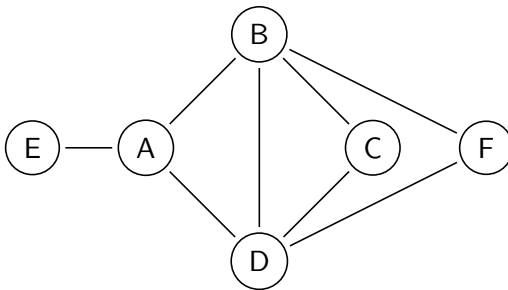
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# Graph: Example



Constraint  
Satisfaction  
Problems

S. Wölfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs

Graphs and

Constraints

Hypergraphs

# Graph: Definitions

## Definition

Let  $G = \langle V, E \rangle$  be an undirected graph.

- (a) If  $e = \{u, v\} \in E$ , then  $u$  and  $v$  are called **adjacent** (**connected** by  $e$ ).
- (b) A **path** in  $G$  is a sequence of edges  $e_1, \dots, e_k$  such that  $e_i \cap e_{i+1} \neq \emptyset$ .

Sometimes, paths are defined via vertices:

A **path** in  $G$  is a sequence of vertices  $v_0, \dots, v_k$  such that  $\{v_{i-1}, v_i\} \in E$  ( $1 \leq i \leq k$ ).  $k$  is the **length**,  $v_0$  is the **start vertex**, and  $v_k$  is the **end vertex** of the path.

- (c) A **cycle** is a path  $v_0, \dots, v_k$  with  $v_0 = v_k$ .
- (d) A path  $v_0, \dots, v_k$  is **simple** if  $v_i \neq v_j$  for all  $i \neq j$ .
- (e) A cycle  $v_0, \dots, v_k$  is **simple** if  $v_i \neq v_j$  for all  $i, j \geq 1, i \neq j$ .

# Graph: Definitions

Let  $G = \langle V, E \rangle$  be an undirected graph.

## Definition

- (a)  $G$  is **connected** if, for each pair of vertices  $u$  and  $v$ , there exists a path from  $u$  to  $v$ .
- (b)  $G$  is a **tree** if  $G$  is cycle-free.
- (c)  $G$  is **complete** if any pair of vertices is connected.

## Definition

Let  $G = \langle V, E \rangle$  be an undirected graph. Let  $S$  be a subset of  $V$ . Then  $G_S := \langle S, E_S \rangle$  is called the **subgraph** relative to  $S$ , where

$$E_S := \{ \{u, v\} \in E : u, v \in S \}.$$

## Definition

A **clique** in a graph  $G$  is a complete subgraph of  $G$ .

Constraint  
Satisfaction  
Problems

S. Wöfl,  
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Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs  
Graphs and  
Constraints  
Hypergraphs

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Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs  
Graphs and  
Constraints  
Hypergraphs

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Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs  
Graphs and  
Constraints  
Hypergraphs



# Examples

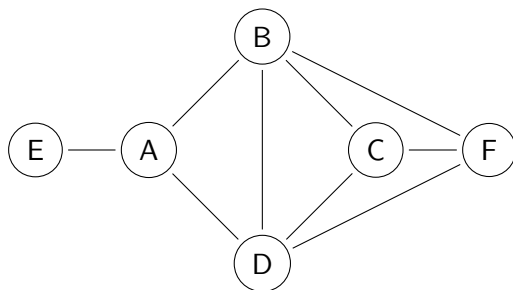


Figure: Example

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs

Graphs and

Constraints

Hypergraphs

# Examples

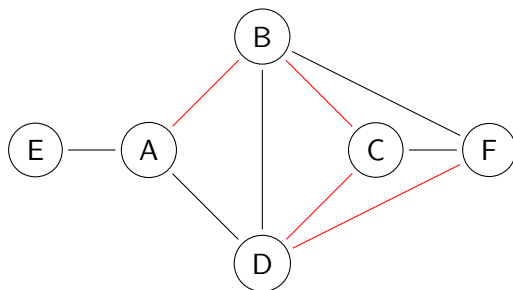


Figure: A path A,B,C,D,F

# Examples

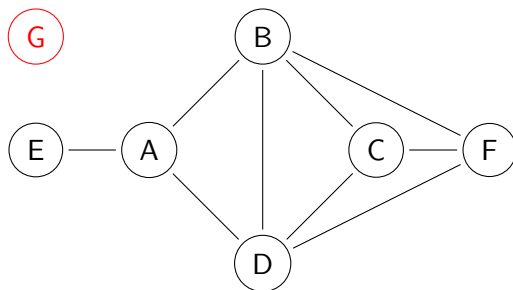


Figure: A non-connected and incomplete graph

# Examples

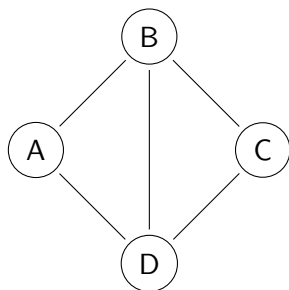


Figure: A subgraph

Constraint  
Satisfaction  
Problems

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M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs

Graphs and

Constraints

Hypergraphs

# Examples

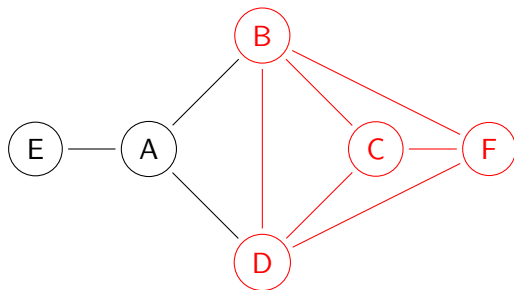


Figure: A clique

# Directed Graph

## Definition

A **directed graph** (or: **digraph**) is an ordered pair

$$G := \langle V, A \rangle$$

where:

- $V$  is a set (of **vertices** or **nodes**),
- $A$  is a set of (ordered) pairs of vertices (called **arcs**, **edges**, or **arrows**).

The number of edges with a vertex  $v$  as start vertex is called the **outdegree** of  $v$ ; the number of vertices with  $v$  as end vertex is the **indegree** of  $v$ . Nodes that point to  $v$  are called **parents**, nodes to which an edge from  $v$  points are called **child nodes**.

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs  
Graphs and  
Constraints  
Hypergraphs

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# Directed Graph: Definitions

Constraint  
Satisfaction  
Problems

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M. Helmert

## Definition

Let  $G = \langle V, A \rangle$  be a directed graph.

- (a) A **(directed) path** is a sequence of arcs  $e_1, \dots, e_k$  such that the end vertex of  $e_i$  is the start vertex of  $e_{i+1}$  (analogously, **(directed) cycle**).
- (b) A digraph is **strongly connected** if each pair of nodes  $u, v$  is connected by a directed graph from  $u$  to  $v$ .
- (c) A digraph is **acyclic** if it has no directed cycles.

Sets

Relations

Graphs

Undirected  
Graphs

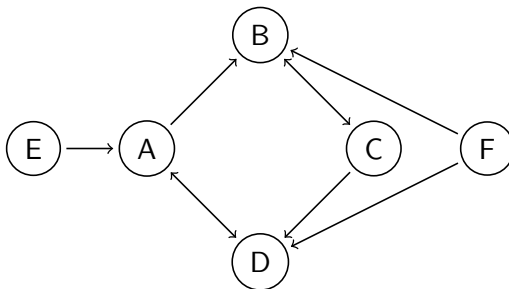
Directed Graphs

Graphs and  
Constraints

Hypergraphs



# Digraph: Example



**Figure:** A directed graph with a strongly connected subgraph

# Primal Constraint Graphs

Let  $\mathcal{C} = \langle V, \text{dom}, C \rangle$  be a (normalized) constraint network.  
For a constraint  $R_{x_1, \dots, x_k}$ , the set  $\{x_1, \dots, x_k\}$  is called the **scope**  $R_{x_1, \dots, x_k}$ .

## Definition

The **primal constraint graph** of a network  $\mathcal{C} = \langle V, \text{dom}, C \rangle$  is the undirected graph

$$G_{\mathcal{C}} := \langle V, E_{\mathcal{C}} \rangle$$

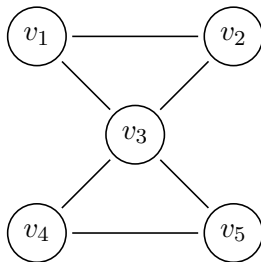
where

$$\{u, v\} \in E_{\mathcal{C}} \iff \{u, v\} \text{ is a subset of the scope of some constraint in } \mathcal{C}.$$

# Primal Constraint Graph: Example

Consider a constraint network with variables  $v_1, \dots, v_5$  and two ternary constraints  $R_{v_1, v_2, v_3}$  and  $S_{v_3, v_4, v_5}$ .

Then the primal constraint graph of the network has the form:



Absence of an edge between two variables/nodes means that there is no *direct* constraint between these variables.

# Hypergraph

## Definition

A **hypergraph** is a pair

$$H := \langle V, E \rangle$$

where

- $V$  is a set (of **nodes**, **vertices**),
- $E$  is a set of non-empty subsets of  $V$  (called **hyperedges**), i. e.,  $E \subseteq 2^V \setminus \{\emptyset\}$ .

Note: Hyperedges can contain an arbitrarily many nodes.

Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs

Graphs and  
Constraints

Hypergraphs

# Constraint Hypergraph

## Definition

The **constraint hypergraph** of a constraint network  $\mathcal{C} = \langle V, \text{dom}, C \rangle$  is the hypergraph

$$H_{\mathcal{C}} := \langle V, E_{\mathcal{C}} \rangle$$

with

$$X \in E_{\mathcal{C}} \iff X \text{ is the scope of some constraint in } \mathcal{C}.$$

In the example above (constraint network with variables  $v_1, \dots, v_5$  and two ternary constraints  $R_{v_1, v_2, v_3}$  and  $S_{v_3, v_4, v_5}$ ) the hyperedges of the constraint hypergraph are:

$$E_{\mathcal{C}} = \{ \{v_1, v_2, v_3\}, \{v_3, v_4, v_5\} \}.$$

# Dual Constraint Graphs

## Definition

The **dual constraint graph** of a constraint network  $\mathcal{C} = \langle V, \text{dom}, C \rangle$  is the labeled graph

$$D_{\mathcal{C}} := \langle V', E_{\mathcal{C}}, l \rangle$$

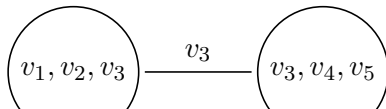
with

$$X \in V' \iff X \text{ is the scope of some constraint in } \mathcal{C}$$

$$\{X, Y\} \in E_{\mathcal{C}} \iff X \cap Y \neq \emptyset$$

$$l : E_{\mathcal{C}} \rightarrow 2^V, \quad \{X, Y\} \mapsto X \cap Y$$

In the example above, the dual constraint graph is





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Constraint  
Satisfaction  
Problems

S. Wöfl,  
M. Helmert

Sets

Relations

Graphs

Undirected  
Graphs

Directed Graphs

Graphs and  
Constraints

Hypergraphs