# Discrete Mathematics with Applications I COMPSCI&SFWRENG 2DM3

McMaster University, Fall 2019

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# **Counting Challenges**

Let *A* and *B* be finite sets with # A = a and # B = b:

pairs relations total functions partial functions partial functions homogeneous total bijections total injections total injections partial bijections a-combinations of B

•  $\#(A \Rightarrow B) = ?$ 

partial injections

•  $\#(A \twoheadrightarrow B) = ?$ 

total surjections

Please don't forget to evaluate all your courses at https://evals.mcmaster.ca!

# **Plan for Today**

- Combinatorial Analysis "Counting" (LADM chapter 16)
  - continued: Combinations
- Topological Sort (LADM section 14.4)
  - An example for algorithm development based on discrete math
- Conclusion

Review Session

Saturday, Dec. 7, 13:30, room TBA

2DM3 on Avenue and  $CALCCHECK_{Web}$  remain active throughout term 2.

• When a notebook becomes inaccessible, please notify me!

Collected lecture slides will be posted under "General".

# r-Combinations — LADM p. 340

- An *r*-combination of a set is a subset of size *r*.
- A permutation is a sequence; a combination is a set.
- For example, the 2-permutations of the set consisting of the letters in SOHN are SO,SH,SN,OH,ON,OS,HN,HS,HO,NS,NO,NH

while the 2-combinations are

(16.9) **Definition:** The binomial coefficient  $\binom{n}{r}$ , which is read as "n choose r", is defined by:

 $\binom{n}{r} = \frac{n!}{r! \cdot (n-r)!} \quad (\text{for } 0 \le r \le n)$ 

(16.10) **Theorem:** The number of *r*-combinations of *n* elements is  $\binom{n}{k}$ .  $\binom{n}{k}$   $\binom{n}{k}$ 

• # { 
$$S \mid S \subseteq B \land \# S = a$$
 } = ?

(16.23) **Binomial theorem:** For 
$$n : \mathbb{N}$$
:  $(x+y)^n = (\sum k : \mathbb{N} \mid k \le n \bullet \binom{n}{k} \cdot x^k \cdot y^{(n-k)})$ 

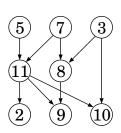
1 5 10 10 5 1 1 6 15 20 15 6 1 1 7 21 35 35 21 7 1

# **Topological Sort** — Introduction

A topological sort of a acyclic simple directed graph (V, B) is a linear order E containing B, that is,  $E \cap E^{\sim} \subseteq \operatorname{Id} \subseteq E \supseteq E \ B \subseteq E$  and  $E \cup E^{\sim} = V \times V$  and  $B \subseteq E$ .

Since (V, B) is a DAG,  $B^*$  is an order:  $B^* \cap B^{* \smile} \subseteq \operatorname{Id} \subseteq B^* \supseteq B^* \square B^* \supseteq B^* \square B^* \supseteq B^* \square B^* \supseteq B^* \supseteq B^* \square B^$ 

E is normally presented as a sequence in  $Seq\ V$  that is sorted with repect to E and contains all elements of V.



**Example:** The DAG above has, among others, the following topological sorts:

- [5, 7, 3, 11, 8, 2, 9, 10] visual left-to-right, top-to-bottom
- [3, 5, 7, 8, 11, 2, 9, 10] smallest-numbered available vertex first
- [5, 7, 3, 8, 11, 10, 9, 2] fewest edges first
- [7, 5, 11, 3, 10, 8, 9, 2] largest-numbered available vertex first
- [5, 7, 11, 2, 3, 8, 9, 10] attempting top-to-bottom, left-to-right
- [3, 7, 8, 5, 11, 10, 2, 9] (arbitrary)

 $B = \{(3,8), (3,10), (5,11), (7,8), (7,11), (8,11), (11,2), (11,9), (11,10)\}$ 

# Topological Sort — Code Scheduling — SSA v5 := v4 - 2 v7 := v4 \* v1 v11 := v5 \* v7 v8 := v7 - v3 v10 -\* v2 := v11 + 2 v9 := v11 \* v8 v10 := v11 \* v3

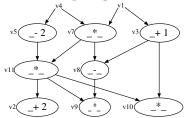
Static single assignment form: Each variable is assigned once, and assigned before use.

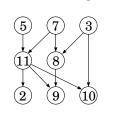
SSA can be considered as **encoding data-flow graphs**.

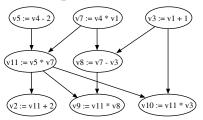
Each admissible re-ordering of an SSA sequence is a different topological sort of that graph.

It is frequently easier to think in terms of that graph than in terms of re-orderings!

# Topological Sort — Code Scheduling — SSA — Pipeline Stalls







**Static single assignment form:** Each variable is assigned **once**, and assigned before use.

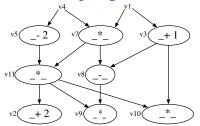
[7, 5, 11, 3, 10, 8, 9, 2]

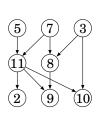
v7 := v4 \* v1 v5 := v4 - 2 v11 := v5 \* v7 v3 := v1 + 1 v10 := v11 \* v3 v8 := v7 - v3 v9 := v11 \* v8v2 := v11 + 2 Let *E* be the topological sort of (V,B); let C = E – Id be the associated strict-order.

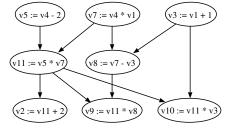
Depth-2 pipelining requires  $B \subseteq C \ C$ . Depth-3 pipelining requires  $B \subseteq C \ C$ .

Depth-3 pipelining requires  $B \cap (S \cup S \circ S) = \{\}.$ 

# Topological Sort — Code Scheduling — Different Schedules







**Example:** Most of the original example topological sorts induce pipeline stalls:

- [5, 7, 3, 11, 8, 2, 9, 10] visual left-to-right, top-to-bottom
- [3, 5, 7, 8, <u>11, 2,</u> 9, 10] smallest-numbered available vertex first
- [5, 7, 3, 8, 11, 10, 9, 2] fewest edges first
- [7, <u>5</u>, <u>11</u>, <u>3</u>, <u>10</u>, <u>8</u>, <u>9</u>, 2] largest-numbered available vertex first
- [5, 7, 11, 2, 3, 8, 9, 10] attempting top-to-bottom, left-to-right
- [3, 7, 8, 5, <u>11, 10,</u> 2, 9] (arbitrary)

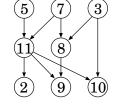
 $B = \left\{ \langle 3, 8 \rangle, \langle 3, 10 \rangle, \langle 5, 11 \rangle, \langle 7, 8 \rangle, \langle 7, 11 \rangle, \langle 8, 11 \rangle, \langle 11, 2 \rangle, \langle 11, 9 \rangle, \langle 11, 10 \rangle \right\}$ 

# Topological Sort — Simple Algorithm

Given a DAG (V, B),

calculate sequence *s* encoding a topological sort *E*.

 $\begin{array}{lll} \mathbf{var} \ vs : Set \ V \\ \mathbf{var} \ s : Seq \ V \\ vs := V \ \circ, & -\mathbf{not}\text{-}\mathbf{yet}\text{-}\mathbf{used} \ \mathbf{vertices} \\ \{ \ vs = B \ \} & -\mathbf{Precondition} \\ s := \epsilon \ \circ, & -\mathbf{accumulator} \ \mathbf{for} \ \mathbf{result} \ \mathbf{sequence} \\ \{ \ (vs \ \mathsf{and} \ \{ v \ \mid \ v \in s \} \ \mathsf{partition} \ V) \ \land \end{array}$ 



— Invariant

 $(\forall v : V \mid v \in s \bullet \forall u : V \mid u (B) v \bullet u \text{ precedes } v \text{ in } s) \}$  while  $vs \neq \{\}$  do

Choose a source u of the subgraph  $(vs, B \cap (vs \times vs))$  induced by vs ;  $vs, s := vs - \{u\}, s \triangleright u$ 

od

 $\{ (\forall u, v : V \mid u \mid B) v \cdot u \text{ precedes } v \text{ in } s) \}$  — Postcondition

**How to** "Choose a source *u* of the subgraph induced by *vs*" **efficiently?** 

```
Topological Sort — Making Choosing Minimal Elements Easier

To store mappings V \to X in "array ... of X", "assume" V = \operatorname{Fin} k where k = \# V.

var sources : Seq (Fin k) — three new variables make vs superfluous

var preCount : array Fin k of \mathbb{Z}

var postSet : array Fin k of set (Fin k) — read-only version of B: V \leftrightarrow V as V \to \mathbb{P}V

Coupling invariant:

{u \mid u \in sources} = vs - (Ran B') \land - sources contains sources of B' = B \cap (vs \times vs)
(∀v \mid v \in vs \bullet preCount[v] = \# (Dom (B' \rhd \{v\})) \land
(∀u \mid u \in vs \bullet postSet[u] = Ran (\{u\} \lhd B'))

Initialisation:

for v \in \operatorname{Fin} k do preCount[v] := \# (Dom (B \rhd \{v\})) od \S

for u \in \operatorname{Fin} k do postSet[u] := Ran (\{u\} \lhd B)) od \S

sources := \mathfrak{e} \S

for v \in \operatorname{Fin} k do if preCount[v] = 0 then sources := sources \rhd v fi od
```

```
Topological Sort — Complete LADM Algorithm
for v \in \text{Fin } k \text{ do } preCount[v] := \# (Dom (B \triangleright \{v\})) \text{ od } 
for u \in \text{Fin } k \text{ do } postSet[u] := Ran (\{u\} \triangleleft B)) \text{ od } 
sources := \epsilon \, {}^{\circ}_{9}
for v \in \text{Fin } k \text{ do if } preCount[v] = 0 \text{ then } sources := sources \triangleright v \text{ fi od}
ghost vs := Fin k 
s := \epsilon
while m \neq \epsilon do
      u := head sources 
      s := s \triangleright u \circ
      sources := tail sources <sup>§</sup> — remove u from sources
       ghost vs := vs - \{u\} §
      for v \in postSet[u] do
             preCount[v] := preCount[v] - 1  $
             if preCount[v] = 0 then sources := sources \triangleright v fi
      od
od
```

```
Topological Sort — Complete O(\#B + \#V) Algorithm
for p \in B do
      preCount[snd p] := preCount[snd p] + 1
      postSet[fst \ p] := postSet[fst \ p] \cup \{v\}
od ;
sources := \epsilon \circ \mathbf{for} \ v \in \mathsf{Fin} \ k \ \mathbf{do} \ \mathbf{if} \ preCount[v] = 0 \ \mathbf{then} \ sources := sources \triangleright v \ \mathbf{fi} \ \mathbf{od}
ghost vs := Fin k 
s \coloneqq \epsilon
while m \neq \epsilon do
      u := head sources 
      s := s \triangleright u \ 
      sources := tail sources ; — remove u from sources
      ghost vs := vs - \{u\} §
      for v \in postSet[u] do
            preCount[v] := preCount[v] - 1  §
            if preCount[v] = 0 then sources := sources \triangleright v fi
      od
od
```

#### More ...

- More about induction/recursion: Read chapter 12!
- More about relations: Read chapter 14!
- A lot more about **graphs**: Chapter 19
- Quite a bit more about **integers**: Chapter 15
- **Sequences:** Chapter 13
- Reasoning about programs: Chapter 10 and section 12.6
- ...
- Combinatorics: Chapter 16
- Infinite sets: Chapter 20

# Do You Speak Math?

- You learnt basic vocabulary:
  - Distributivity, Absorption, Idempotency, Identity,...
  - transitive, univalent, injective, order, equivalence, mapping,...
  - source, root, connected, SCC,...
- You learnt and practiced a lot of grammar:
  - Sentence-level:
- Propositional expressions
- Typed expressions
- Quantification / predicate-logic expressions
- Relation-algebraic expressions
- Text-level:
- Inference Rules
- Applying theorems
- Calculational proofs
- Structured proofs, Induction proofs
- Axioms, Lemmata, Theorems, ...
- You practiced translating:
  - To and from relational expressions

# Do You Speak Math?

- Even if you don't read fluently yet —
   you know how to decipher
- Even if you don't speak/write fluently yet —
  you know how to construct a sentence
  you know how to construct a solid argument

you know how to solidify a sloppy argument you know how to recognise a bogus argument

• Building on these foundations will be much easier!

#### **Continued Use of Logics and Discrete Mathematics**

- 2FA3 Discrete Mathematics II
  - Predicate logic, formal languages, grammars, finite automata, transition relations, acceptance predicates,  $\dots$
- 2C03 Data Structures and Algorithms
  - Sets, relations, functions as data; functions/relations on data; datatype invariants
- CS 2ME3 / SE 2AA4 Introduction to Software Development
  - Read and write specifications for simple module interfaces
- SFWRENG 3BB4 Concurrent Systems Design
   —correctness of concurrent programs
- 3RA3 Software Requirements
  - Capturing **precisely** what the customer wants, formalisation
- 3DB3 Databases
  - *n*-ary relations, relational algebra; functional dependencies
- COMPSCI 3MI3 Principles of Programming Languages
  - Programming paradigms, including functional programming; mathematical understanding of prog. language constructs
- COMPSCI 3EA3 Software Specification and Correctness
  - program verification, correct-by-construction programming
- 3FP3 Functional Programming

# **Concluding Remarks**

- How do I find proofs? There is no general recipe
- Proving is somewhat like doing puzzles practice helps
- **Proofs** are especially **important for software** and much care is needed!
- Be aware of types, both in programming, and in mathematics
- Be aware of variable binding in quantification, local variables, formal parameters
- Strive to use abstraction to avoid variable binding
  - e.g., using relation algebra instead of predicate logic
- When designing data representations, think mathematics: Subsets, relations, functions, injectivity, ...
- Thinking mathematics in programming is easiest in functional languages, e.g., Haskell, OCaml
- Specify formally! Design for provability!
- When doing software, think discrete mathematics!