

6.042[J] Notes (Page 1)

Introduction

- Proof is a method of establishing truth
- Mathematical Proof of a proposition is a chain of logical deductions leading to proposition from base of axioms

1 Proposition

2 Logical Deduction

3 Axiom

Propositions

Def: A statement true or False

Compound Propositions

→ can combine & relate propositions

→ classify propositions as T/F
(Boolean variables)

NOT / AND / OR

P	Q	Not(P)	P OR Q	P AND Q
T	T	F	T	T
T	F	F	T	F
F	T	T	T	F
F	F	T	F	F

IMPLIES

* AN IMPLICATION is true when if-part False, or then-part True

.., IF P, Then Q

P	Q	P IMPLIES Q
T	T	T
T	F	F
F	T	T
F	F	T

IF F

o "If and only If"

P	Q	P IFF Q
T	T	T
T	F	F
F	T	F
F	F	T

Notation

NOT(P)	$\neg P$
P AND Q	$P \wedge Q$
P OR Q	$P \vee Q$
P IMPLIES Q	$P \rightarrow Q$
IF P Then Q	$P \rightarrow Q$
P IFF Q	$P \leftrightarrow Q$

Logically Equivalency

Δ cast in propositional logic

→ If truth tables the same, they're logically equivalent

① Implication equivalent to contra-positive

② Implication NOT equivalent to Converse

Propositional Logic in Programming

ex: $\text{if}(x > 0 \text{ || } (x \leq 0 \text{ \&\& } y > 100))$

↳ "||" = OR

"\&\&" = AND

CAN BE SIMPLIFIED

$\text{if}(x > 0 \text{ \&\& } y > 100)$

• simplifying logical expressions
difficult but important

Predicates & Quantifiers

Propositions w/ inf many cases

→ Some Propositions involve Large or Infinite checks

ex: $n^2 + n + 41$ is prime for any n (fails at $n=40!$)

Key: I can't prove an infinite proposition w/ a finite set

Set Notation

$\forall n \in \mathbb{N}. p(n) \text{ prime}$

Predicates

→ Proposition whose truth depends on value of one or more variables

ex: "n is a perfect square"

$P(n) := "n \text{ is a perfect square}"$

Quantifiers

- Predicate can be sometimes or always True

Always True

- For all n , $P(n)$ is True

(set notation) For all $x \in \mathbb{R}$, $x^2 > 0$

Sometimes True

- $P(n)$ is true for some n

(set notation) $5x^2 - 7 = 0$ for some $x \in \mathbb{R}$

Predicate Notation

\forall → For All

\exists → There exists some value

* Both symbols always followed by variable & set variable ranges over

Order of Quantifiers

* Swapping order can change meaning!

ex. "Every American has a dream"

• $\exists d \in D. \forall a \in A. H(a, d)$ (some dream)

• $\forall a \in A. \exists d \in D. H(a, d)$ (personal dream)

ex. Goldbach's in reverse order is patently False

Variables over one domain

→ when all variables take values from non-empty set D , omit D

Negating Quantifiers

$$\text{Not}(\forall x. P(x)) \Leftrightarrow \exists x. \text{Not}(P(x))$$

Validity

→ Propositional Formula
True, if T no matter what value assigned to individual proposition vars

Satisfiability

→ satisfiable if some setting of variables makes proposition true

ex |

$$P \wedge \overline{Q} \rightarrow \text{satisfiable}$$

$$P \wedge \overline{P} \rightarrow \text{not satisfiable}$$

P vs. NP → whether

the SAT truth table method can be solved in Polynomial Time

* CHAPTER 2 *

Axiomatic Method

• A Proof is a sequence of logical deductions from axioms & previous proofs that conclude w/ proposition

Terminology

1. Theorem → Important Proposition

2. Lemma → Preliminary Proposition useful later

3. Corollary → proposition that follows from Lemma or Theorem

The Grand Base Set { Zermelo-Frankel set theory w/ choice }

Our Axioms

- ZFC → too Primitive
- take high school math facts as axiom

Logical Deductions

- Inference Rules for proving new propositions using previously proved old ones

Modus Ponens

- Proof of $P \wedge Q \rightarrow Q$ is a Proof of Q

↳ there are other sound inference rules as well

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Proof Templates	Proving an Implication	Proof by Contradiction																		
<ul style="list-style-type: none"> Many Proofs follow a handful of <u>standard</u> templates 	<p>Form: If-Then, $P \rightarrow Q$</p> <p>Method #1: Assume P is True</p> <ul style="list-style-type: none"> When Proving $P \rightarrow Q$, 2 cases to consider <ul style="list-style-type: none"> P is <u>True</u> (<u>More Interesting</u>) P is <u>False</u> <p>→ So, assume P, & show Q logically follows</p> <p>AVOID: If you assume P true for one proof, don't assume for all</p> <p>Method 2: Prove the contra Positive</p> <ul style="list-style-type: none"> $P \rightarrow Q$ EQUIVALENT $\neg Q \rightarrow \neg P$ <p>→ So, write "Prove the contra-positive & proceed"</p>	<p>→ Here if a proposition is False, you show False fact to be <u>True</u></p> <ol style="list-style-type: none"> 1) write Proof by Contradiction 2) Write, "Suppose P is False" 3) Deduce something known to be False 4) This is contradiction, therefore P must be true 																		
<p>Proof by Cases</p> <p>→ Breaking more complicated Proof into cases is a common strategy</p> <p>Example</p> <ul style="list-style-type: none"> If every pair of people in a group have met, they are a club If not group of strangers 	<p>Theorem: Every collection of 6 people includes club of 3 or 3 strangers</p> <p>Define Person X</p> <p>case 1: X met ≥ 3</p> <p>↳ 1.1 None have met each other (strangers)</p> <p>↳ 1.2 at least one pair met (club)</p> <p>Case 2: X met < 3</p> <p>↳ 2.1 if all have met, (club)</p> <p>↳ 2.2 if more than one pair not met (strangers)</p>	<p>symbol set Elements</p> <table border="0"> <tr> <td>\emptyset</td> <td>Empty set</td> <td>None</td> </tr> <tr> <td>\mathbb{N}</td> <td>Non-negative Integers</td> <td>$\{0, 1, 2, 3, \dots\}$</td> </tr> <tr> <td>\mathbb{Z}</td> <td>Integers</td> <td>$\{-2, -1, 0, 1, 2\}$</td> </tr> <tr> <td>\mathbb{Q}</td> <td>Rational Numbers</td> <td>$\frac{1}{2}, -\frac{5}{3}, \frac{13}{12}$</td> </tr> <tr> <td>$\mathbb{R}$</td> <td>Real Numbers</td> <td>$\pi, e, -9, \sqrt{2}$</td> </tr> <tr> <td>\mathbb{C}</td> <td>Complex Numbers</td> <td></td> </tr> </table> <p><u>SUPERSCRIPTS</u></p> <p>D^+ → only Positive Elements</p> <p>D^- → only Negative Elements</p>	\emptyset	Empty set	None	\mathbb{N}	Non-negative Integers	$\{0, 1, 2, 3, \dots\}$	\mathbb{Z}	Integers	$\{-2, -1, 0, 1, 2\}$	\mathbb{Q}	Rational Numbers	$\frac{1}{2}, -\frac{5}{3}, \frac{13}{12}$	\mathbb{R}	Real Numbers	$\pi, e, -9, \sqrt{2}$	\mathbb{C}	Complex Numbers	
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Comparing & Combining Sets

$S \subseteq T \rightarrow "S$ is subset of $T"$

$X \cup Y \rightarrow "Union of elements in sets X \& Y"$

$X \cap Y \rightarrow "Intersection of sets X \& Y"$

$X - Y \rightarrow "Set Difference, only elements in X not in Y"$

Complement of a Set

• For subset A of Domain D , it's useful to look at \bar{A}

(All elements in D , not in A)

$$\bar{A} = D - A$$

Cardinality

→ # of elements in set $|A|$

The Power Set

* set of all subsets in a set

$$P(A) \text{ of } A$$

→ $B \in P(A) \text{ iff } B \subseteq A$

$$|P(A)| = 2^{|A|}$$

Sequences

→ (a, b, c)

Key differences

• Sets can have duplicate elements

• Terms in sequence have order

• $\lambda = \emptyset$ empty sequence, $\phi = \emptyset$ empty set

Cross - Products

→ link between sets & sequences

• Product of sets is a new set of sequences where 1st element from first set, 2nd element from second set etc

ex]

$$\mathbb{N} \times \{a, b\} = \{(0, a), (0, b), \dots\}$$

→ Product of n copies of set denoted S^n

ex]

$$\mathbb{N}^3 = \{(x, y, z) | x, y, z \in \mathbb{N}\}$$

Set Builder Notation

→ useful for sets not easily defined listing elements explicitly

* So we define set using
[Predicate]

ex]

$$A ::= \{n \in \mathbb{N} \mid n \text{ is prime}\}$$

$$B ::= \{x \in \mathbb{R} \mid x^3 - 3x + 1 > 0\}$$

$$C ::= \{atbi \in \mathbb{C} \mid a^2 + b^2 \leq 1\}$$

Proving Set Equalities

* Two sets are equal if they contain same elements

Distributive Law of Sets

$$A \cap (B \cup C) = (A \cap B) \cup (A \cap C)$$

Good Proofs in Practice

① State your Game Plan

② Keep Linear Flow

③ * Proof is an essay, not a calculation *

④ Simplify [] avoid excessive symbolism

⑤ Introduce Notation Thoughtfully

Section #3:

* Induction *

The Well Ordering Principle

o Every Non-Empty set of Non-Negative integers has a smallest element

Well Ordering Proofs

• One of most important proof rules in Discrete Math

→ Prove $P(n)$ true for all $n \in \mathbb{N}$ using well ordering principle

1) Define set C of counterexamples of P being True

$$C ::= \{n \in \mathbb{N} \mid P(n) \text{ False}\}$$

2) Use a proof by contradiction & assume C is non-empty

3) By well-ordering principle, there will be smallest element n in C

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Well ordering Proofs (cont.)

(4) reach a contradiction by using \Box to find a member of C smaller than \Box (or any contradiction)

(5) Conclude C must be empty & no counter examples exist QED

Ordinary Induction

- Let $P(n)$ be a predicate
- If,
- $P(0)$ is true
- $P(n)$ IMPLIES $P(n+1)$ for all non negatives \Box

then

$P(m)$ is true for all non-negative integers \Box

Template for Induction Proofs

① State the proof uses induction

② Define Appropriate Predicate $P(n)$
"induction hypothesis"

→ If multiple vars, specify \Box

③ Prove Base Case $P(0)$

(4) Prove $P(n) \rightarrow P(n+1)$

Challenging Example

- Assume a courtyard of dimensions $2^n \times 2^n$
- One of central squares must have Statue of Donor
- L-shaped Tiling

(naïve) $P(n)$: There exists a tiling of $2^n \times 2^n$ courtyard with Bill in a central square

$$\begin{cases} P(0), \text{ fine} \\ P(n) \rightarrow P(n+1), \text{ Run into trouble} \end{cases}$$

*First Fall-back: Look for a Stronger Induction Hypothesis

(correct $P(n)$): There exists a tiling of $2^n \times 2^n$ with Bill anywhere

Invariants

A property that is preserved through a series of operations is called an Invariant

→ Induction typically used to prove invariants

• Show true at beginning

• true at step $\Box \rightarrow \Box + 1$

The Invariant Method

- Define $P(t)$ to be predicate that NICE holds immediately after step t
- Show $P(0)$ to be TRUE
- show $\forall t \in \mathbb{N}. P(t) \rightarrow P(t+1)$

Challenge Problem: The 8-Puzzle

a)	b)
A B C	A B C
D E F	D E F
H G	H G

$P(n)$: No sequence of legal moves change b) \rightarrow a)

Lemma 1) A row move does not change order of tiles

Lemma 2) A column move changes relative order of exactly two pairs of tiles

- Show that # inversions odd/even are invariant

Strong Induction

- Let $P(n)$ be a predicate
 - If $P(0)$ is TRUE
 - for all $n \in \mathbb{N}$
 - $\{P(0), \dots, P(n)\} \rightarrow P(n+1)$

then $P(n)$ TRUE for all $n \in \mathbb{N}$

Ex. Making Change

Proof → can make change for anything greater than 8 w/ (3, 5)

$$P(0): 5+3=8$$

$$P(n+1) \rightarrow 3 \cdot 3 = 9$$

$$P(n+2) \rightarrow 2 \cdot 5 = 10$$

$$P(n+3) \rightarrow 5+2 \cdot 3 = 11$$

Ex. Stacking Game

- Start with stack of n boxes

→ Divide into two non-zero stacks

Theorem: Any way of unstacking gives

Structural Induction

Recursive Data Types

- Datatypes specified by Recursive Definitions

(1) Base Case → don't depend on anything

(2) Constructor Case → depends on previous cases

Ex. String of Brackets

brkts → set of all square bracket strings

Base case: $[\lambda \rightarrow \text{empty}]$

Constructor: if $s \in \text{brkts}$, then $\{s\} [s] s [\}$ in brkts

ex Arithmetic Expressions

$$\textcircled{*} \quad 3x^2 + 2x + 1$$

** Unit 4: Number Theory **

* We concern ourselves with variables $\in \mathbb{Z}$

Divisibility

- The divides relation

$$a \text{ divides } b \text{ iff } ak=b$$

→ Number theory contains simple questions w/ very difficult answers

Famous Conjecture in Number Theory

① Fermat's Last Theorem

→ There are no x, y, z s.t. $x^n + y^n = z^n$

② Goldbach Conjecture

→ every integer > 2 is the sum of 2 primes

③ Twin Prime Conjecture

→ infinitely many instances where if p is a prime, $p+2$ is as well

④ Primality Testing

⑤ Factoring

\boxed{a} = quotient

\boxed{r} = remainder of n divided by d

Ex

$$\text{Quotient}(2716, 10) = 271$$

$$\text{remainder}(2716, 10) = 6$$

Particular class of problem:

can one form \boxed{a} gallons with jugs of capacity (a, b) ?

Finding Invariant Property

- suppose we've two jugs with capacities \boxed{a} \boxed{b} where $b > a$

- $(x, y) \rightarrow$ state of system of jugs $0 \leq x \leq a, 0 \leq y \leq b$

- water in each jug takes form

$$\boxed{s \cdot a + t \cdot b}$$

$$\text{for } \exists s, t \in \mathbb{N}$$

Greatest Common Divisor

- Denoted $\text{gcd}(a, b)$

Thm: The greatest common divisor of a, b is equal to smallest positive linear combo of a, b

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Proof:

→ By the Well Ordering Principle

There exists a smallest positive linear combo of $a \wedge b$ called m

Prove: $m = \gcd(a, b)$

Showing: ① $m \leq \gcd(a, b)$

② $m \geq \gcd(a, b)$

① for any common divisor c

$$c | sa + tb$$

$$\gcd(a, b) | sa + tb$$

$$\gcd(a, b) | m$$

↓ (implies)

$$\gcd(a, b) \leq m$$

② Show $m | a \wedge m | b$

recall: $a = q \cdot m + r$

$$\downarrow m = sa + tb$$

$$[r = (1 - qs)a + (-qt)b]$$

BECAUSE $0 \leq r < m$

⑧

m is smallest positive linear combo

implies $[r \text{ must be zero}]$

Properties of Greatest Common Divisor

1. Every common divisor of $a \wedge b$ divides $\gcd(a, b)$

$$2. \gcd(ka, kb) = k \cdot \gcd(a, b)$$

$$3. \text{If } \gcd(a, b) = 1 \quad \boxed{\gcd(ax) = 1} \\ \gcd(a, bc) = 1$$

4. If $a | bc$ and $\gcd(a, b) = 1$,
then $a | c$

$$5. \gcd(a, b) = \gcd(b, \text{rem}(a, b))$$

Proving Trick: $\gcd \rightarrow$ linear comb

The Pulverizer

Problem: Non-Descript way to solve for coeffs
 $\boxed{S \ S \ T}$

Procedure: Goes through same steps as Euclid's alg

w/ additional bookkeeping step to write remainders as linear combos

* Last non-zero remainder is \gcd

Fundamental Theorem of Arithmetic

• Every positive integer n can be written as a unique product of primes

Modular Arithmetic

• a is congruent to

$$b \pmod{n} \text{ iff } \boxed{n | (a-b)} \\ a \equiv b \pmod{n}$$

$$a \equiv b \pmod{n} \text{ iff } \text{rem}(a, n) = \text{rem}(b, n)$$

Alternative visualization of congruence modulo n defines a partition of integers into \boxed{n} sets all congruent w/ one another

Turing's code / Arithmetic w/ prime modulus

① sender & receiver agree on large prime \boxed{p}

& secret key $K \in \{1, 2, \dots, p-1\}$

② The message can be any integer in set $\{0, 1, 2, \dots, p-1\}$

③ De-encryption difficulty m^* is a remainder

$$\boxed{m^* = \text{rem}(mK, p)}$$

Arithmetic w/ a Prime Modulus

• Multiplicative inverses exist working in modulo a prime

$$\text{ex } 7 \cdot \boxed{3} \equiv 1 \pmod{5}$$

↓ multiplicative inverse of 7

Key: can only recover Turing's message if multiplying by multiplicative inverse of key

$$m^* \cdot K^{-1} = \text{rem}(mK, p) \cdot K^{-1}$$

$$\equiv$$

Arithmetic w/ Arbitrary Modulus

- $a \boxed{b}$ relative primes if $\gcd(a, b) = 1$

Key: modulo n may be complicated, but #'s relatively prime to n behave well

RSA Algorithm

1. Receiver creates public key
2. Generate primes $\boxed{p} \& \boxed{q}$
3. Let $n = pq$
4. select \boxed{s} s.t $\gcd(s, (p-1)(q-1)) = 1$

** Unit 5: Graph Theory **

- The graph is most important structure in CS
- A graph is a collection of lines & dots where lines connect some pairs of dots

Simple Graphs

- A simple graph \boxed{G} consists of a non-empty set \boxed{V} of vertices and set \boxed{E} consisting of 2-elements of V

- E is edges of G
- written $\boxed{G(V, E)}$

Ex

$$V = \{a, b, c, d, e\} \quad * \text{Note: for unordered sets}$$

$$E = \{\{a, b\}, \{b, c\}\}$$

$$\{a, b\} = \{b, a\}$$

Definition

- vertices adjacent if joined by an edge
- The Degree of a vertex is # of edges incident to it

Some Common Graphs

K_n → complete graph on n vertices

L_n → Line graph of $(n-1)$ edges

C_n → cyclic graph (n vertices, n edges)

↑ so morphism

• If $\boxed{G_1(V_1, E_1)} \& \boxed{G_2(V_2, E_2)}$ are two graphs, then we say G_1 is isomorphic to G_2 iff there exists bi-jection

$$f: V_1 \rightarrow V_2$$

Key: Properties of graph preserved under isomorphism, even if vastly different looking

Sub-Graphs

- G_1 is sub-graph of G_2 if $V_1 \subseteq V_2 \& E_1 \subseteq E_2$

Weighted Graphs

- where an edge holds a capacity / weight

- Simple graph but with weight function \boxed{w}

$$w: E \rightarrow \mathbb{R}$$

Adjacency Matrix

- Matrix form representation of adjacency between nodes

→ $[0, 1]$ simple graphs

→ $[0, w(\{v_i, v_j\})]$ if $\{v_i, v_j\} \in E$

Matching Problems

The handshaking Lemma

The sum of degrees of vertices equals twice the # of edges

Bi-partite Matchings

- A graph with a partition of its vertices into two sets $\boxed{V_1} \& \boxed{V_2}$ where every edge incident to vertex in both

The Matching condition

Hall's matching theorem

- ↳ necessary and sufficient conditions for existence of matching in bi-partite graph

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Theorem: A matching for set of men M with set of women W can only be found if matching condition holds

* Each subset of Men M must like as large a set of women *

Proof (see pg. 135)

An easier Matching condition

△ Checking all subsets can get tedious,

solution

G , a bi-partite graph is degree constrained, if for vertex partition L, R where $|L| \leq |R|$, $\deg(R) \geq \text{degree}(R)$

for every $l \in L$ or $r \in R$

Proof by contradiction

Suppose G is degree constrained but there is no matching. So there must be bottleneck

• Let x be s.t $\deg(x) \geq x \geq \deg(y)$

$$|N(x)| \times x \geq |N(x)|$$

\rightarrow not a bottleneck

Q.E.D

Stable Marriage Problem

- o $|L| = |R|$
- o every l, r has preference set
- o Rankings are complete
- o Stable \rightarrow No pairs ~~were~~ that ~~ever~~ prefer others to spouses

Mating Ritual

\rightarrow Guaranteed Stable Matching in Polynomial Time

- ① Each male proposes to best choice on list
- ② each woman asks her fave to return, tells rest to leave
- ③ Non-selected males cross woman off list
- ④ When day arrives where each woman has at most one suitor, ritual ends

Facts to prove

- A) Ritual reaches termination condition
- B) Every body ends up married
- C) Resulting marriages are stable

A - every day the ritual runs (& hasn't terminated) at least one man crosses woman off list

• if n men & n women

\rightarrow Max # of days

procedure runs = n^2

B i) Show invariant by Induction on n days

that

if w is crossed off l m's list, w has better suitor

By contradiction

• Assume there are one man & one woman at end unmarried

Solution Optimality for Men

• Surprisingly, but men do get top choice & quality decreases just enough to be stable

* There are multiple stable matchings in existence

Proof of optimal case for men: Definition of optimal spouse & rogue couple compromises existence of stable matching (contradiction)

Proof of Pessimal case for women | non-existence of (contradiction) stable matching w/ woman she likes less

Coloring

Motivation:

Before edges denote affinity

Now edges denote conflict

Example

Points = events

Edges = schedule conflict

constraint = Tile such that

NO Adjacent points have same coloring

Chromatic Number

- Min value of K for which graph has valid K -coloring

Degree-Bounded Coloring

- Bi-Partite \rightarrow 2-coloring

Graph of max degree K is

$K+1$ colorable

Complete Graph

best coloring is 4-coloring

2-coloring!

Why Coloring?

- Updates & pairwise criticality (min waves to disruption performance)
- Allocating registers in program variables

Getting from A \rightarrow B

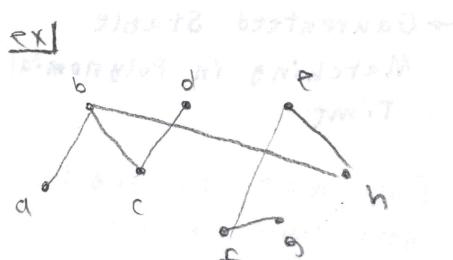
- A walk in graph G is a series of vertices

V_0, V_1, \dots, V_K and edges

$\{V_0, V_1\}, \dots, \{V_{K-1}, V_K\}$

Definitions:

- Starts at V_0
- Ends at V_K
- length = K
- For paths, no V_i the same



Finding a Path

- Where there is a walk there is a path (well-ordering principle)

contradiction: shortest walk isn't path

Number of Walks

- Can be multiple walks of length K to connect two points

Relationship between walks of length K and K^{th} power of adjacency A_G

The Relationship

- Let $G = (V, E)$ be an n -node graph, $V = \{v_1, v_2, \dots, v_n\}$

$$A_G = \{a_{ij}\}$$

- # of length K walk between

$$V_i \text{ & } V_j = a_{ij}^{(K)}$$

Key observation: each power raise of A_G is a discovery of # of paths of that increment multiplication (sub-paths of $K-1$ at your disposal, original adjacency matrix indicates whether valid or not) wow!

Proof | Induction on K

$$P(K) : \forall i, j \in [1, n]. P_{ij}^{(K)} = a_{ij}^{(K)}$$

$$P_{ij}^{(K+1)} = \sum_{t=1}^n a_{it} a_{tj}^{(K)}$$

exactly as we guessed above

Connectivity

Definition: Two vertices are connected if a path begins at one & ends at the other

- A graph is connected if each pair of vertices connected pairwise

Connected Components

\rightarrow subgraph within graph fully connected

K -connected Graphs

\rightarrow takes K edge failures to make dis-connected

$\text{MIN}(\#)$ edges in connected graph

Theorem: Every graph w/ n vertices & e edges

has at least $\lceil \frac{n}{e} \rceil$ connected components

Induction on n & cases

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Nuance: Proof on Graphs

① Induction on edges & vertices

② Start w/ ntl node graph

Shrink-down, grow back

↳ Done to, Build-up
avoid error

Build-up Error

△ Faulty Assumption that

EVE~~RY~~ \boxed{n} graph can be formed from any \boxed{m} graph satisfying condition w/ same property

Cycles & closed Walks

• A closed walk is a sequence of vertices & edges where

first node = last node

length = K

• only $\{V_0, V_K\}$ are the same

Odd-Cycles $\not\equiv$ 2-colorability

Following Properties Mutually Inclusive

① Graph Bi-Partite

② Graph is 2-colorable

③ Graph contains no cycles of odd length

④ No closed walks of odd length

Euler Tours

• A walk that traverses every edge exactly once

Hamiltonian Cycles

• A cycle that visits every node in G exactly once

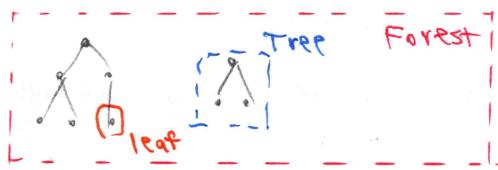
Travelling Salesperson Problem

Trees

• A connected, acyclic graph is a tree

• If every connected component of G is a tree, G is a Forest

• A node, is a vertex in tree of degree ≥ 2



Spanning Trees

Theorem: every connected graph has spanning tree

Proof: By contradiction

• call \square minimally connected sub-graph but not a tree

• contains cycle

→ so removing edge

Min-Weight Spanning Trees

→ Spanning tree of minimum weight

Pg. 173 → two algorithms to solve for MST

Proof on [175] shows

1) existence of edge to form tree

2) termination condition

Planar Graphs

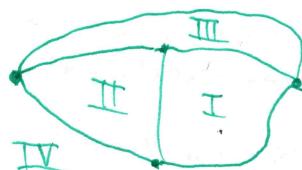
• A graph is planar if no curves cross

Recursive Definition of Planar Graphs

• Face → Continuous regions denoted by smooth edges

• Outside face extends off into infinity

Note! vertices forming boundary of each face form a cycle



Planar Graph w/ four faces

• Cycles & closed walks form Discrete faces of the drawing

Recursive Def: Planar Embeddings

- A Planar Embedding of a connected graph is a non-empty set of closed walks that make up Discrete Faces.

Euler's Formula

- Recursive Definition provides powerful technique for proving properties of planar graphs

Thm} If a connected graph has planar embedding, then

$$* V - E + \# \text{faces} = 2$$

Proof of structural induction over constructors

Chapter #6: Directed Graphs

- Endpoints now Distinguished

Definition: A directed Graph $G(V, E)$ is a set of Nodes V & Edges specified by an ordered pair of vertices

\Rightarrow Applicable where relationship is one-directional

Parallels to Undirected Graphs

Degrees

- Indegree (\leftarrow)
- Outdegree (\rightarrow)

Walks & Paths

- Hamiltonian reaches every node

Connectivity

- Strong connectivity
- Weak connectivity

DAG \rightarrow Directed Acyclic Graph (useful in scheduling & optimization)

Tournament Graphs

- n players compete in round-robin tournament
→ pairwise each node has played & beat one-another

Graphical form: Edge direction represents outcome

Finding Hamiltonian Path in Tournament Graph

- There exists a ranking such that each player lost to the player one position higher

Thm: Every Tournament Graph has directed Hamiltonian Path (strong I induction over vertices n)

Base case

- $P(1)$ trivially true, path of length 0

Inductive step

- Assume $P(0), \dots, P(n)$ true
- Choose vertex v arbitrarily and partition rest into 2 sets
 - $T \rightarrow$ "pointing to v "
 - $F \rightarrow$ "pointing from v "

The King-Chicken Theorem

- Suppose n chickens are in farm yard
- Chicken u pecks v if
 - chicken u pecks v
 - or
 - $2) u$ pecks w who pecks v

Communication Networks

Cool! Pay Attention

- Directed Graphs essential to model communication networks

vertices: computer, processor, switch

Edge: wire, fiber, transmission line

Packet Routing

- data can be communicated in packets (fixed amounts)

Assumption

- 1 packet at each input
- 1 packet destined for each output

Destination of packets is: $1, \dots, N-1$
permutation(Π)

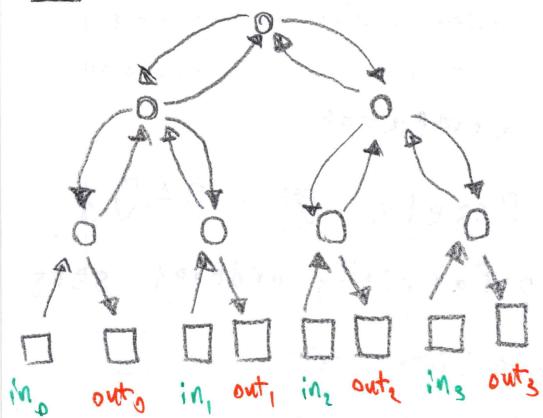
Goal: to get all packets to destination w/ as little hardware as possible

6.042 [J] (Page 7)

Complete Binary Tree

- \boxed{N} inputs, \boxed{N} outputs

ex



Key

\square = terminals

\circ = switches

Network Diameter

Latency \rightarrow time between a packet arriving between input & output

Diameter \rightarrow length of shortest path between probable input/output

Switch Size

- One can reduce network diameter using larger switches

Goal: keep the switch# count as low as possible

Congestion

- Fatal Flaw of Binary Tree

\rightarrow passing all packets through single switch prone to hold-up

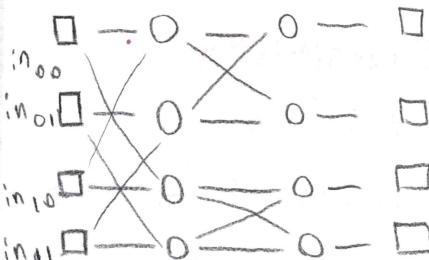
- Congestion will be a function of permutation problem \boxed{i}

{ Maxi-Min Problem }
dictates

The Butterfly

- Ideal solution would combine few switches \boxed{B}
low congestion

ex $\underline{\text{in1-1}} \quad \underline{\text{in1-2}}$



Characteristics

- All terminals & switches in \boxed{N} rows
- There exists $\log_2(N) + 1$ number of levels of switches

\rightarrow binary $b_0, b_1, b_2, \dots, b_{\log_2(N)}$ denotes binary indicator on crossing diagonals

Chapter #7: Relations 8 Partial Orders

Binary Relations

- Given sets $\boxed{A} \times \boxed{B}$, a Binary Relation $R: A \rightarrow B$ is a subset of $A \times B$

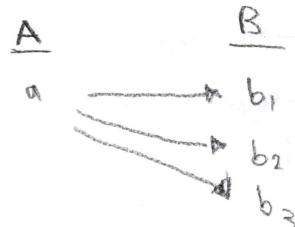
Notation: aRb , $a \sim b$

Function vs. Relation

. ALL Functions are Relations

. Not ALL Relations are Functions

\hookrightarrow can be multiple elements in \boxed{B} to single element \boxed{a}



Relational Images

• The Image of set \boxed{Y}

under relation $R: A \rightarrow B$

, written $R(Y)$

$$R(Y) := \{b \in B \mid \exists y \in Y \text{ such that } yRb\}$$

\rightarrow Sean of all possible outcomes of applying relation

Inverse Relations & Images

• Inverse R^{-1} of $R: A \rightarrow B$ defined by rule

$$bR^{-1}a \iff aRb$$

Combining Relations

(1) composition of Relations

$$(R \circ S): A \rightarrow C$$

$$a(R \circ S)c \iff \exists b \in B \quad \begin{array}{l} bRc \\ aSb \end{array}$$

2) Product of Two Relations

$$R_1: A_1 \rightarrow B_1$$

$$R_2: A_2 \rightarrow B_2$$

$$S = R_1 \times R_2$$

Relations & Cardinality

• Surjective & Injective Relations

1) **Surjective** IF every element of \boxed{B} assigned to at least one element of \boxed{A}

2) **Total** IF every element of \boxed{A} assigned to some element of \boxed{B}

3) **Injective** if every element in \boxed{B} mapped at most one

4) **Bijective** if \boxed{R} is total, surjective, injective, & a function

Cardinality

Key Point: Relational Properties useful in figuring out size of domains & codomains

$|A|$ = Cardinality of A

Relations on One Set

• All relations on single set \boxed{A} take form of subset $R \subseteq A \times A$

(can be represented as di-graph)

Key Concept: Properties of Relation $R: A \rightarrow A$

1) Reflexivity

$$\text{Math} | \forall x \in A. xRx$$

Graph | every node has loop

2) Symmetry

$$\forall x, y \in A. xRy \rightarrow yRx$$

3) Anti-symmetry

$$\forall x, y \in A (xRy \text{ AND } yRx)$$

$$\rightarrow x = y$$

Graph | No distinct pair of people like each other

4) Asymmetry

$$\text{Math} | \neg \exists x, y \in A. xRy \text{ AND } yRx$$

Graph | No one likes themselves, and no one likes each other

5) Transitivity

$$\text{Math} | \forall x, y, z \in A \\ xRy \text{ AND } yRz \rightarrow xRz$$

Partitions

• A partition of finite set \boxed{A} is a collection of disjoint subsets whose product of union is \boxed{A}

$$A_1 \cup A_2 \cup A_3 = \boxed{A}$$

partitions

Partial Orders

• Strong & Weak Partial orders

→ A relation \boxed{R} is a **weak** partial order if

• Transitive

• Anti-symmetric

• Reflexive

symbol: \preceq (weak partial order)
 \sqsubseteq (strong order)

Total Orders

• A partial order is **partial** b/c there can be two elements in \boxed{A} w/ no relation

comparable if ($a \leq b$ or $b \leq a$)

• A **Total Order** is a partial order where every pair of distinct elements are comparable

Posets & DAGs

o Partially ordered sets

→ Given partial order $\boxed{\leq}$ on set \boxed{A} , the pair (\leq, A) is a **poset**

o Posets are Acyclic

• A poset has no directed cycles other than self-loops

Transitive Closure

Every poset \rightarrow DAG. Is the reverse true?

Yes, but we must modify by adding edges to satisfy transitivity

Given Di-Graph $G(V, E)$

the transitive closure is di-graph $G^+(V, E^+)$

where, $E^+ = \{u \rightarrow v \mid \text{Add edges s.t Transitivity preserved}$

The Hasse Diagram

Problem: viewing a Poset as a Di-Graph, tends to be a lot of edges

→ But we need not write all edges implied by transitivity

Hasse Diagram: Minus

- ① Self Loops
- ② edges implied by transitivity

Topological Sort

A Topological sort is a total order s.t.

$$x \leq y \implies x \preceq y$$

Parallel Task Scheduling

Poset → Tasks to be done

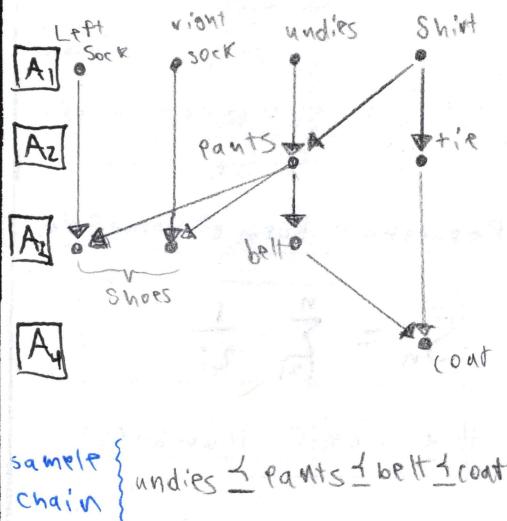
Partial order \preceq is Precedence

Constraint

Chain: sequence $a_1 \leq a_2 \leq \dots \leq a_n$

s.t. each item is comparable to the next item in the chain

Length of Time $\sim \text{Len}(\text{Longest chain})$

ex) Getting dressed* Unit # 3 :Counting *

Chapter: Sums 8
9: Asymptotics

Sums and Products

arise regularly in analysis of algorithms, finance, physical, Probabilistic Problems

Ex) # of Nodes in complete Binary Tree

$$\sum_{i=0}^{\log(N)} 2^i \rightarrow 2N - 1$$

closed form

Closed Form → Not making use of summation notation

The Perturbation Method

useful to perturb the sum to get something simpler

Ex

$$S = 1 + x + x^2 + \dots + x^{n-1}$$

(per turn) $x S = x + \dots + x^n$

$$(S - x S) = 1 - x^n$$

$$S = \frac{1 - x^n}{1 - x}$$

Variations in Geometric Sums

• Can obtain new summation by differentiating or integrating

$$\sum_{i=0}^{n-1} \frac{d}{dx}(x^i) = \sum_{i=0}^{n-1} i x^{i-1}$$

• If differentiate messes up powers of x, Multiply by \boxed{x}

Power Sums

Examine: $\sum_{i=1}^n i^2$

Guess

(Grows as 3rd Degree Polynomial)

$$\sum_{i=1}^n i^2 = an^3 + bn^2 + cn + d$$

→ Try values & get unique linear solution

NOTE: ALWAYS check result by Induction

Approximating Sums

- Sometimes summations have no closed forms
- Can form upper/lower bound replacing sum w/ Integral

$$S = \sum_{i=1}^n f(i)$$

$$I = \int_1^n f(i) dx$$

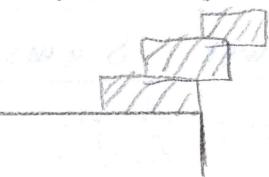
$$I + f(1) \leq S \leq I + f(n)$$

S

↳ sign inequality change for decreasing function

Guided Example: Hanging over the edge

- Is there some number n blocks that'll extend past table's edge



Stability

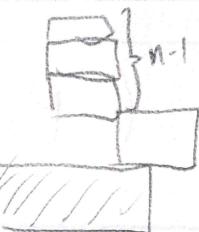
→ won't fall over

- Find Spread N possible w/ n blocks

Know: $S_n = 1/2$

Cases of Configuration

- Case 1 Right-most block in S is bottom block



$$C_m = \frac{(n-1) + (1)(\frac{1}{2})}{n} = 1 - \frac{1}{2n}$$

- Case 2 Right most block in S on top

Recurrence form of Solved Soln

$$S_n = \sum_{i=1}^n \frac{1}{2^i}$$

Harmonic Numbers

$$H_n := \sum_{i=1}^n \frac{1}{i}$$

- no closed form
- Also not Divergent as $n \rightarrow \infty, S \rightarrow \infty$

Double Summation

Try exchanging order of summation

ex

$$\sum_{K=1}^n H_K = \sum_{K=1}^n \sum_{j=1}^K \frac{1}{j}$$

Products

- Can transform

$$\prod_{i=1}^n \ln(i) \rightarrow \sum_{i=1}^n \text{taking the log}$$

Exponentiating

Key Concept: Asymptotic Notation

- used to characterize behavior of function as n grows large

Little O h

- Functions f asymptotically smaller than g if

$$\lim_{x \rightarrow \infty} \frac{f(x)}{g(x)} = 0$$

BIG O h

- Gives upper bound on run-time of algorithm

$$\limsup_{x \rightarrow \infty} f(x)/g(x) < \infty$$

ex

$2x = O(x)$ { pegging run-time to functional form complexity

Omega g d

Big → Inverse of Big Oh

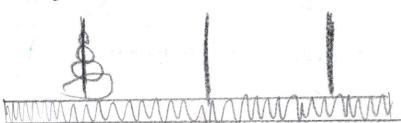
Chapter #10: Recurrences

- A recurrence describes a sequence of numbers whose later terms are products of predecessors

ex

$$T_1 = 1 \\ T_n = T_{n-1} + 1$$

- Reduces Big Problem to smaller problems w/ easy base cases

Towers of Hanoi

- You labor to move all disks from one to other according to 2 Rules

① Only permitted action is moving top disk to another

② A large disk can never lie above smaller disk

A recursive solution

$$T_n \rightarrow \min(\# \text{ of steps to solve } n\text{-disk problem})$$

3 steps

① Move top $n-1$ disks to another post in T_{n-1} steps

② Move largest disk (1 step)

③ same as 1)

$$T_n = 2T_{n-1} + 1$$

Solving Recurrence

→ Goal is to achieve closed form

Method 1 | Guess solution form

- Observe series values
- Observe Mechanics of process

Plug 'n' Chug Method

→ spot pattern in sequence of expressions

① Identify Pattern

② Verify Pattern

③ Write in terms of known recurrence base values

MERGE SORT

Input: List of n numbers

Procedure: first half \square
second half
of list are sorted recursively

Q: Max # of possible comparisons used in sorting n items?

$$T_1 = 0$$

$$T_n = 2T_{n/2} + (n-1)$$

Solving

* Form not easy to guess
Linear Recurrences

$$f(n) = a_1 f(n-1) + a_2 f(n-2) + \dots + a_d f(n-d)$$

Key Point: Solving Generalized Linear Recurrences① Equation - Form

$$f(n) = \sum_{i=1}^d a_i f(n-i) + g(n)$$

homogeneous part inhomogeneous part

* Just know method exists *

Chapter 11:
Cardinality Rules

- Can count one thing by counting another
 - Determine size of set \square

Bijection Rule

- If there exists bijection $f: A \rightarrow B$, then $|A| = |B|$

ex |

A = Ways to select dozen doughnuts of five varieties

B = 16-bit sequences w/ exactly four 1's



bijection!

- Knowing size of one set, you know the other

Counting Sequences

Product Rule

$$|P_1 \times P_2 \times P_3| = |P_1| \cdot |P_2| \cdot |P_3|$$

Subsets of n-element list

- Bijection: Subsets of X to n -bit sequences

$$\rightarrow 2^n$$

subset: $\{X_1, X_2, X_3\}$

sequence: 0010100100

Generalized Product Rule

- 3 prizes awarded into group of n people

$$|S| = n \cdot (n-1) \cdot (n-2)$$

The Division Rule

- If $f: A \rightarrow B$ is K -to-1

$$|A| = K \cdot |B|$$

Counting Subsets

- How many K -element subsets in n -element set

Notation $\binom{n}{K} :=$ # of K element subsets in n -element list

$$\binom{n}{K} = \frac{n!}{K!(n-K)!}$$

Examples w/ Poker

- ① Hands w/ four of a kind

- Rank of four cards
- Rank of extra card
- Suit of extra card

Bijection: {sequence of two ranks & suit}

hands

- ② Full house

- ③ 2-pair \rightarrow Don't forget 2-factor!

- ④ Hands with every suit

- composition of suits $\binom{4}{3}$

Inclusion - Exclusion

Union of Two Sets

$$|S_1 \cup S_2| = |S_1| + |S_2| - |S_1 \cap S_2|$$

ex:

How many permutations of $\{1, 2, \dots, 9\}$ contain

42, 04, or 60 consecutive

\rightarrow call this Pairs

$P_{42}, P_{04}, P_{60} \rightarrow$ where pair wise permutations occur

$P_{42,60}$ } use inclusion/exclusion to solve
 $P_{1, \dots}$
 $P_{1,2,3}$

Combinatorial Proofs

- ① Define a set S

- ② Show that $|S| = n$ counting one way

- ③ Show $|S| = m$, another

\Rightarrow prove $n = m$

The Pigeon hole Principle

- If $|X| > |Y|$, then for every total function

$f: X \rightarrow Y$, there exist two elements in X mapped to same element Y

A

B



Key to identify 3-things

- ① Set A
- ② set B
- ③ Mapping Function (f)

Guided Example: Magic Trick

- Audience selects 5 cards
- Assistant holds up 4 cards
- Magician guesses 5th one

tacit signal of communication } Order of Card Reveal

X
All sets of 5 cards

Y
Sequences of four distinct cards

$$\{A, C, D, E\} \leq \{A, C, D, E\}$$

Bi-Partite Matching Scheme

- Every distinct purpose of action adds permutation complexity

complexity

Chapter 12: Generating Functions

Transforms projects around sequences into problems about functions

Definition

- An ordinary generating function for sequence

$\langle g_0, g_1, g_2, g_3 \rangle$ is power series

$$G(x) = g_0 + g_1 x + \dots$$

ith term in sequence = coefficient of x^i in generating function

Notation

$$\langle g_0, g_1, \dots \rangle \longleftrightarrow g_0 + g_1 x + \dots$$

ex) Closed Sum of infinite geometric series

$$\begin{aligned} \langle 1, 1, 1 \rangle &\longleftrightarrow 1 + x + x^2 = \frac{1}{1-x} \\ \langle 1, -1, 1 \rangle &\longleftrightarrow 1 - x + x^2 = \frac{1}{1+x} \\ \langle 1, a_1, a_2, a_3 \rangle &\longleftrightarrow 1 + a_1 x + \frac{1}{1-a_3} x^3 \end{aligned}$$

Operations on Generating Functions

Carry out manipulations on sequences by doing mathematical operations on generating functions

Scaling

$$\langle cf_0, cf_1, cf_2, \dots \rangle \longleftrightarrow c \cdot F(x)$$

Addition

$$\langle f_0, f_1, f_2, \dots \rangle \longleftrightarrow F(x)$$

$$+ \langle g_0, g_1, g_2, \dots \rangle \longleftrightarrow G(x)$$

$$\langle f_0 + g_0, f_1 + g_1, f_2 + g_2, \dots \rangle \longleftrightarrow F(x) + G(x)$$

Right-Shift

$$\langle f_0, f_1, f_2 \rangle = F(x)$$

$$\boxed{K}$$

$$\langle 0, \dots, 0, f_0, f_1, f_2, \dots \rangle = x^K \cdot F(x)$$

Differentiation

$$\langle f_1, 2f_2, 3f_3, \dots \rangle \longleftrightarrow F'(x)$$

ex)

$$\frac{d}{dx} \langle 1, 1, 1, 1, 1 \rangle \rightarrow \langle 1, 2, 3, 4 \rangle$$

$$\langle 1, 2, 3, 4 \rangle \rightarrow \langle 0, 1, 2, 3, 4 \rangle$$

can continue to get square series $\langle 1, 4, 9, \dots \rangle$

Products

$$\langle a_0, a_1, a_2 \rangle \rightarrow A(x) \quad \langle b_0, b_1, b_2 \rangle \rightarrow B(x)$$

↓

$$\langle c_0, c_1, c_2 \rangle = A(x) \cdot B(x)$$

where, $c_n := a_0 b_n + a_1 b_{n-1} + \dots + a_m b_{m+n}$

signal processing { convolution

Evaluating Sums

$$\text{Suppose : } B(x) = \frac{1}{1-x}$$

then, $b_i = 1$, nth co-eff of

$$A(x) \cdot B(x) = \sum_{i=0}^n a_i$$

$$S_n = \sum_{i=0}^n a_i$$

Summation Rule

$$\langle a_0, a_1, a_2, \dots \rangle \longleftrightarrow A(x)$$

$$\langle S_0, S_1, S_2, \dots \rangle \longleftrightarrow \frac{A(x)}{1-x}$$

where,

$$S_n = \sum_{i=0}^n a_i \text{ for } n \geq 0$$

Extracting Co-efficients

- given $\langle f_0, f_1, f_2 \rangle \rightarrow F(x)$ simple

KB4 To go from Generating Function to coefficient sequence need:

Taylor Series

Let $F(x)$ be generating function of sequence

$$\langle f_0, f_1, f_2, \dots \rangle$$

$$f_0 = F(0)$$

$$f_n = \frac{F^{(n)}(0)}{n!}$$

→ allows for expansion of well-known functions

Ex

$$F(x) = \frac{x+x^2}{(1-x)^4} = \frac{x}{(1-x)^4} + \frac{x^2}{(1-x)^4}$$

Key: x^n in $F(x)$ is sum

of x^{n-1} in $\frac{1}{(1-x)^4}$

$\boxed{8}$ x^{n-2} in $\frac{1}{(1-x)^4}$

Partial Fractions

underlies trick we employed above

$$\begin{array}{l} \text{(terms of form)} \\ \hline \frac{cx^a}{(1-dx)^b} \end{array}$$

n^{th} derivative of

$$\frac{1}{(1-dx)^b}$$

$$\frac{(-)(ntb-1)dx^n}{(b-1)!(1-dx)^{b+n}}$$

→ Then Following Partial Fraction Decomposition, add appropriate terms

Solving Linear Recurrences

Just know it can be done for general Linear Recurrences

Counting w/ Generating Functions

Useful for counting Problems (Choosing items from a set)

→ coefficient of x^n is way to select n things

choosing distinct items

$$\langle (K), (K), \dots (K), \infty \rangle$$

co-eff of x^n is number of ways to select n from K

Chapter: Infinite Sets
13:

Just know power series is Loh always larger

Chapter: Events &
14: Probability Space

Four - Step Method

Step #1: Find Sample space

- Identify All possible outcomes
- Find Key qualities of Decision space prior to event

Step #2: Define event of interest

Step #3: Determine Outcome probabilities

Step 4 → compute event probabilities

Set Theory & Probability

Set = Sample Space

Subset = Event

Terminology

A countable sample space $\{S\}$ is a non-empty

countable set, whose elements $w \in S$ are outcomes

subset of S is an event

$$\Pr(E) := \sum_{w \in E} \Pr(w)$$

Sum Rule (if events Disjoint)

$$\Pr[E \cup F] = \Pr[E] + \Pr[F]$$

Uniform Probability Space

$$\Pr(E) = \frac{|E|}{|S|}$$

(counting # of outcomes akin to probability)

Chapter: Conditional Probability
15:

Notation: $\Pr[A|B]$

A Posteriori Probabilities

conditional Probability $P[B|A]$ is A Posteriori if

B before A in time

↓
Gives rise to Bayes Rule

Key Point: Equivalence between A posteriori & regular event spaces

A = Won the series

B = won first Match

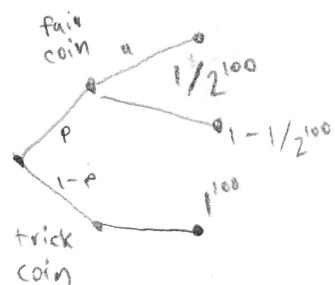
$$P[B|A] = \frac{\Pr(A) \Pr(A|B)}{\Pr(B)}$$

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(Page 11)

ex) Coin Problem

- fair or trick coin w/ heads on both sides
- \Rightarrow can we derive intuition as to whether coin was fair if we flip heads 100 times



A \rightarrow handed fair coin

B \rightarrow flipped all heads

Conditional Identities

$$\Pr(A) = \Pr[A|E] \cdot P[E] + \Pr[A|\bar{E}] \cdot P[\bar{E}]$$

Chapter #16 : Independence

- Events A & B independent if

$$\begin{cases} \Pr(B) = 0 \text{ or } \\ \Pr(A|B) = \Pr(A) \end{cases}$$

Note: Disjoint \neq Independent

Independence is an assumption

Mutual Independence

$$\Pr\left[\bigcap_{j \in S} E_j\right] = \prod_{j \in S} \Pr(E_j)$$

Pair-wise Independence

- a set of A_1, A_2, \dots of events is k-way independent iff every set of $\leq k$ of these events is mutually independent

The Birthday Paradox

- In 100-person class what is probability a birthday is shared?

Assumptions

- All birthdays equally likely
- Birthdays are mutually independent

Application to i Hashing

- set of m numbers you'd like to assign from [1, N]

Chapter Random Variables # 17 : and Distributions

Random Variables

- Random variable R on a probability space is a total function whose domain is sample space

Mapping

{event} \longrightarrow Real #

Indicator Random Variables

\rightarrow Maps every outcome to [0,1]

- RV's partition sample spaces into subsets (like events)

\rightarrow same rules for events apply to RV

Distribution Functions

- Random Variables on different probability spaces can share Probability Density Functions

$$\text{PDF}_R(x) = \begin{cases} \Pr[R=x] & \text{if } x \text{ is an element of } R \\ 0 & \text{else} \end{cases}$$

$$\text{CDF}_R(x) = \Pr[R \leq x]$$

Bernoulli Distributions

\rightarrow Distribution of an indicator RV

$$f_p(0) = p$$

$$f_p(1) = 1 - p$$

Bi-nomial Distribution

$$f_n(k) = \binom{n}{k} p^k (1-p)^{n-k}$$

In General

$$f_n(k) = \binom{n}{k} p^k (1-p)^{n-k}$$

Chapter #19: Deviations

Variance

$$\text{Var}[R] := \mathbb{E}[(R - \mathbb{E}[R])^2]$$

• we square to avoid sign cancellation

Markov's Theorem

$$\Pr[R \geq x] \leq \frac{\mathbb{E}[R]}{x}$$

Proof

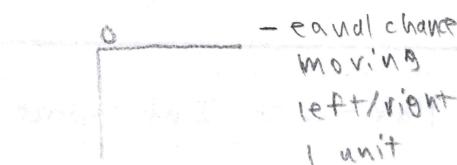
$$\begin{aligned} \mathbb{E}[R] &= \sum_{y \in \text{range}(R)} y \cdot \Pr[R=y] \\ &\geq \sum_{y \geq x} y \cdot \Pr[R=y] \end{aligned}$$

$$= x \Pr[R \geq x]$$

** See Last
Page for
in depth
statistics Notes
on Markov
Theorem &
Chebyshev

Chapter #20: Unbiased Random Walks

Insepiration

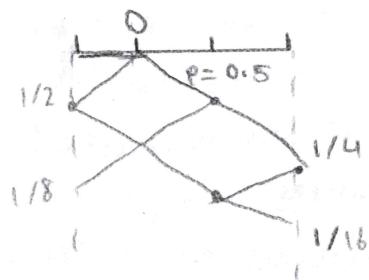


Random Walk \rightarrow some value moves up or down over time

Terminology

boundary condition \rightarrow if value hits walk ends

Example



• Unbiased Random walk with absorbing barriers at $\boxed{0}$ & $\boxed{1/3}$

\rightarrow Takes form of Recurrence (18.03 will provide info on how to solve such systems)

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Markov's Theorem

Derivation:

$$\Pr[R \geq x] \leq \frac{\mathbb{E}[R]}{x}$$

$$1) \mathbb{E}[R] = \sum_{y \in \text{Range}(R)} y \cdot \Pr[R=y]$$

$$\begin{aligned} 2) \quad " \quad & \geq \sum_{\substack{y \geq x \\ y \in \text{Range}(R)}} x \cdot \Pr[R=y] \\ & \geq x \cdot \sum_{\substack{y \geq x \\ y \in \text{Range}(R)}} \Pr[R=y] \end{aligned}$$

$$\mathbb{E}[R] \geq x \cdot \Pr[R \geq x]$$

~~Caveat: only for non-negative, random variable~~

→ gives guidance on bounded probability of ability of RV to attain value

CASE: Bounded Variables

- Suppose $\mathbb{E}[R] = 150$
- $\Rightarrow \Pr(R \geq 200)$

8) R is no less than 100

Transformation: $T := \frac{R - 100}{\sigma_R}$

$$\Pr[R \geq 200] = \Pr[T \geq 100] \leq \frac{50}{100}$$

* Better Markov bounds found by transforming variable

Case: Deviations Below Mean

Transformation: $S := \frac{M - R}{\sigma_R}$

Chebyshev's Theorem

Key Idea: Applying Markov's Thm to powers of $|R|$

$$\Pr[|R - \mathbb{E}[R]| \geq x] \leq \frac{\text{Var}[R]}{x^2}$$

special substitution:

$$x = c \sigma_R$$

$c = \text{constant}$

$\sigma_R = \text{std dev}$

Bounds for Sums of Random Variables

Motivating Example

- 24 K posts received every 10 minutes
- Processing Avg = $\left[\frac{1}{4} \right]$
- assigned across m machines
- * Random Solutions can come in handy where deterministic methods fail

Murphy's Law

- Let A_1, \dots, A_n be mutually independent events

$$T = T_1 + T_2 + \dots + T_n$$

where T_i is indicator variable of A_i

$$\Pr[T=0] \leq e^{-\text{Ex}[T]}$$

The Chernoff Bound

- * High Parallels to Stat Mech

Def: The sum of lots of little independent RV's unlikely to significantly exceed mean of sum

Theorem

- Let T_1, \dots, T_n be mutually independent RV s.t $0 \leq T_i \leq 1$

$$\text{Let } T = \sum_{i=1}^n T_i$$

- Sum takes on value on $[0, 1]$
- , No assumed Distribution Form
- . No dependency on m

Derivation

$$\Pr[T \geq c \text{Ex}[T]] = \Pr[cT \geq c^c \text{Ex}[T]]$$

$$\begin{aligned} (\text{By Markov}) &\leq \frac{\text{Ex}[cT]}{c^c \text{Ex}[T]} \\ &\leq \frac{e^{(c-1)\text{Ex}[T]}}{c^c \text{Ex}[T]} \end{aligned}$$