Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in L \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin L \forall \pi P(x, \pi) = 0$ PROPOSITIONAZ PROOFSYSIEM Proof system for tautologies in propositional logic	PROOF CPLX LEZIVRES MIT APRIL 2009 (I
2) Proof by exhaustion: $25957 \equiv 1 \pmod{2}$ $\equiv 1 \pmod{3}$ $\equiv 19 \pmod{99}$ $0K$, but maybe a $\equiv 0 \pmod{90}$ $0K$, but maybe a $\equiv 0 \pmod{99}$ $0K$, but maybe a $\equiv 0 \pmod{99}$	What is a proof? Claim: 25957 product of mo primes
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	1) Proof by intimiclasion: Obius - left to the reader.
OK, but maybe a $= 0 \pmod{101}$ bit of over will $= 1 \pmod{103}$ $= 0 \pmod{257}$ 3) $25957 = 101.0257$, left to the reader to check primality. A proof should be EFFICIENTLY VERIFIABLE Formally Proof system for language L Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in L \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin L \neq \pi P(x, \pi) = 0$ PROPOSITIONAL PROOFSYSIEM Proof system for tautologies in propositional logic	2) Proof by exhaustion: $25957 \equiv 1 \pmod{2}$ $\equiv 1 \pmod{3}$
3) $25957 = 101.257$, left to the reader to check primality. A proof should be EFFICIENTLY VERIFIABLE Tomally Proof system for language L Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in L \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin L \not \exists \pi P(x, \pi) = 0$ PROPOSITIONAL PROOFSYSTEM Proof system for tautologies in propositional logic	OK, but maybe a $= 0 \pmod{101}$ bit of overkill $= 1 \pmod{103}$
A proof should be EFFICIENTLY VERIFIABLE Formally Proof system for language \mathcal{L} Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in \mathcal{L} \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin \mathcal{L} \forall \pi P(x, \pi) = 0$ PROPOSITIONAL PROOFSYSTEM Proof system for tautologies in propositional logic	
Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in L \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin L \forall \pi P(x, \pi) = 0$ PROPOSITIONAL PROOFSYSIEM Proof system for tautologies in propositional logic	
Deterministic algorithm $P(x, \pi)$ Polynomial in $ x + \pi $ $x \in L \Rightarrow \exists \pi P(x, \pi) = 1$ $x \notin L \forall \pi P(x, \pi) = 0$ PROPOSITIONAL PROOFSYSIEM Proof system for tautologies in propositional logic	Formally Proof system for language L
$x \in \mathcal{L} \ni \exists \pi P(x,\pi) = 1$ $x \notin \mathcal{L} \not\vdash \pi P(x,\pi) = 0$ PROPOSITIONAZ PROOFSYSIEM Proof system for tautologies in propositional logic	
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Proof system for tautologies in propositional logic	
Proof system for tautologies in propositional logic	PROPOSITIONAZ PROOFSYSTEM
(formulas one under all mole value assignment)	Proof system for tautologies in propositional logic
The contract of the contract o	(formulas one under all morle value assignments)
Denote this language TAVT	

Why care? Reason R2) (Incler stand limits of mathematical reasoning cason R3) SAT-solvers / Automated theorem proving Complexity of P: smallest $g: N \to N + s.t.$ Every $x \in L$ has proof π of size $|\pi| \leq g(|x|)$ g = poly(n): POLYNOMIALLY BOUNDED proof system THM (Cook & Recletion 1979)

NP = co-NP iff there exists a polynomially

bounded propositional proof agreem (COR No polynomially Counded pps => P + ND Distant good ... Instead study stronger and stronger concrete systems and prove tower bounds.

EXAMPLES OF PROOF SYSTEMS (1/2) Prore toutologies () refuse unavisfiable CNF formulas Follows from ND-complexencess of SAT More direct reduction with huar blow-up a) Intooluce one variable for every subformula (6) Add contraints shaving values propagare correctly Ex F=G->H (-x, vxg vxn) 1 (xx v xx) n (xp v xn) (c) Add clause XF for course formula F => CNF formula un satisfiable iff original formula tautology FROM now on Funcionistiable CNF formula. | proof = refusariory Ex1 [Touth tables] Listall 2" touth value
assignments and værif that
F is false for each assignment Ex2 Resolution | Start with clauses in formula Derve new clauses by resolution rule Evoc DV & CVD Keep applying resolution whe to old and new clause until we get empty clause O without literals.

Ex 3 [Cutting planes] Translate clauses to linear inequalities $x \vee y \vee \overline{x} \implies x + y + (1-z) \ge 1$ $x + y - z \ge 0$ Add megnalines $|x| \ge 0$ for all anables. Dervation rules Addition $Z'a;x; \geq A$ $Z'b;x; \geq B$ $\sum (a_i + b_i) \times_i \ge A + B$ $\sum (a_i \times_i) \ge A$ $c \ge 0$ Multiplication $\sum_{i} c\alpha_{i} \alpha_{i} \geq cA$ Dission $\sum_{i} a_{i}, x_{i} \ge A$ $C(a_{i}, \forall a_{i})$ Z, (a;/c) x, > [A/c] K Rounding is crucial Ex 4 Frege system

A V C BV-O [CUT RUCE]

A V B A, B, C orbitrary formulas.

Plus possibly additional rules for purely
syntactic massage All of these systems are SOUND cannet refite satisfiable formulas COMPLETE rpues every insarifiable formula (Needs promy, of course)

How to measure strength? (5) P2 POLYNOMIAZLY SIMULITES P2 if there is a poly-time function of napping P2-proofs to $P_2 - proofs$ $P_2 \leq_p P_2$ f = TAUT \oint_{UNSAT} (since we decided to suited to unsatisfiable formulas) P, and P2 are POZYNOMIAZET GAVINACENT; f $P_1 \leq p P_2$ and $P_2 \leq p P_2$ 11f P2 = P, but there are formulas
hard for P2 but easy for P, then P, is STRICTZY STRONGER than PZ Study concrete families of CNF formulas 1) separate proof systems 2) Quantify how hard / Leep various forms of mathemanical reasonity, is (formula families often enrody of combinatorial principles or such like) Connected to reason R2 Three examples:

GRAPPE TAUTOLOGY FORMULAS "A transitive DAG without 2-cycles must have a source" Xiij true if directed edge (ij) ('j' = [n] Gin = $\int_{i,j,k} \left(\overline{x}_{ij} \vee \overline{x}_{jk} \vee x_{ik} \right)$ distance $\int_{i\neq j} \left(\overline{x}_{ij} \vee \overline{x}_{ji} \right)$ [transitisty] [no 2-cycles] [vertex] is not source] PIGEON HOLE PRINCIPLE "m pigeons do not fit into u holes (if m=n)" Xij true if pigeon i sits in hole j (every pigeon sits in some hole 1 $\int_{[i,j]} \int_{[i,j]} \left[x + x_{i2} \right] \left[x_{ij} + x_{i2} \right] \left$ RANDOM k-CNF formula Fun, n

m clauses over n variables chosen uniformly

from get of all 2k(n) k-clauses Fr Fk. sample formula fran this dismibution (For today) fix m = c.n for some c = 5, say
Then the Fundament surely
Then Fundaments fiable

	p-bounder	huroma- rizable	Simut Jarim	G12	Prepn-1	Random K-CNF
TRUTH TABLES	No (trivially)	Yes (trivally)		Hank	Hanl	Hard
RESOLUTION	No	Polaly	15 ≤p nus	Easy	Rard	Harl
CUTTING PLANES	No	open	Res EP CP	Fang	Easy	~ Open
FREGE	7 Cpen	Polibly not*	CP Sp Forge	Eury	Eary	2 open
*) Under	complexity	rheores.	è assur	prions		

When about reason R3 - SAT solving? (8) Not enough that small proofs exist. We want Proof search algorithm Ap input: BNF formula F output: P- epitation of F if F imasisfiable Pis AUTOMATIZABLE if there is a growt searchalgo Ap that finals a proof for any F in some polynomial in the smalless proof for F(also add poly time in formula size to
avoid annoying problems) Trush tables trivally automaticable (and concernnes this; she regrace can do) Resolution 3 not automatizable under Forge Deausible assumptions. Courty planes - open but probably not There are non-trival automatizable proof systems, but informally, the stronger the system is, the less likely it seems to be automaticable However, there are really good applied algorithms based on resolution (winners in SAT 08 competition)

THIS CONCLUDES OVERVIEN From non on focus on one parriales proof symun one parsialer formula family

- propon hole principle Prove exponential love bound TERMINOZOGY Literal X of X (not x) clause x y y z (set of literals)

sizesk => k - clause CNF formula conjunction of dams (see of clauses) k-CNF Somula Vars (F) = anables all trush value assignments that satisfy F must also satisfy D $\{1, 2, ..., n\}$ LnJ = FAZSITY - O TRUTH - 1

Resolution denvation of clause D 11: F - D $TT = \{ D_1, D_2, \dots, D_L \}$ Each D_i either a) clause of 1= AXIONI CVX DVX 6) derved by resolution whe from Dj, Dk , j, k < i Resolution refutation: Demation of empty clause O (clause with no litebals) 1. (xvy) naxim Lengsh 2, (2 v Z) n assim 3. (ZVW) A ascim L(T) = 9 4. (X V W) rascion In resolution re measure length rather than 5 20 5. (\(\overline{\pi} \v y)\) ascim (difference at most whear factor) 6. x v w Res(2,3) 7. x Res (4,6) L(F+0) min Tength of 8. x Res (1,5) any refunction 9. 0 12es (7,8) CVD (doesn't maker) Also add WEAKENING whe

Someliness: Obrions Complexeners: Proof by example Build search roe

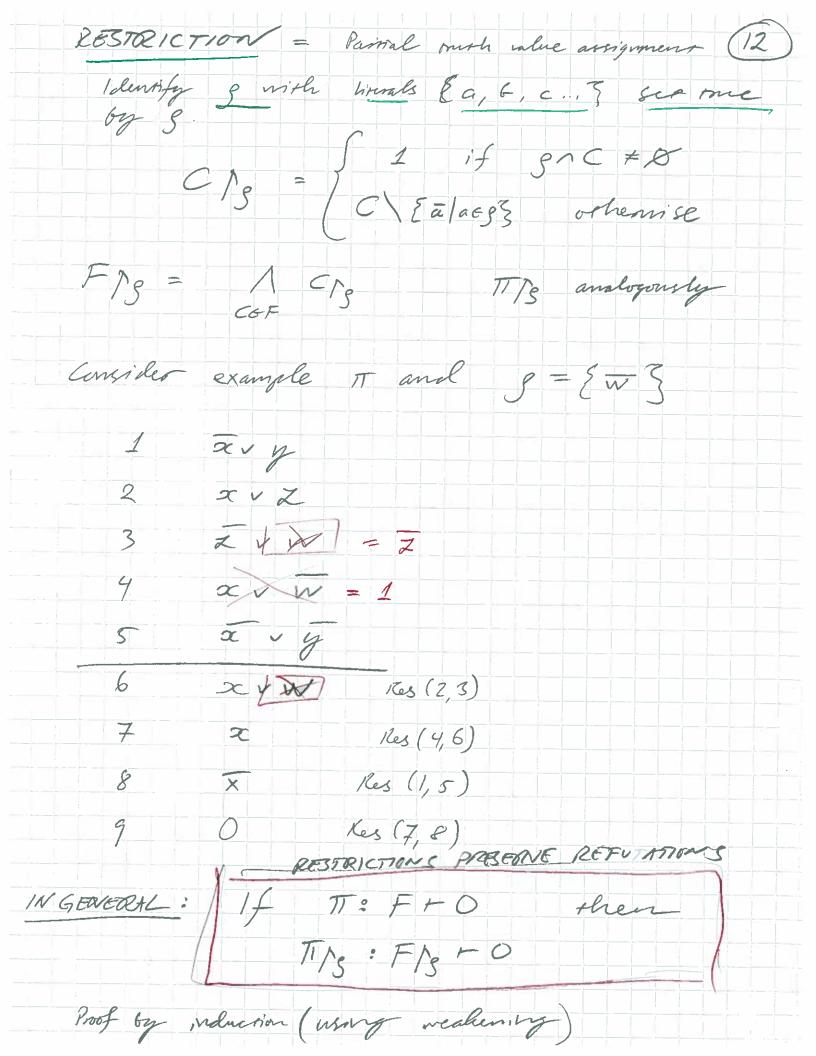
Every verrex guerres a variable

0-colge down left

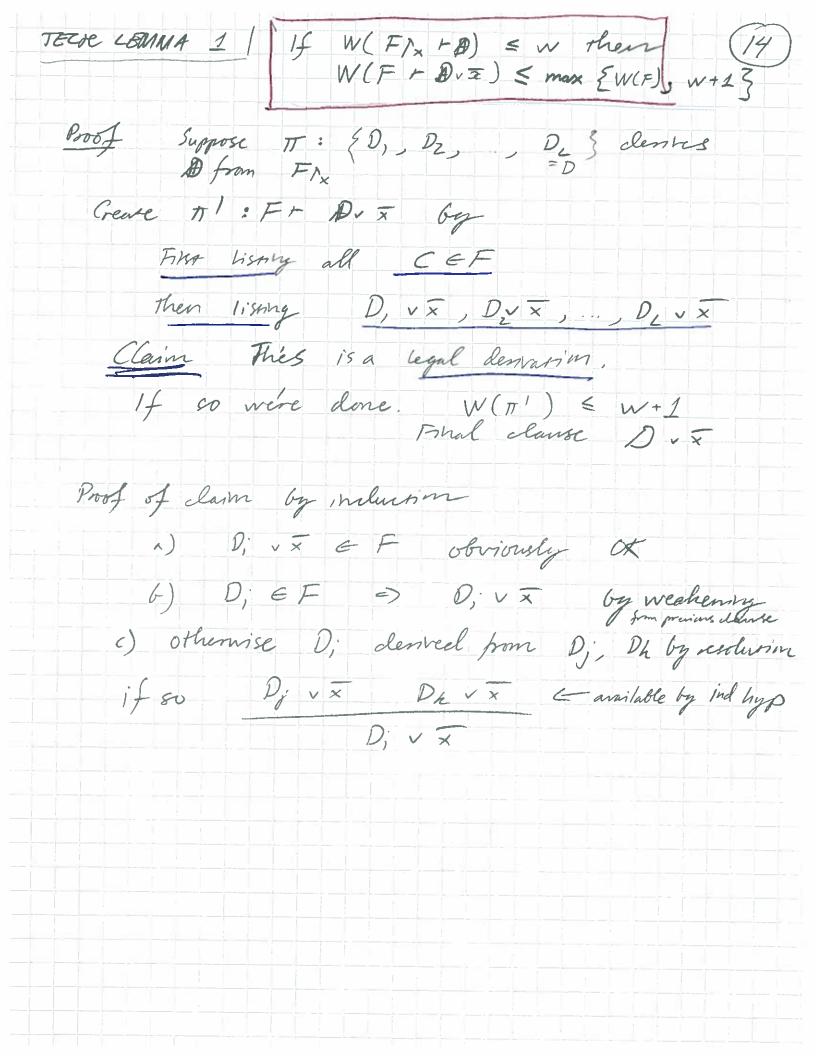
1-colge down report Early park diffues (parrial) mish alue assignment As soon as some clause falsified => add leaf tabelled by that clause XVX ZVW This works in general (using wealerning)

clause at each usex = minimal clause polerifically passed

Tree height \(\leq \frac{\pm}{2} \) variables in I Any formula F can be refuted in length $\left| \frac{1}{2} (F + 0) \right| \leq 2^{n+1} - 1 = \exp(0(n)) |$ Tree-like refusion - drow reputsion as tree graph. Formally As soon as non-axion used, much by *. Starred clauses can never be und again (but can be rederived). Tree like knowth / dT (F+0) 1



Want to prove Cover Counds in length (13) Hard ... Hokan's 85' result took 2025 years toper ... Ben-Sasson & Wigderson 199 Look at midely - # lixals in largest clause W(17) midsh of refusation W (F + 0) min width of any reputations. Easy If a refusarion is narrow, then 17 is short.
Width w > masc (2. |Vars(F)|) distint clauses. New inight "Short proofs are narrow" If there is a short popularion, then there must also exist a namer one Road map 1) Prove W(F+0) large => L(F+0) large Actually: Skerch 2) Prove W(PtePn +0) large 3) Fill in dessits in (2) (maybe) NB! STATE THEMS ON PAGES 15-16 BEFORE PROVING LEMMAS

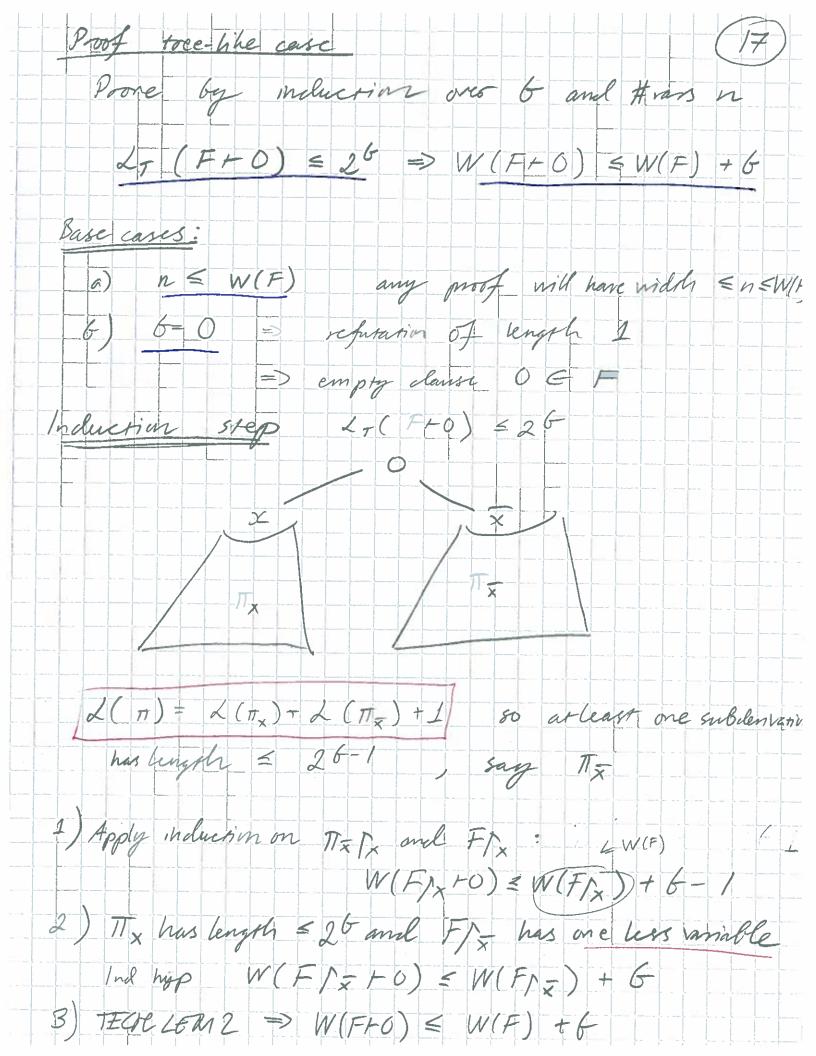


JECK LEMMA 2 If $W(F/x+0) \leq w-1$ and $W(F/x+0) \leq W$ then $W(F+0) \leq \max \{w, W(F)\}$ Proof 1) By Tech Lem 1 Penice X in width w 2) Resolve ā nith every clause (h F containing x. This is exactly the same as regricitly by x, so now we have FIX
thewidth of this part, s < W(F) 3) By assumption refuse FI= in width = w Tech Lamma 2 is the key argument in BW's proof THAN 1 (TREE-LIKE RESOLUTION BW 199) (FHO) = W(F) + Log2 LT(F+O) $\left| \mathcal{L}_{\mathcal{T}} \left(F + 0 \right) \right| \geq 2^{W(F + 6) - W(F)} /$ Will be proven shorty

MAIN THEM 2 (GENERAL RESOLUTION) (16) $[W(F+0)] \leq W(F) + \sqrt{8n \ln 2(F+0)}[$ where n = # variables in F Note in (norst possible) = O(n) So bound is sort of geometric mean (vost-case upper bound) - (actual apper bound) WAN COR (L(F+0) = exp ((W(F+0) - W(F))2)

To get anything menty need 1) W(F) small 2) W (F+0) - W(F) = w (/n /n n) Bonet Galesi '99 proved that the theorem is essentially tight.

iliny (variant of) GiTn formulas Proof not hard but more complicated. So re prove Thm 2 but use Thm 2,...:-)



Nore that this consonucion leads to exponential blow-up, in length! (so short proofs are not namm after all?)
Same thing happens in general thin. TORN QUESTION: 15 this Glow-up necessary? 1.e. is there a trude-off between length and width. Where does general case fail?
In the like case, easy to find estimation that hills = 1/2 of reputation Subclementions may (and will) share clauses
Eliminate may vide clauses by setting commonly occumby literal to true. More complicated valuetive argument.

PIEP LONGR BOUND PHEP LOWER BOUND

PHEP COMPANS OF clauses

"Pigeon i in some hole"

Jej' \(\overline{x} \); \(\overline m>n => unsatisfiable Today focus on hardest case m=n+1 (inminuly carried for larger in) THAM (Hahan 85)

L(PHP 10) = eop (2 ()) Hahan
4CT Want to use BW machinery. I'm problems 1) Frefusarius, h midoli O(n) = O(V#variables) 2) Also, vileth of formula is n.

Make formula "sparser" Assume throughout

[w]=m M=m

[w]=m M=m

(u) reighbours PHP(G) = 1 V Zur 1 1 (\overline{\pi_{uv}} v \overline{\pi_{uv}}) 085 14 G= (Up V E') has E' = E then 2(PHP(G))+0) = 2(PHP(G')+0) Proof Complex & seating xuv = 0 for all edges (u,v) & & \E.

In particular, this holds for 61 = Km with PHP(Km) = PHPm Suppose G has constant lift degree d= 2) Then PHP(G) &- CNF from la COTENTIALLY
with den variables. = O(n) BACKIN
BUSINESS! If we can find G with W(PHP(6) 20) = 12(n) we're done (by she Main Corollary) since $L(PHP(G)+0) = exp(\Omega(\frac{(n-d)^2}{d(n+1)}) = exp(\Omega(n)).$ Why is PHEP hard. 2 Every set of S = n pigeons fit perfectly into holes. No "local argument" can derive contradictions What, f & Cl' = Cl, 141 = O(n) have | N(u') 1 large Want (a) sparse graph with (b) good connectivity EXPINDER (BIPARTITE VERTEX EXPINDER GIRAPIC) G= (UUV, E) is a (cl,s,e) - expender if

a) left degree de (gase)

b) HU'= U | 14'1=5 have |N(U')| > e |U'|

[connection [connection by In fact need seh slightly stronger

UNIQUE NEIGHBOUR EXPANDER Gis (d, s, e) - unique neighbour expandes (or sancomes bambary expande) , f a) left degree d 6) +u'=u /u'/ \(\sigma\) inchare \(\pau\) \(\left\) = e/u'/ where v = | 201 | if /N(r) n(1 | = 2 PROPOSITION Ang (d, s, K) - expande - 18

(d, s, 2 K -d) - un que expande -LEMMA A For a (d, s, e) - unique expande e = 1, 17 holds that W(PLP(G)+0) = 5.e/2 LEMMA B There is a C > 1 s. c. In large enough there are G = (U, V, E), 14/=n+/, 1/1/=n) that are (5 n/c 2) - unique expande of Proof of B (shetch)

Can be done consomely (state) but we wan't

Prove existence of (5, n/c, 3) - expanders

Prove existence of (5, n/c, 3) - expanders For all 46 U. pick 5 neighbours in V uniformly among all (n) subsers. For the 13th c, this is an example (with over whelming probability).

Sherch of calculations: (d,s,e) G fails to be example if I U' 141/55 and V'=V, IV'/= 3s s.E. X(U') = V'. $P_{\sigma} \left[N(u') = V' \right] = \begin{pmatrix} 3s \\ 5 \end{pmatrix}^{S}$ $\binom{n}{s}$ By the union bound, the probability that there is some $\frac{s}{s} = \frac{s}{m} \left(\frac{n}{3t} \right) \left(\frac{3t}{5} \right) = \frac{1}{s} = \frac{n}{m} ck$ $t = \frac{1}{m} \left(\frac{n}{5} \right) = \frac{1}{s} = \frac{1}{m} ck$ 5 = n/c for c lange enough So expanders exist And there are even explicit constructions: Capalbo-Reingold-Valhan-Wigdesson STOC 102 (But note that we don't need this - we just use the expander inside the proof, so non-explicioness is perfectly OK) USEFUL FACIS FOR CALCULATIONS (i) $if m > n + lun \begin{pmatrix} n \\ k \end{pmatrix}$ $<\left(\frac{n}{m}\right)^k$ (ii) $\binom{n}{k} \leq \binom{ne}{k}^k$ There $e = \exp(2)$

PROOF OF LEGISLA A Proof strategy: Given (23) TI = 1 Dr. Dr. . . PC & , define measure pr: Eclanses & -> W of "magness" 5. 6. (i) y (axioms) \ \leq 1 (ii) M (final empty clause 0) & large (iii) u only necesses quadrally so there is some D; with medium-sized measure u (D;)

(iv) Such a D; must contact many lieals
(because of expansion) Let He denote all "hole axions" on form X 100 X 410 [m (D)):= min \$ 101/1: 1 park = D} (i) CER = M(C)=0 $\begin{array}{c|c}
C = p^{4} \Rightarrow M(C) \neq Z \\
\hline
(ii) M(0) \Rightarrow S
\end{array}$ Any set U' of spigeons fit, nto Becouse of expansion 18u1 = 1u1 dismet holes We Hall's theorem or asque directly over / U'l Hence 1 Parte # O. SUBADO DUITY (iii) If DVX DVX WRT KESUZUMON RUCE then $M(D \cdot D) \leq M(D \cdot x) + M(D \cdot x)$

1f U, sanspres 1 Punte = Dvx

uou,

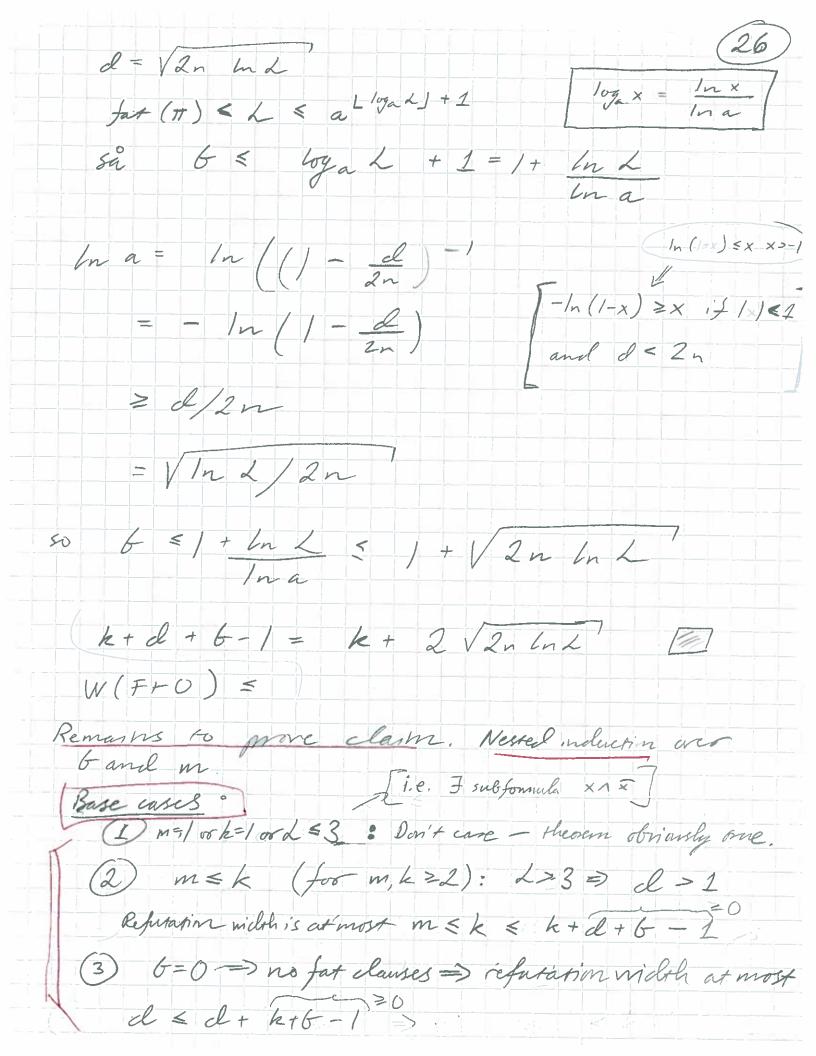
nevz

nevz then 1 pu 1 H = D v 0 / Hence there is some DETT with | 5/2 & m(D) < s/ Fix W of size M(D) s.E. 1 pun 20 = D CLAIM | $\forall v \in \partial U' \exists variable \propto u_v \cdot v in D$.

But $|\partial U'| \ge e |U'| \ge s \cdot e / 2$ since 6) is an expander. Hence (W(D) > 5e/2/ Proof of claims: By contradiction Tox v-* E 201/
Let u* EU unique neightons. C>No variable Xuv* in D 1 pu 1 le # D by definition

uell'\ [u+] (u' minimal size) Fix & satisfying LHS and falsifying D. Wlog X (Xn,v+)=0 FUEN(v+) This commet folisty k Commot falsify any P" since U* is the unique neighbour of sin U'
Commot satisfy D since there are no variables xu, or in D.

MISSING DETAILS IN/BW 99 call TECH LEMMA 2 1+ W(F/x +0) ≤ w-1 and W(F/x +0) ≤ w then W(F+0) = max {W(F), ws. Let F k-CNF formula over n variables. Suppose L(F/O) = L. Want to prove W (F+0) \le k + V 8n m 2 Fix min-length refusaion IT: F+O of length & Ser d:= V2n h L a:= (1 + d) Note a > 1 since cl < 2n (2 < e2n) Call a clause D FAT if W(D) = d Far(TT) = # fat clauses in TI CLAM Let G be any k-CNF over msn unables and suppose 7 11 'G+O s.t. fat (11) < ab, $W(G+0) \leq k + d+6-1$ (*) Fran His we get W(F+0) = kk + 18n h2



Inductive step Suppose (*) holds for (a) all k-CNFs over < m ramables

(b) all k-CNFs over = m variables with fat (171) < a 6-2 Consider Ti: GHO with fat (1) = a 6 In literals all in all d. fax (T) literals in far clauses. Pigeonhole principle => some literal in at least 2m fat (17) = de fat (TF) clauses. Suppose who shead of Consider II 1: 67/2 - all these claims disappear TT/x has < (1-2d) ab = ab- fat clauses So by the induction hyp W(G/x -0) = k+d+6-2 Now consider TIA=: ETA=+0. TIT - has less than at for clauses and GIT has < in variables. By hel. hyp W(G) / - -0) = k+d+G-1 Use Tech Lemma 2 => $W(G+0) \leq \max\{k, k+cl+6-1\}$ = k+cl+6-1 QED