

# 3-SAT & NP-hardness

The most important NP-complete (logic) problem family!

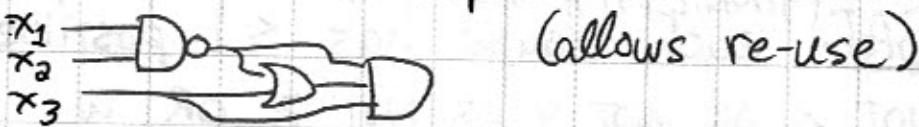
SAT = Satisfiability: [Cook 1971; Levin 1973]

- given a Boolean formula (AND, OR, NOT)

over  $n$  variables  $x_1, x_2, \dots, x_n$ .

- can you set  $x_i$ 's to make formula true?

Circuit SAT: formula expressed as circuit of gates



CNF SAT: formula = AND of clauses [Cook 1971]

Conjunctive clause = OR of literals

Normal Form literal  $\in \{x_i, \text{NOT } x_i\}$

- can view as bipartite graph:

Variables vs. clauses, positive/negative edges

3SAT: clause = OR of 3 literals [Cook 1971]

i.e. clause degrees = 3

3SAT-5: each variable occurs in  $\leq 5$  clauses

[Feige - JACM 1998; perhaps earlier?]

Monotone 3SAT: [Gold - I&C 1978]

each clause all positive or all negative

(2)

Beware polynomial-time variants!

2SAT: clause = OR of 2 literals

- polynomial

- $x \text{ OR } y \equiv \text{NOT } x \Rightarrow y$  ( $\equiv \text{NOT } y \Rightarrow x$ )

- guess  $x_i$ , follow all implication chains to check OR

BUT...

Max 2SAT: set variables to maximize # true clauses

- NP-complete [Garey, Johnson, Stockmeyer 1976]

Horn SAT: each clause has  $\leq 1$  positive literal  
<sup>(generalization of 2-SAT)</sup>

- $\text{NOT } x \text{ OR NOT } y \text{ OR NOT } z \text{ OR } w$

- $\equiv \text{NOT } (x \text{ AND } y \text{ AND } z) \text{ OR } w$  (Morgan's thm)

- $\equiv (x \text{ AND } y \text{ AND } z) \Rightarrow w$  [Horn 1951]

- $\Rightarrow$  polynomial like 2SAT (every time that you assign a variable you should not get a contradiction)

Dual-Horn SAT: each clause has  $\leq 1$  negative literal

- $\hookrightarrow$  "weakly positive satisfiability" [Schaefer 1978]

- negate all variables  $\rightarrow$  Horn SAT

- $\Rightarrow$  polynomial

Also note that

$$p \rightarrow q \equiv \neg q \rightarrow \neg p$$

DNF SAT: formula = OR of clauses

$\downarrow$  clause = AND of literals

Disjunctive Normal Form  $\Rightarrow$  satisfiable  $\Leftrightarrow \geq 1$  clause (of not form  $x_i \wedge \bar{x}_i \wedge \dots$ )

⋮

P	Q	$p \rightarrow q$
T	T	T
T	F	F
F	T	T
F	F	T

## Alternative clauses for 3SAT:

(3)

1-in-3SAT = exactly-1 3SAT [Schaefer 1978]

- clause = exactly 1 of 3 literals is true  
 $\Rightarrow$  2 false  $\sim$  TFF, FTF, FFT

$\nearrow$  omitted by Schaefer

"Monotone" 1-in-3SAT: no negations - all literals positive

BUT...

"Monotone" not-exactly-1 3SAT: [Schaefer 1978]

- clause = 0, 2, or 3 variables are true  
(for each shift i,j,k) i.e.  $x_i \Rightarrow (x_j \text{ OR } x_k)$   $\rightarrow$  Dual Horn  
- also require  $x_1 = \text{TRUE}$  (else set all  $x_i = \text{FALSE}$ )  
- polynomial

NAE 3SAT = not-all-equal 3SAT [Schaefer 1978]

- clause = 3 literals not all the same value  
(forbid FFF & TTT  $\Rightarrow$  1 or 2 true, 2 or 1 false  
 $\sim$  whereas 3SAT forbids just FFF)  
- nice symmetry between TRUE & FALSE

$\nearrow$  omitted by Schaefer

"Monotone" NAE 3SAT: no negations - all literals positive

"Monotone" NAE-3SAT is NP-complete as well.

The most important ones to remember: 3-SAT, 1-in-3SAT & NAE-3SAT

(4)

## Schaefer's Dichotomy Theorem: [Schaefer - STOC 1978] (Universal Theorem)

- formula = AND of clauses
  - general clause  $\stackrel{\text{(type)}}{=}$  relation on variables (with implicit truth table)
    - assume in CNF
    - $\Rightarrow$  AND of subclauses
- $\Rightarrow$  SAT is polynomial if either:
- or - setting all variables true or all variables false satisfies all relations,
  - or - subclauses are all Horn or all Dual Horn,
  - or - relations are all 2-CNF (subclause sizes  $\leq 2$ , i.e.,
  - or - every relation can be expressed as a system of linear equations over  $\mathbb{Z}_2$ :

$$x_i \oplus x_j \oplus x_k \oplus x_l = 0 \text{ or } 1$$

 $\hookrightarrow$  XOR $\hookrightarrow$  Gaussian elimination2-SAT  
(case),

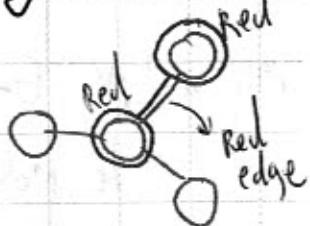
&amp; otherwise, SAT is NP-complete!

## 2-colorable perfect matching: [Schaefer 1978]

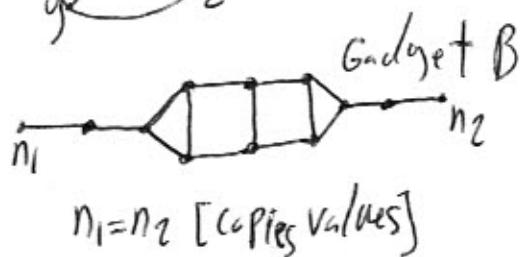
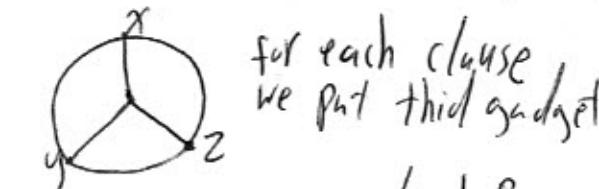
- given a planar 3-regular graph
- 2-color the vertices such that every vertex has exactly 1 same-colored neighbor
- special case of 2-in-4SAT

(planarity &amp; 3-regular left as exercise)

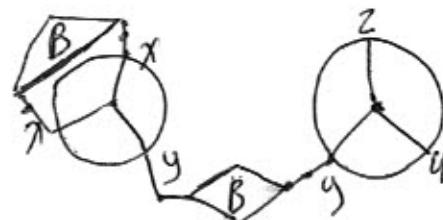
We just say the general graph case



Thm [Schaefer'78] There is a reduction from monotone NAE 3-SAT to 2-colorable perfect matching: (5)



$$A = R(x, x, y) \wedge R(y, z, u)$$



some fun games can be proved to be NP-complete via reduction from 3-SAT, e.g. Push-1 [Hoffman 2000]

You may see Erik's class for high-level ideas

You can prove hardness of other games as well such as:

- Super Mario Bros.
- Legend of Zelda
- Metroid
- Donkey Kong Country
- Pokemon
- etc



move blocks to targets  
An early Push-1 game: Sokoban

→ Note that if the bipartite graph between clauses and variables is planar, the problem is called planar CNF (type 1)

→ If the bipartite graph plus all edges  $(x_i, \bar{x}_i)$  form a planar graph, the problem is called planar CNF (type 2)

Both Versions

between clauses and literals.

are NP-complete by a reduction from 3-SAT (by uncrossing the edge-crosses)

→ Very useful to prove NP-hardness of problems on planar graphs and geometric plane graphs



(6)

## Cryptarithms / alphametics [Madachis 1979]

- given formula  $x+y=z$  with each number written in base 6 & encoded with "letters" by unknown bijection between  $\{0, 1, \dots, b-1\}$  & letters
- goal: feasible? / recover bijection
- strongly NP-complete [Eppstein 1987]

rightmost  
three  
columns

### Reduction from 3SAT:

OP0  
OP0  
190

- variable gadget:

$$- b_i = 2a_i$$

$$\text{here letters } 0 \text{ and } 1 - v_i = 2b_i + C$$

$$\text{are forced to be } 0 \text{ and } 1 = 4a_i + C \equiv C \pmod{4}$$

$$\text{for any mod } - d_i = 2c_i + C$$

$$- e_i = d_i + 1 + C$$

$$= 2c_i + 1 + 2C$$

$$- \bar{v}_i = d_i + e_i$$

$$\begin{aligned} v_i &\left\{ \begin{array}{l} d_i: 0, 1, 2, 3 \\ e_i: 0, 1, 2, 3 \end{array} \right. \\ &= 4c_i + 1 + 3C \end{aligned}$$

$$\frac{& v_i}{v_i} \left[ \begin{array}{l} \bar{v}_i: 0, 1, 2, 3 \\ 0, 1, 2, 3 \end{array} \right] \equiv 3C + 1 \equiv 1 - C \pmod{4}$$

- clause gadget:

$$- g_i = 2f_i$$

$$- h_i = 2g_i + \{0, 1\}$$

$$= 4f_i + \{0, 1\}$$

$$- t_i = h_i + 1 + \{0, 1\}$$

$$= 4f_i + 1 + \{0, 1, 2\}$$

$$= 4f_i + \{1, 2, 3\}$$

$$- v_a + v_b + v_c = t_i \equiv \{1, 2, 3\} \pmod{4}$$

Example: 9567

$$(\text{mod } 10) \quad \begin{array}{r} 9567 \\ + 1085 \\ \hline 10652 \end{array}$$

can be represented as:  $\begin{array}{r} abcd \\ + efgb \\ \hline efcbh \end{array}$

OR

$$\begin{array}{r} SEND \\ + MORE \\ \hline MONEY \end{array}$$

We need to have base  $f(n)$  to be interesting

$$C = \text{carry } (y_i + y_i) \in \{0, 1\}$$

### Cryptarithm Rules:

- each letter represents a unique digit
- often numbers must not start with zero
- often the solution is unique

for  $(V_a, V_b, V_c)$  fuse  $U_{ab}$  for clause  $V_a V_b V_c$  for all clauses with  $V_a$  and  $V_b$

$$\begin{array}{r} U_{ab} \ 0 \ V_a \ 0 \ | \ r_i \ 0 \ g_i \ w_i \ 0 \ f_i \ 0 \\ V_c \ 0 \ V_b \ 0 \ h_i \ r_i \ 0 \ g_i \ w_i \ 0 \ f_i \ 0 \\ \hline t_i \ 0 \ U_{ab} \ 0 \ t_i \ s_i \ 0 \ h_i \ x_i \ 0 \ g_i \ 0 \end{array}$$

The reduction is good for NP-completeness for any mod multiple of 4, but still we need a solution for the puzzle from a satisfying solution, e.g. 7

## Simplified reduction from 1-in-3 SAT: uniqueness issues

- variable gadget: just  $v_i$ , no  $\bar{v}_i$  (monotone)
- clause gadget:

$$g_i = 2f_i$$

$$h_i = 2g_i$$

$$= 4f_i$$

$$t_i = h_i + 1$$

$$= 4f_i + 1$$

$$\begin{aligned} v_a + v_b + v_c &= t_i \\ &= 4f_i + 1 \equiv 1 \pmod{4} \end{aligned}$$

(\*) They proved for any  $k$  there is a set of  $k$  numbers all between  $1 \dots k^3$  such that their sum in triples are distinct (we can use powers of 2 but base would be in  $O(4^n)$ )

3SAT solvable  $\Rightarrow$  cryptarithm solvable: and not good for

one class { - distinguish  $a_i, b_i, c_i, d_i, \dots$  by value mod 128 } strong NP-hardness

for each variable - e.g.  $v_i \equiv 8 \pmod{128}$  if true

possible choices for each  $v_i$   $\equiv 9 \pmod{128}$  if false

$a_i \in \{2, 34, 66, 98\} \pmod{128}$

$b_i \in \{4, 68\}$  for  $v_i$  and  $\bar{v}_i$

- set  $[v_i / 128] \& [\bar{v}_i / 128] \in [0, (2n)^3]$

such that we have distinct sums of triples for all clauses  
[Bose & Chowla 1959] (see above)

- easy proof of polynomial range: (based on fusion trees)

- if  $< i$  set by induction,  $v_i$  must avoid

$$v_j + v_k - v_\ell - v_m - v_p \sim <(2n)^5 \text{ choices}$$

$\Rightarrow (2n)^5$  suffices

$\Rightarrow$  strongly NP-hard

The final result would be in base  $(2n)^3 \cdot 3 \cdot 128 = 3072n^3$  [see Eppstein '87]  
(Revised in 2000)  
for all details.