

Notes Starting Nov 7

- Branch and band



Nov 7, 2018

- Branch & Bound (e.g. drive UBC to SFU; bin packing)
- Presentations:
 - Day 1: Nov 14
 - Day 2: Nov 16
 - 3: 19
 - 4: 21
 - 5: 23
 - 6: 26
 - 7: 28
 - 8: 30

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Rest of November:

- Presentations
- Gurobi (a bit)
- Branch and bound } ←
- " " cut }
- Other LP/IP's in projects and applications

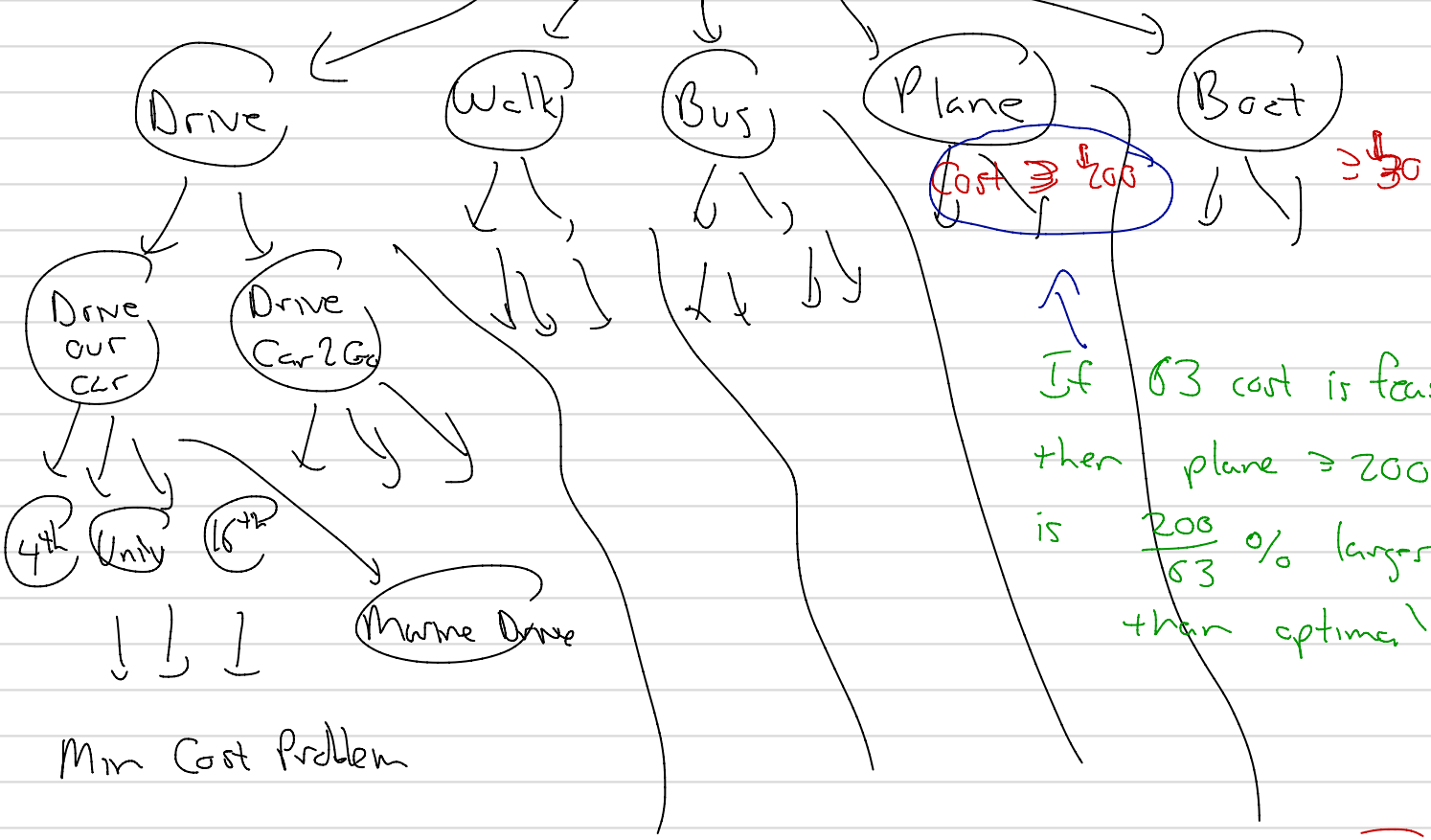
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Branch & bound:

We want to go from UBC to ...

SFU Consider
or U Toronto
or ...

Our decisions?



If \$3 cost is feasible,
then plane ≥ 200
is $\frac{200}{53} \%$ larger
than optimal!

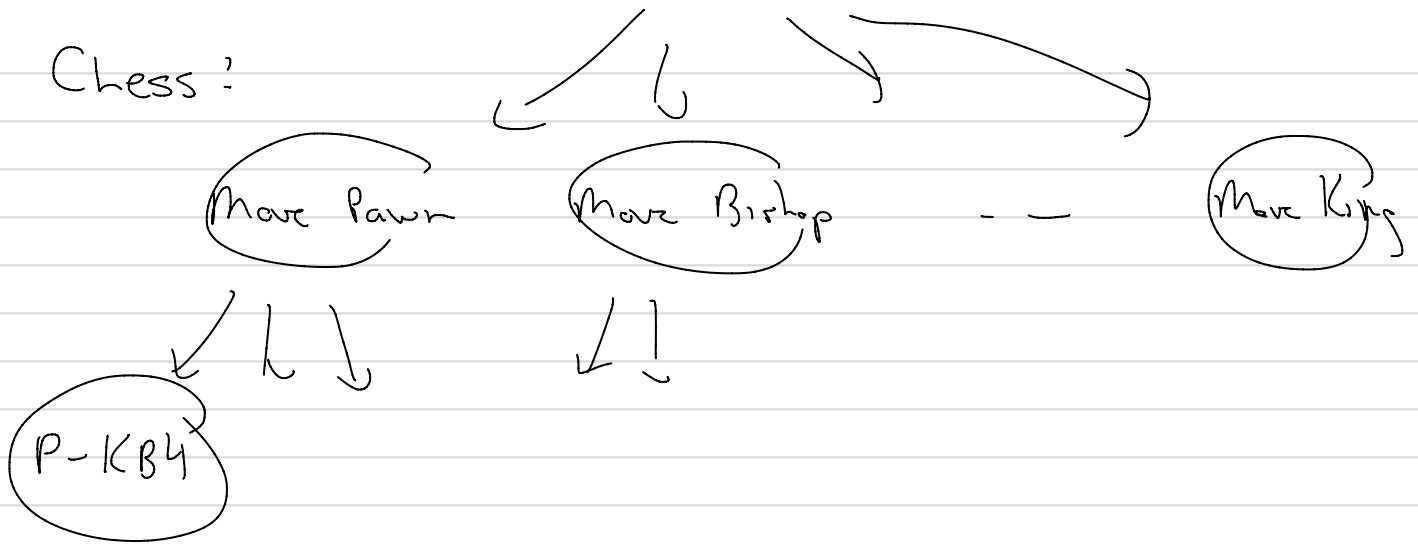
Min Cost Problem

Objective: $\min_{\text{time}} (\text{time}) + \alpha (\text{cost})$

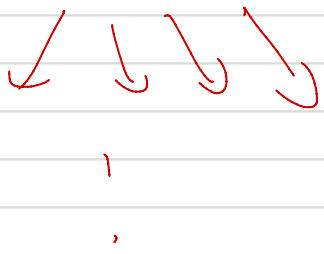
fix $\alpha = 1 \frac{\$}{\text{min}}$
 $\$3 + 60$

- ① Find some feasible solution \leftrightarrow You know the cost
 - ② At as many nodes as possible, have some lower bound
- 63

Chess:



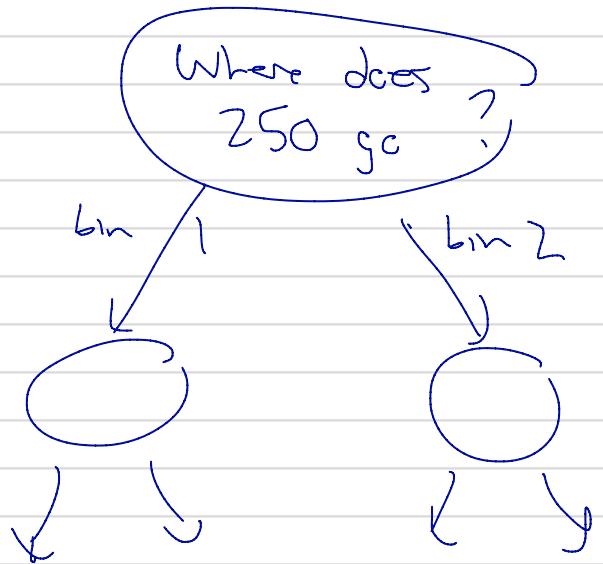
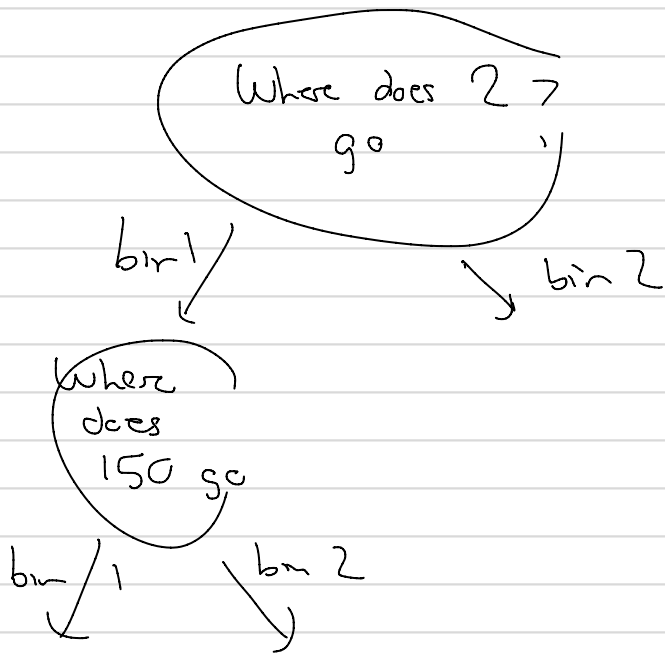
Opponent Moves



Bin packing:

2 bins,

Items size 250, ^{2nd} 50, 100, 100, 100, 100, 4, 3, ^{1st} 2



① Want to choose a reasonable decision tree ...

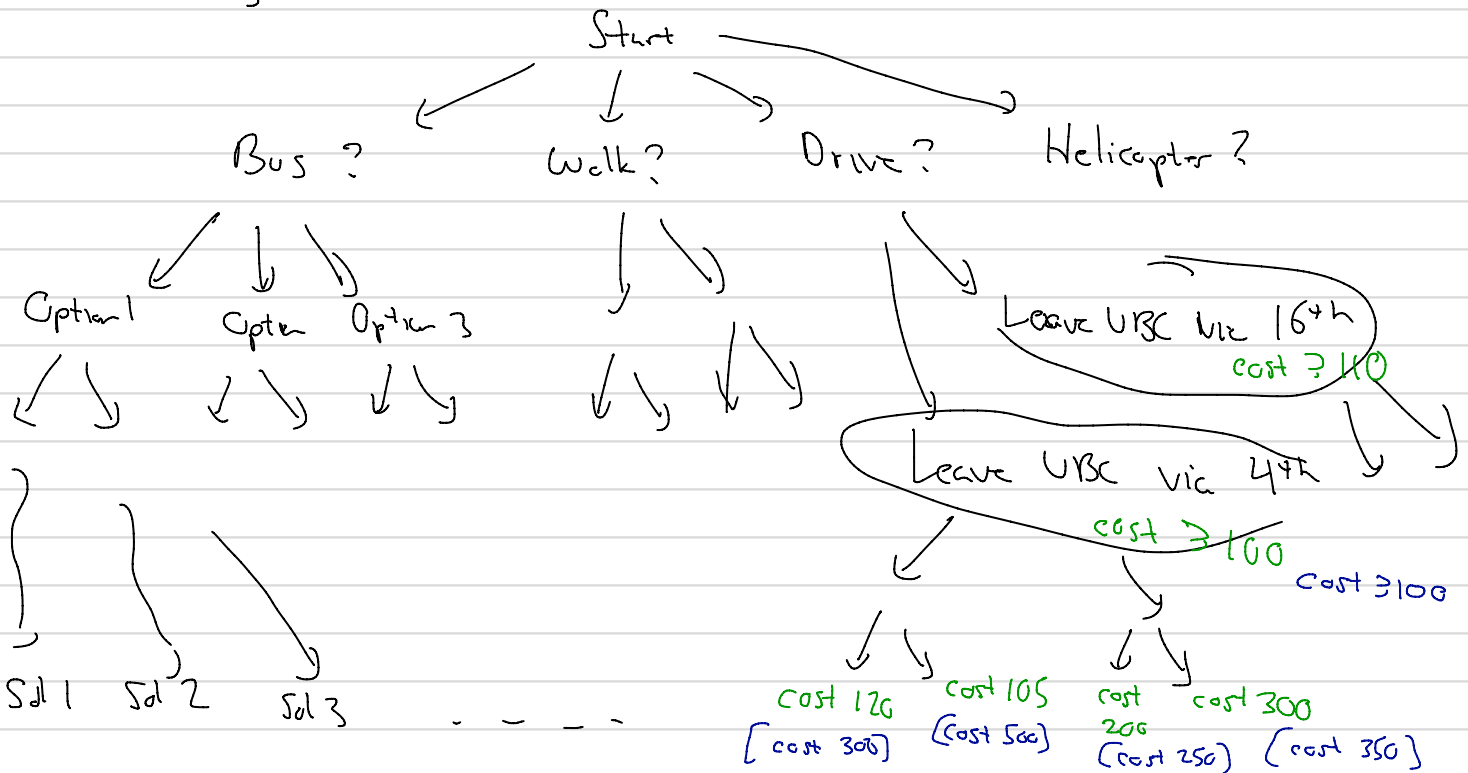
Now Q:

- Branch and bound — very general idea.
- Integer Programming: special case of branch & bound
"branch and cut"

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Branch & bound: how do I get from UBC to SFU

minimizing cost:



Say there are too many solutions to check all of them out

Branch & Bound: (1) You decide how good a solution you want; maybe with 10% of optimal, 2%, etc.

(2) You should have some feasible solution

(3) You have some way of bounding enough nodes of the tree

Example:

Say you have IP:

Bin packing into 2 bins of equal size.

Problem: Given n items and their sizes

e.g. $n=10$, size 150, 150, 100, 100, 100, 3, 2, 1, 1, 1

I want $x_i = \begin{cases} 1 & \text{if item } i \text{ goes into bin \#1} \\ 0 & \text{" " " " " " bin \#2} \end{cases}$

Sizes s_1, \dots, s_n given, want

First bin holds: $s_1 x_1 + s_2 x_2 + \dots + s_n x_n \leq w$

2nd " " $s_1(1-x_1) + s_2(1-x_2) + \dots + s_n(1-x_n) \leq w$

Minimize w .

Decision vars: x_1, \dots, x_n, w Given n, s_1, \dots, s_n .

Another strategy: sort s_1, \dots, s_n

S: 150, 150, 100, 100, 100

Bin 1: 150, 100, 100 ← size 350

Bin 2: 150, 100 ← size 250

Better:

Bin 1: 150, 150 ← size 300

Bin 2: 100, 100, 100 ←



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For IP $\xrightarrow{\text{relax}}$ LP

$$\vec{x} \in \mathbb{Z}$$

$$\vec{x} \in \mathbb{R}$$

or

$$x_i = 0, 1$$

$$0 \leq x_i \leq 1$$

Solving the LP version (relaxation)
is much faster to do

This gives a bound on the IP

Example: min w s.t.

$$150 x_1 + 150 x_2 + 100 x_3 + 100 x_4 + 98 x_5 \leq w$$

$$150 (1-x_1) + 150 (1-x_2) + 100(1-x_3) + 100(1-x_4) + 100(1-x_5) \leq w$$

s.t.

x_i are 0, 1 $\leftarrow 0 \leq x_i \leq 1$ and x_i integers


relax \longrightarrow $0 \leq x_i \leq 1$ but x_i 's can be real
could set $x_i = \frac{1}{2}$

Nov 14: Branch & Bound: In LP/IP this is called Branch & Cut

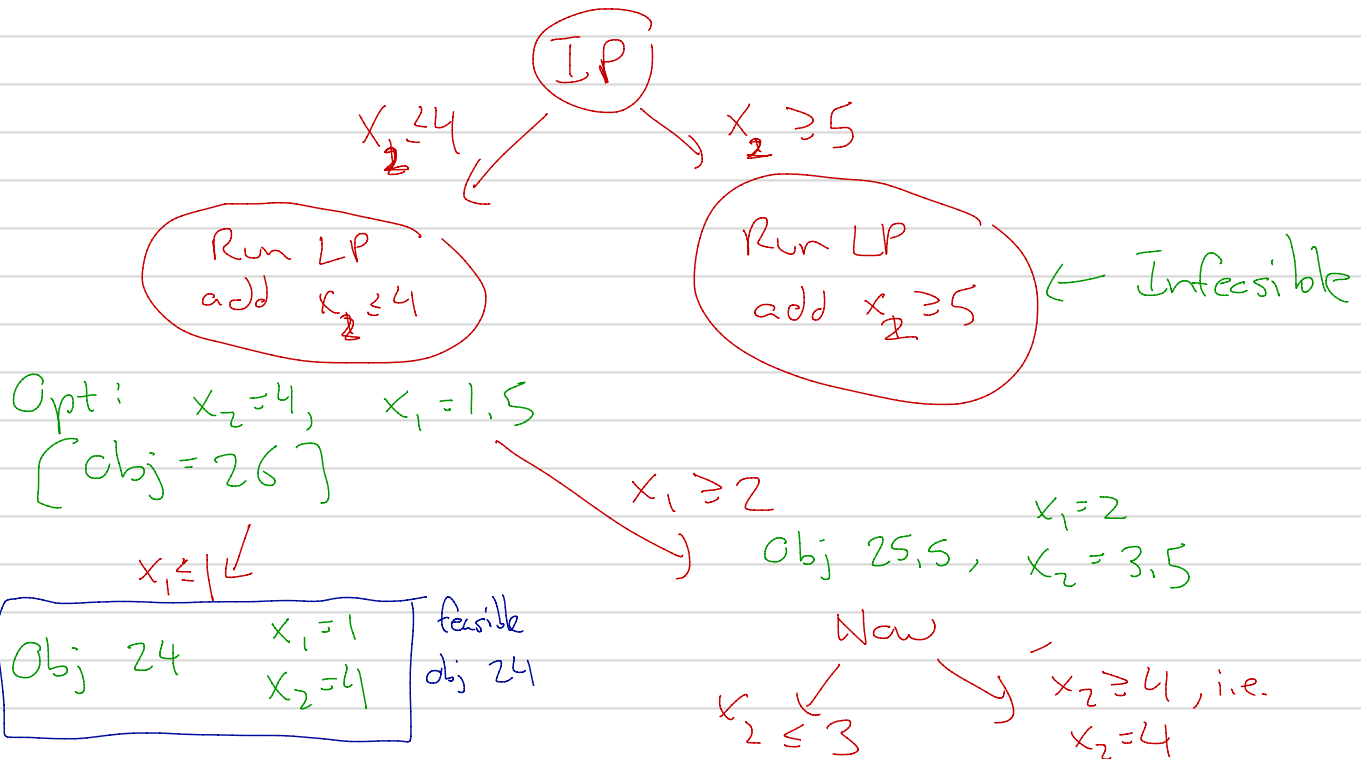
$$\begin{aligned} \max \quad & 4x_1 + 5x_2 \\ \text{s.t.} \quad & x_1 + 2x_2 \leq 9.6 \\ & x_1 + x_2 \leq 5.5 \\ & 2x_1 + x_2 \leq 8 \\ & x_1, x_2 \geq 0 \end{aligned}$$

How does
branch and
cut work?

$$x_1, x_2 \in \mathbb{Z} \leftarrow \text{IP}$$

Relax $x_1, x_2 \in \mathbb{R}$, $x^* = (1.4, 4.1)$ 

What to do? Maybe $x_2 = 4$?



Nov 19!

What do branch and cut nodes mean?

(1) In general, hard to tell ... There can be good news.

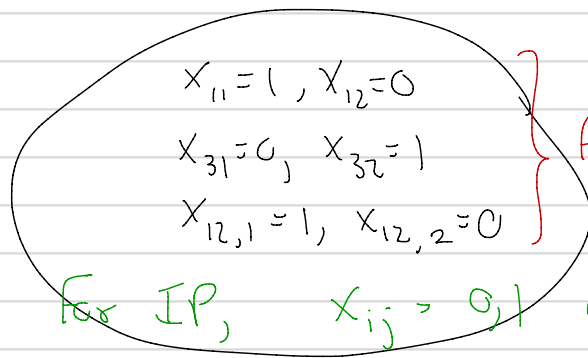
(2) There are 2 specific cases that are easy to understand

- bin packing
- graph colouring

Bin Packing Graph Colouring

Int Prog: Decision vars $x_{ij} \in \{0,1\}$

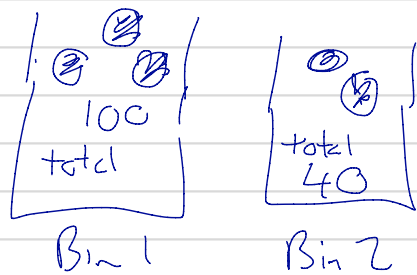
Node in
Branch and
Cut



$$x_{11} + x_{12} = 1$$

For IP, $x_{ij} = \{0,1\}$ what's happening?
 LP relaxation: $0 \leq x_{ij} \leq 1$
 continuous, (real, \mathbb{R})

Bin Packing:



$\{12, 6, 1, 1\}$

sums to 20

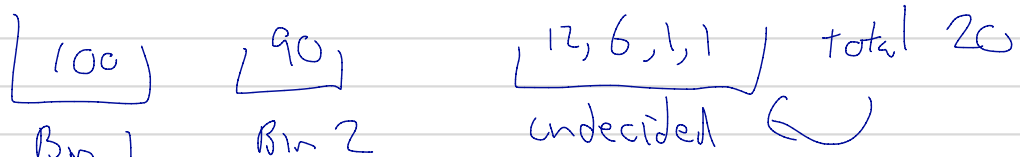
Undecided

Fixed

Solution

100 40 + 20

Say



Relation:

105

105

5 into bin 1

Graph colouring

Note: 3 colours

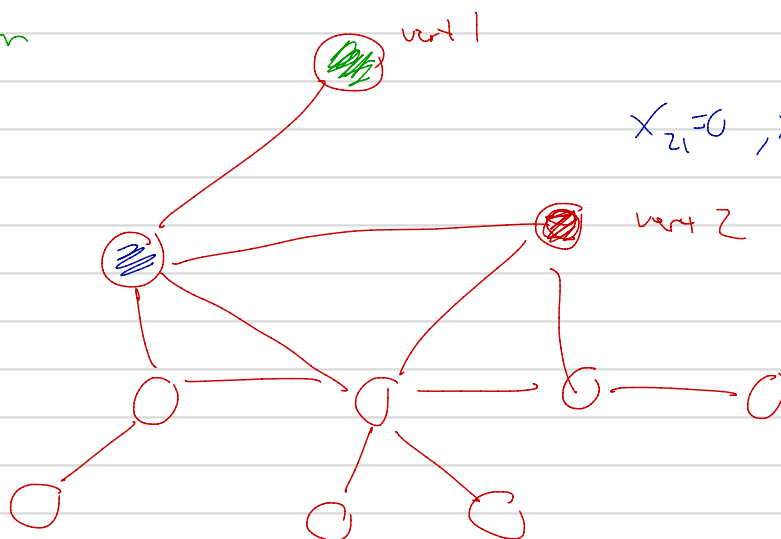
$$X_{i1} + X_{i2} + X_{i3} = 1$$

for all i

$$X_{11} = 1, X_{12} = 0, X_{13} = 0$$

1st colour
green

We
know:



$$X_{21} = 0, X_{22} = 1, X_{23} = 0$$