

# Chapter 7: Optimization (Routing and Wavelength Assignment)

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ECLIPSe ELearning [Overview](#)



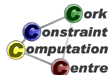
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# Outline

- 1 Problem
- 2 Program
- 3 Search



# What We Want to Introduce

- Optimization
- Graph algorithm library
- Problem decomposition
- Routing and Wavelength Assignment in Optical Networks



# Outline

- 1 Problem
  - Problem 1: Find routing
  - Problem 2: Assign Wavelengths
- 2 Program
- 3 Search



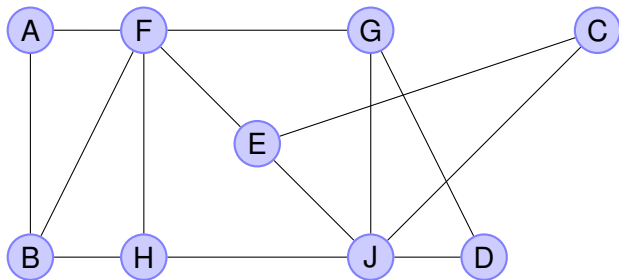
# Problem Definition

## Routing and Wavelength Assignment

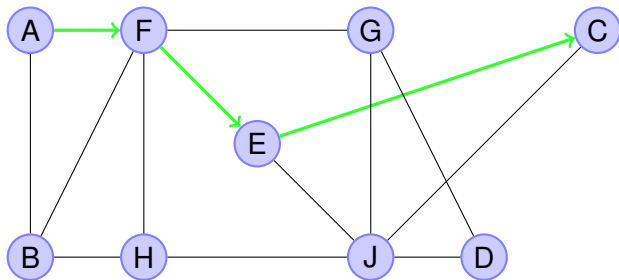
In an optical network, traffic demands between nodes are assigned to a route through the network and a specific wavelength. The route (called *lightpath*) must be a simple path from source to destination. Demands which are routed over the same link must be allocated to different wavelengths, but wavelengths may be reused for demands which do not meet. The objective is to find a combined routing and wavelength assignment which minimizes the number of wavelengths used for a given set of demands.



# Example Network

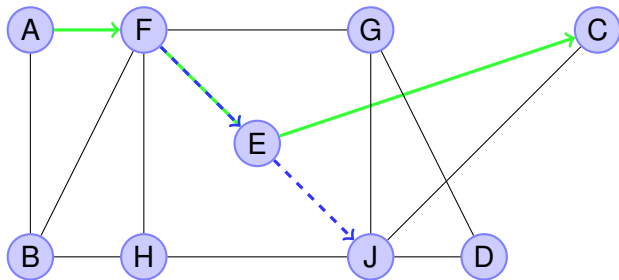


# Lightpath from A to C

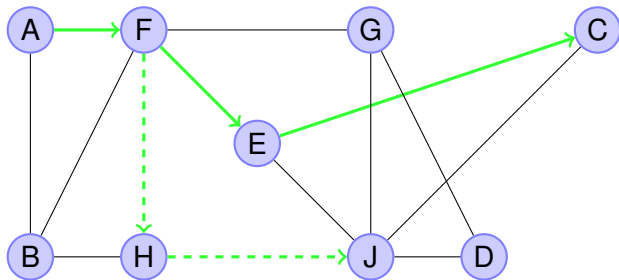




# Conflict between demands $A$ to $C$ and $F$ to $J$ : Use different frequencies



# Conflict between demands A to C and F to J: Use different paths



# Solution Approaches

- Greedy heuristic
- Optimization algorithm for complete problem
- Decomposition into two problems
  - Find routing
  - Assign wavelengths



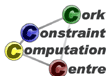
# Solution Approaches

- Greedy heuristic
- Optimization algorithm for complete problem
- **Decomposition into two problems**
  - Find routing
  - Assign wavelengths



# Finding Routing

- Find routing which does not assign too many demands on the same link
- Lower bound for overall problem
- Do not use arbitrarily complex paths
- Start with shortest paths



# Proposed Solution

- For each demand, use a shortest path between source and destination
- Shortest path = smallest number of links used
- Good for overall network utilisation
- May create bottlenecks on some links



# How to Find Shortest Paths

- Well studied, well understood problem
- Many different algorithms for particular cases
  - Positive/negative weight
  - Path between pair of nodes/between node and all other nodes/between all nodes
  - One/all shortest paths or paths which are nearly shortest paths
- Don't program this yourself!
- Library in ECLiPSe: `lib(graph_algorithms)`



# Library `graph_algorithms`

- Provides different algorithms about graphs
- Based on opaque `Graph` structure created from nodes and edges
- `make_graph(NrNodes, Edges, Graph)`
- Edges are terms `e(FromNode, ToNode, Weight)`
- Directed graphs as default, undirected graphs represented by edges in both directions





# Basic Shortest Path Method

- `single_pair_shortest_path(Network, -1, From, To, Result)`
- Find path from node `From` to node `To` in graph `Network`
- Second argument describes weight function
  - -1: use number of hops
- `Result` given length of path and edges as list



## Problem 2: Assign Wavelength

- Demands are routed on shortest paths
- Demands routed over the same link must have different frequencies
- Minimize maximal number of frequencies used



# Model

- Domain variable for every demand
- Initial domain large, e.g. number of demands
- Disequality constraint between demands routed over same link
- Alternative: `alldifferent` constraints for all demands over each link
- Feasible solution: find assignment for variables



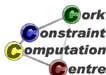
# Optimization

- We are not looking for only a feasible solution
- We want to optimize objective
- Minimize largest value used



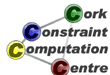
# Library `branch_and_bound`

- `bb_min(Goal, Cost, bb_options{ })`
- Goal **search goal**
  - Like `search/6` or `labeling/1` call
- Cost **objective (domain variable)**
- `bb_options` **optional parameters**
  - `timeout:Time` timeout limit in seconds
  - `from:LowerBound` known lower bound
  - `to:UpperBound` known upper bound



# Example

```
...  
List :: 1..20,  
...  
ic:max(List,Max),  
bb_min(labeling(List),Max,  
        bb_options{timeout:100,from:10}),  
...
```



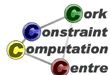
# ic Constraint `max(List, Var)`

- `Var` is the largest value occurring in `List`
- Similar `min(List, Var)`
- Do not confuse with `max` in core language



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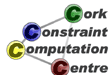
# Main Program

```
:-module (pure) .  
:-export (top/5) .  
:-lib (ic) .  
:-lib (ic_global) .  
:-lib (graph_algorithms) .  
:-lib (branch_and_bound) .  
  
top (Name, NrDemands, LowerBound, Assignment, Max) :-  
    problem (Name, NrDemands, Network, Demands) ,  
    route (Network, Demands, Routes) ,  
    wave (NrDemands, Routes,  
        LowerBound, Assignment, Max) .
```



# Routing

```
route(Network, Demands, Routes) :-  
    (foreach(demand(I, From, To), Demands),  
     foreach(route(I, Path), Routes),  
     param(Network) do  
         single_pair_shortest_path(Network, -1,  
                                     From, To,  
                                     _Path)  
    ).
```



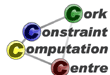
# Wavelength Assignment

```
wave (NrDemands, Routes, LowerBound, Var, Max) :-  
    dim (Var, [NrDemands]),  
    Var [1..NrDemands] :: 1..NrDemands,  
    ic:max (Var, Max),  
    setup_alldifferent (Routes, Var, LowerBound),  
    bb_min (assign (Var), Max,  
            bb_options {from:LowerBound,  
                        timeout:100}).
```



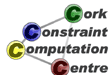
# Assignment Routine

```
assign(Var) :-  
    search(Var, 0, most_constrained, indomain,  
          complete, []).
```



# Variable Selection Method `most_constrained`

- Similar to `first_fail`
- Select variable with smallest domain first
- For tie break, select variable in largest number of constraints



# Creating alldifferent Constraints

```
setup_alldifferent (Routes, Var, LowerBound) :-  
    (foreach (route (I, Path), Routes),  
     fromto ([], A, A1, Pairs) do  
         (foreach (Edge, Path),  
          fromto (A, AA, [l (Edge, I) | AA], A1),  
          param (I) do  
              true  
          )  
        ),  
    group (Pairs, 1, Groups),  
    ...
```

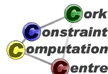


# Creating alldifferent Constraints (II)

```
...  
(foreach(_-Group, Groups),  
  fromto(0, A, A1, LowerBound),  
  param(Var) do  
    length(Group, N),  
    A1 is eclipse_language:max(N, A),  
    (foreach(l(_, I), Group),  
      foreach(X, AlldifferentVars),  
      param(Var) do  
        subscript(Var, [I], X)  
      ),  
    ic_global:alldifferent(AlldifferentVars)  
).
```

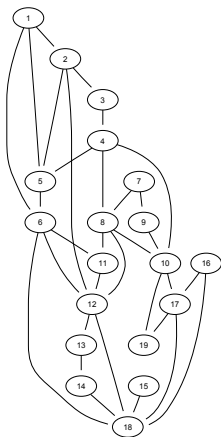
# Generating Data

```
problem(Name, NrDemands, Network, Demands) :-  
    network_topology(Name, NrNodes, Edges),  
    make_graph(NrNodes, Edges, Directed),  
    make_undirected_graph(Directed, Network),  
    (for(I, 1, NrDemands),  
     fromto([], A, [demand(I, From, To) | A], Demands),  
     param(NrNodes) do  
         repeat,  
         From is 1+(random mod NrNodes),  
         To is 1+(random mod NrNodes),  
         From \= To,  
         !  
    ).
```





# Example Network: MCI



# MCI Topology Data

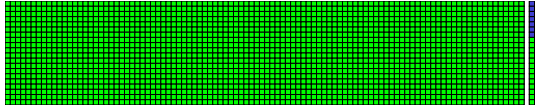
```
network_topology(mci, 19,  
  [e(1, 2, 1), e(1, 5, 1), e(1, 6, 1), e(2, 3, 1),  
    e(2, 5, 1), e(2, 12, 1), e(3, 4, 1), e(4, 5, 1),  
    e(4, 8, 1), e(4, 10, 1), e(5, 6, 1), e(6, 11, 1),  
    e(6, 12, 1), e(6, 18, 1), e(7, 8, 1), e(7, 9, 1),  
    e(8, 10, 1), e(8, 11, 1), e(8, 12, 1), e(9, 10, 1),  
    e(10, 17, 1), e(10, 19, 1), e(11, 12, 1), e(12, 13, 1),  
    e(12, 18, 1), e(13, 14, 1), e(14, 18, 1), e(15, 18, 1),  
    e(16, 17, 1), e(16, 18, 1), e(17, 18, 1), e(17, 19, 1)]).
```

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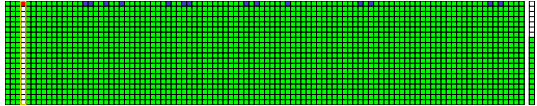
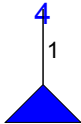
# Searchtree



▶ Cost Update    ▶ First Solution    ▶▶ Skip Animation



# Searchtree



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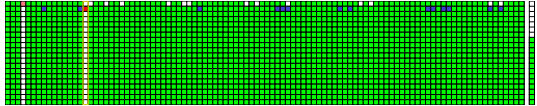
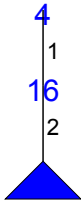
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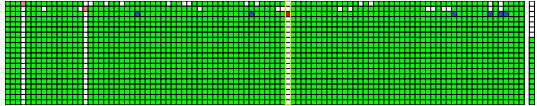
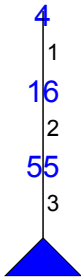
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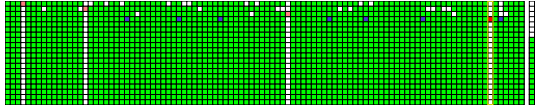
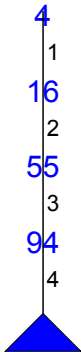
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▶ Cost Update

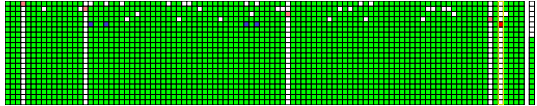
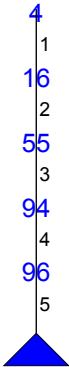
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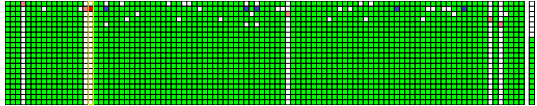
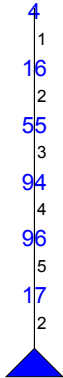
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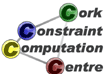
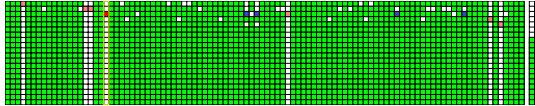
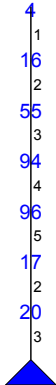
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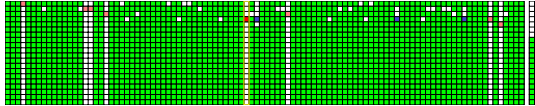
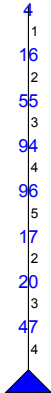
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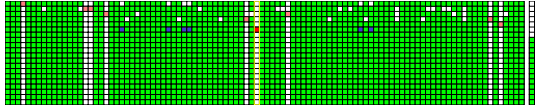
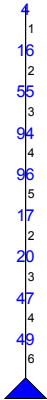
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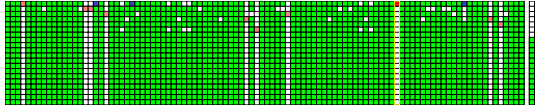
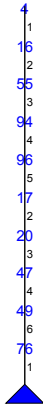
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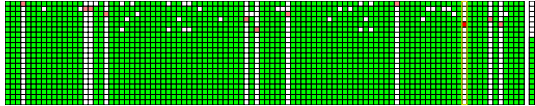
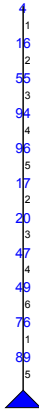
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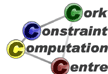
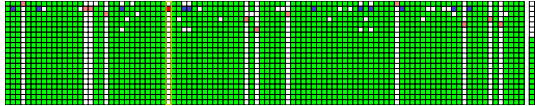
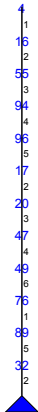
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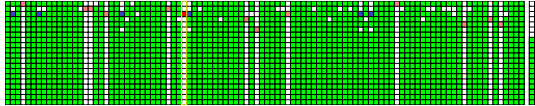
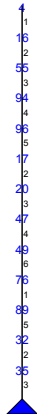
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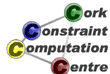
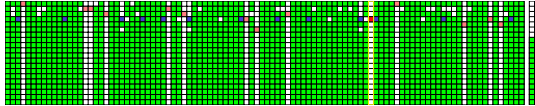
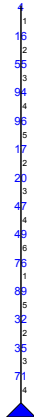
▶ Cost Update

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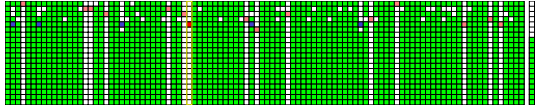
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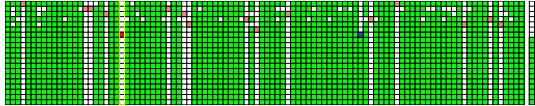
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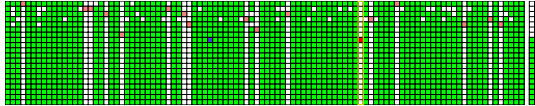
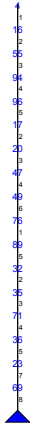
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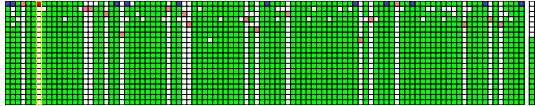
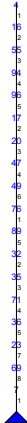
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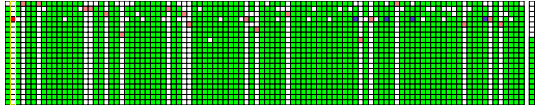
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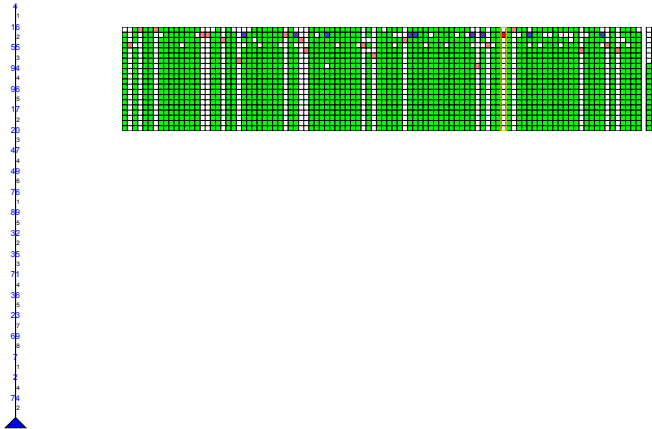
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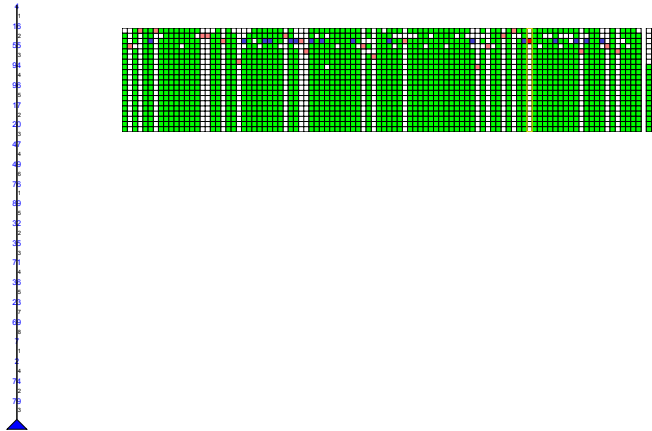
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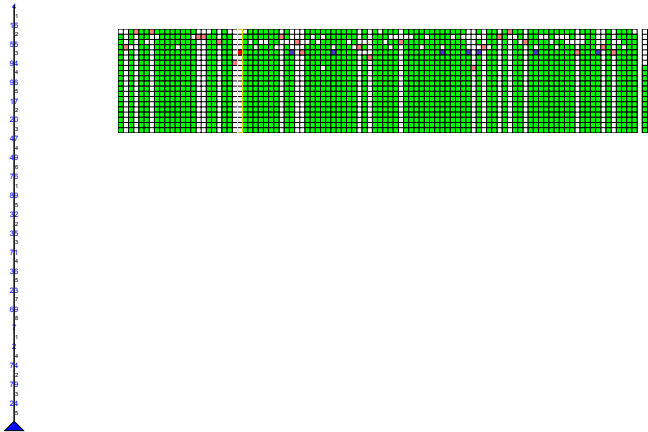
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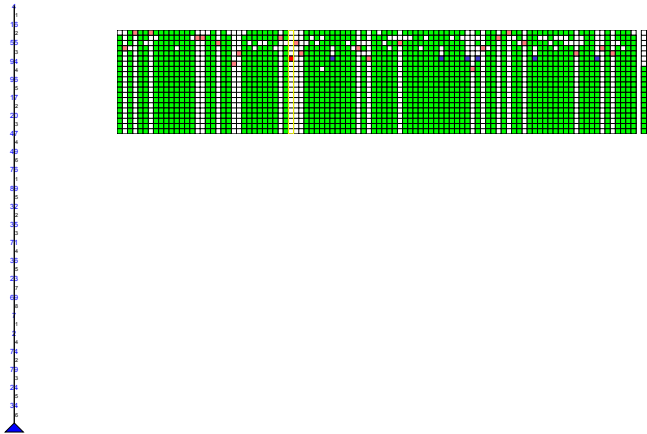
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# Searchtree



◀ Back to Start

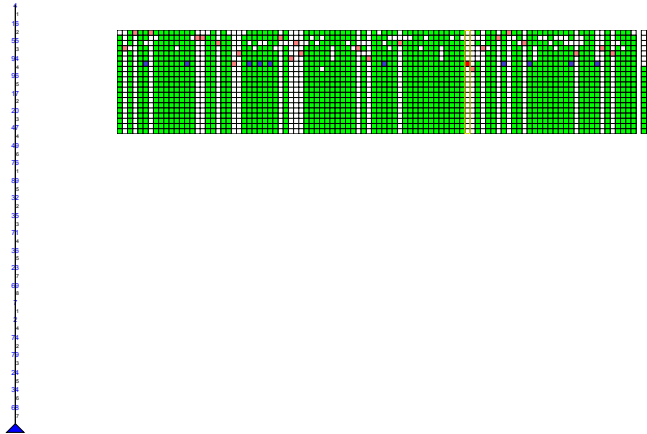
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



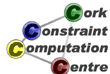
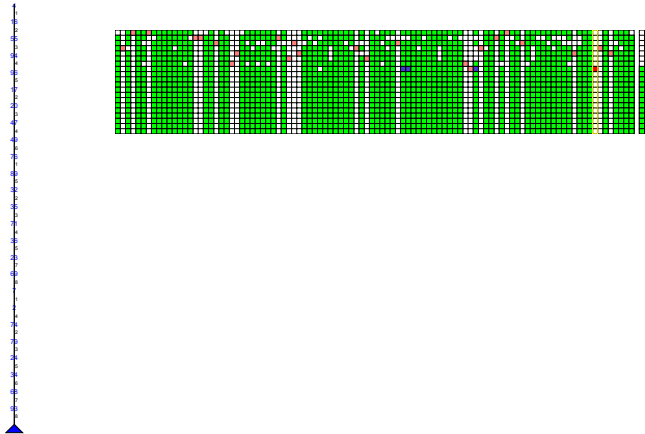
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

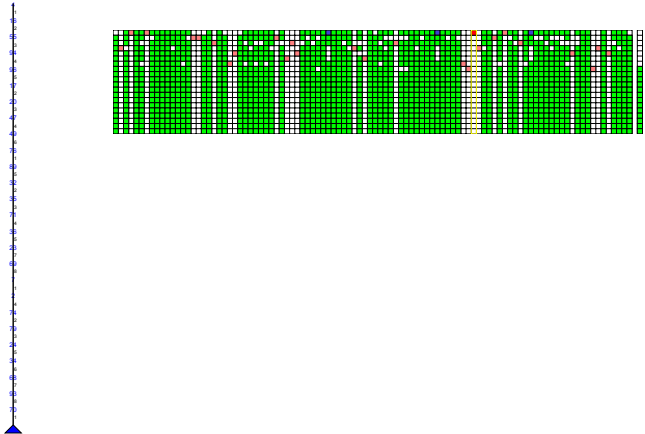
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



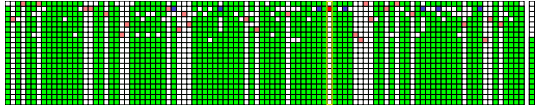
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

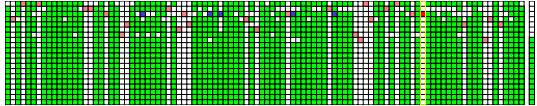
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

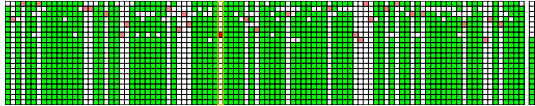
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

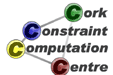
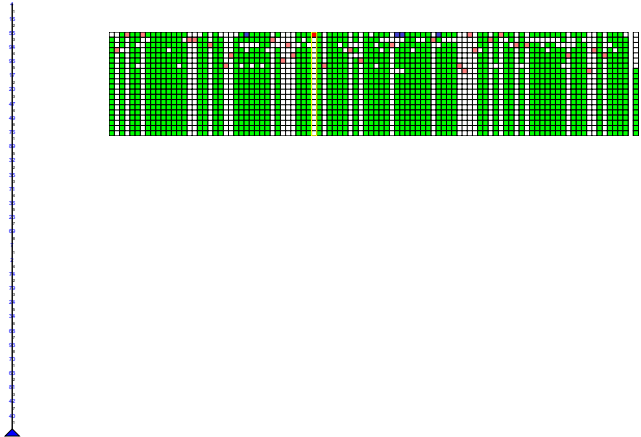
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

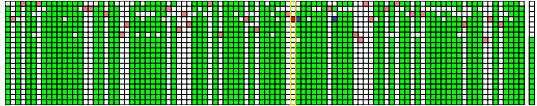
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

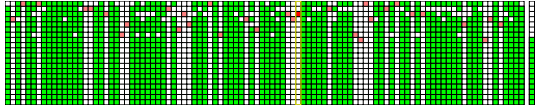
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

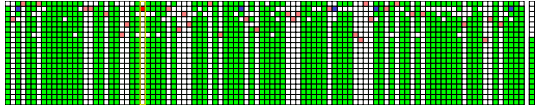
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

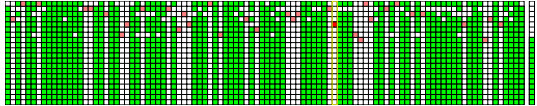
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

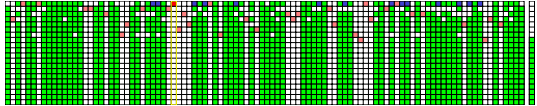
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

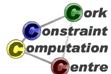
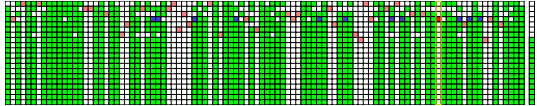
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

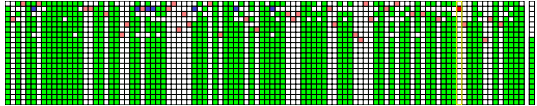
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

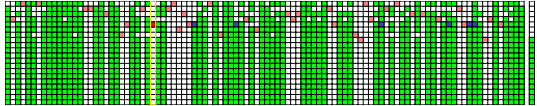
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

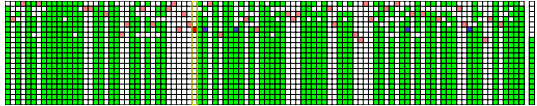
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

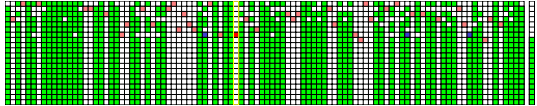
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

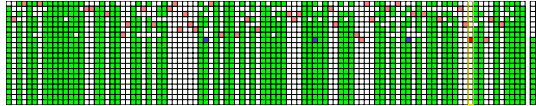
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

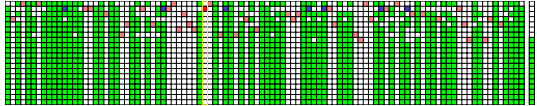
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

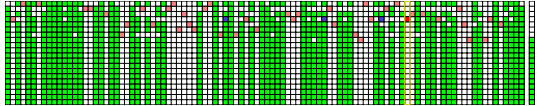
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

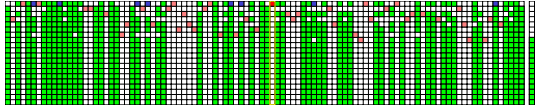
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree

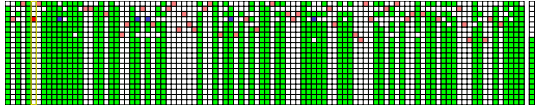


◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation





# Searchtree



◀ Back to Start

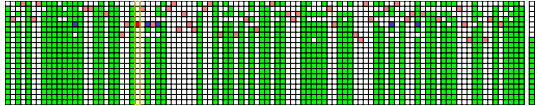
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

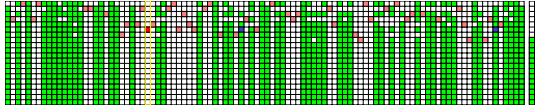
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

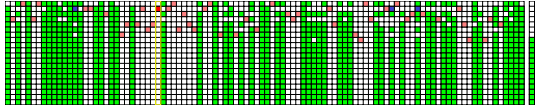
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

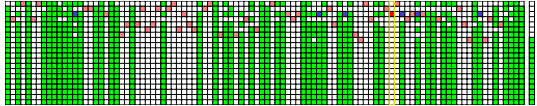
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

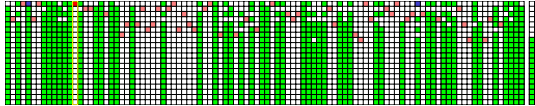
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

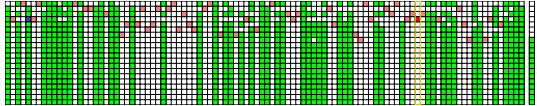
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

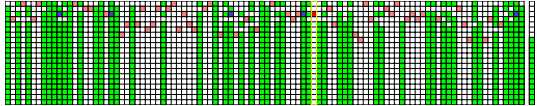
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

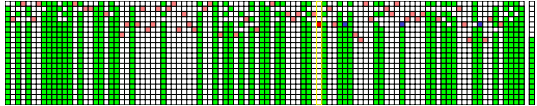
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

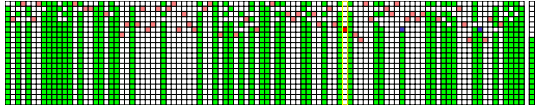
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

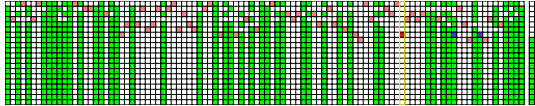
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

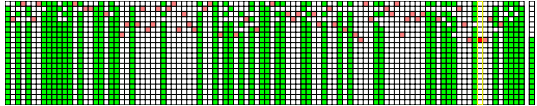
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

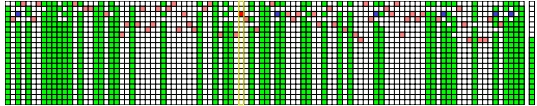
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

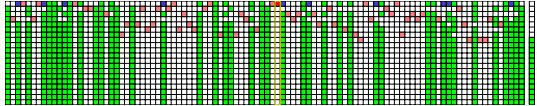
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

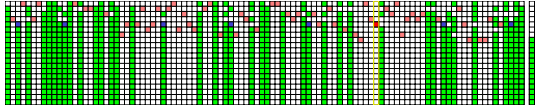
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

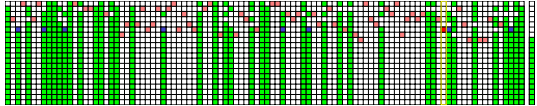
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

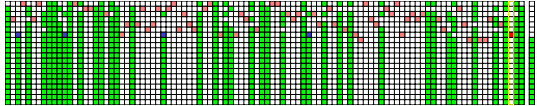
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

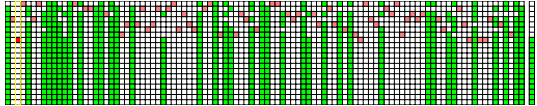
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

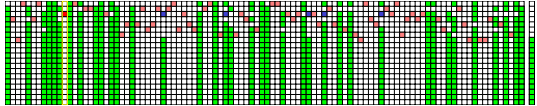
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

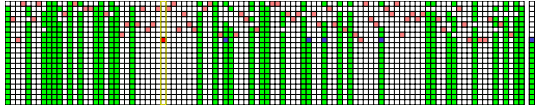
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

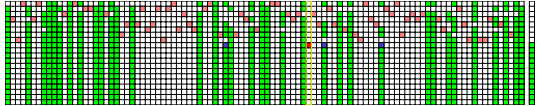
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

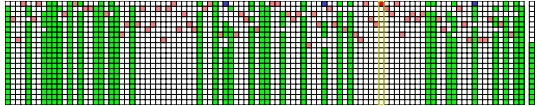
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



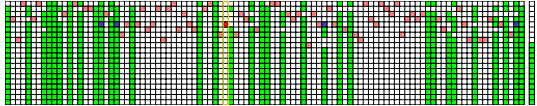
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

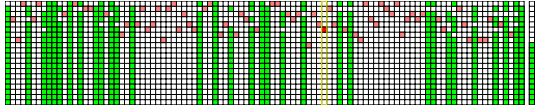
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

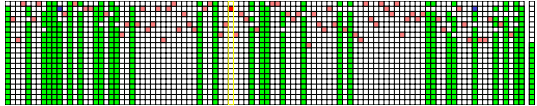
▶ First Solution

▶▶ Skip Animation





# Searchtree

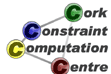


◀ Back to Start

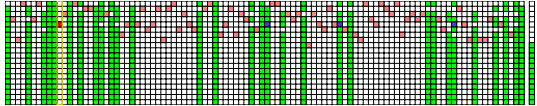
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



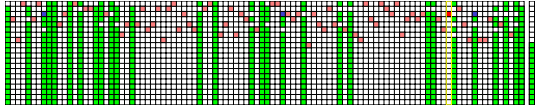
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

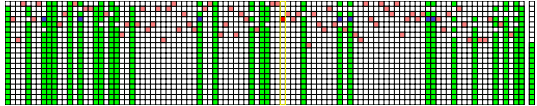
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

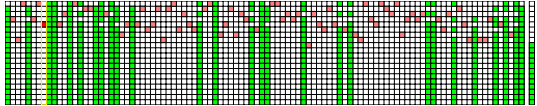
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

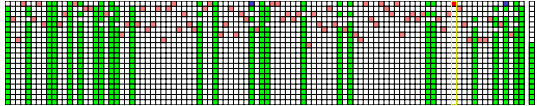
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

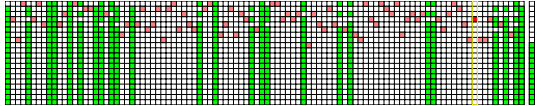
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

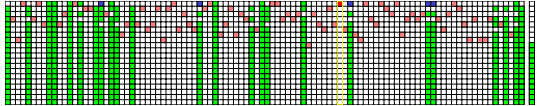
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

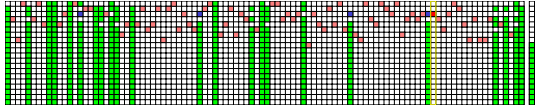
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

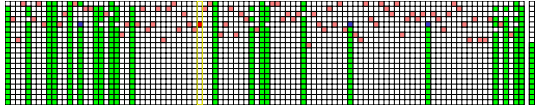
▶ Cost Update

▶ First Solution

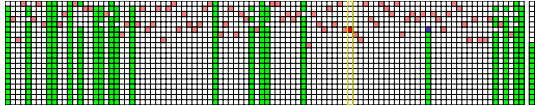
▶▶ Skip Animation



# Searchtree



# Searchtree



◀ Back to Start

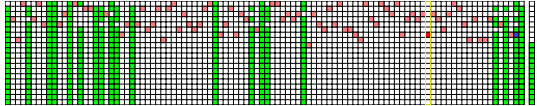
▶ Cost Update

▶ First Solution

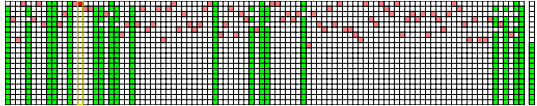
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# Searchtree



# Searchtree



◀ Back to Start

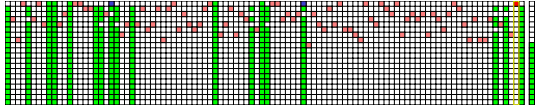
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



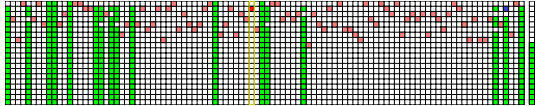
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

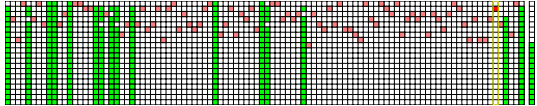
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

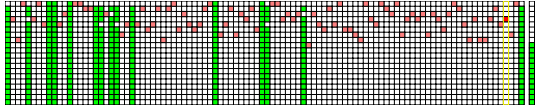
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

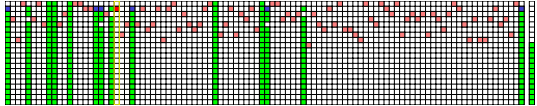
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

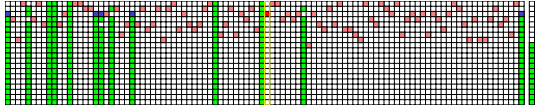
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

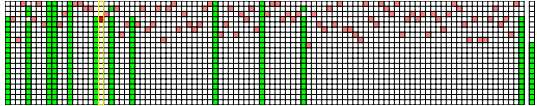
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

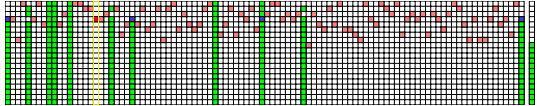
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

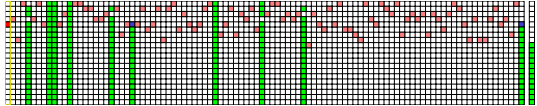
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

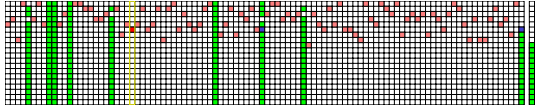
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

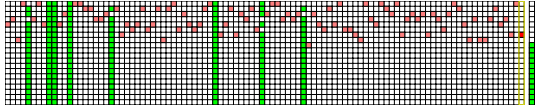
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree

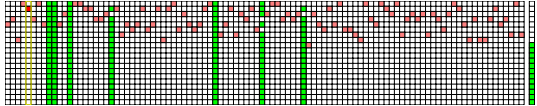


◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation





# Searchtree



◀ Back to Start

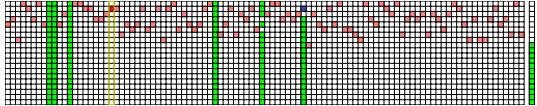
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

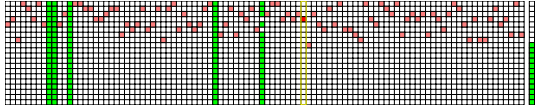
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

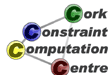
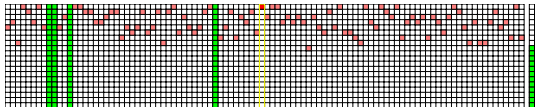
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

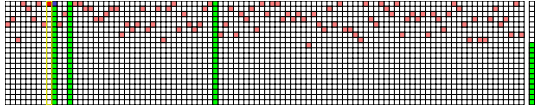
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

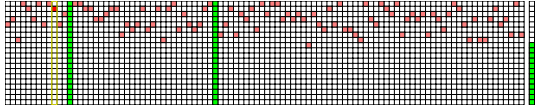
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

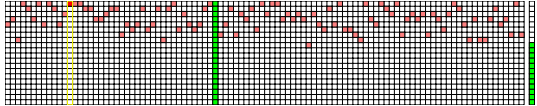
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

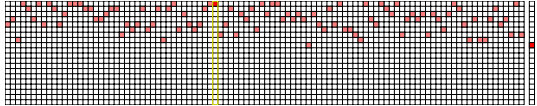
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

▶ Cost Update

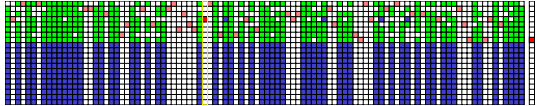
▶ First Solution

▶▶ Skip Animation





# Searchtree



◀ Back to Start

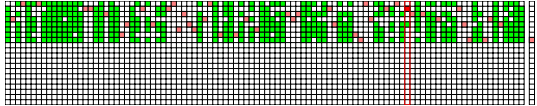
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

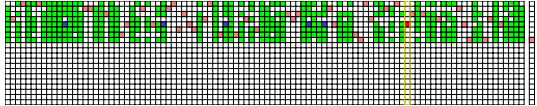
▶ Cost Update

▶ First Solution

▶▶ Skip Animation



# Searchtree



◀ Back to Start

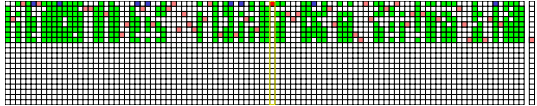
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▶ First Solution

▶▶ Skip Animation



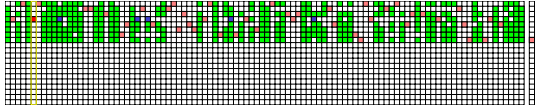
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



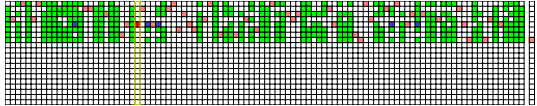
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



# Searchtree



◀ Back to Start

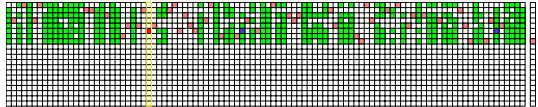
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▶ First Solution

▶▶ Skip Animation



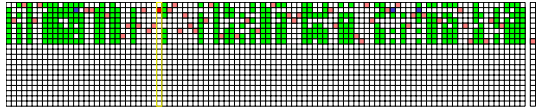
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree

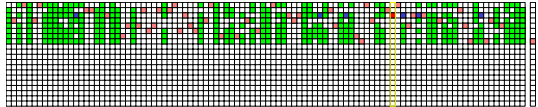


- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

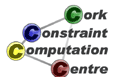




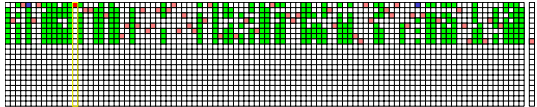
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



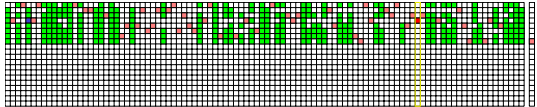
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



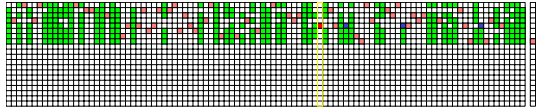
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



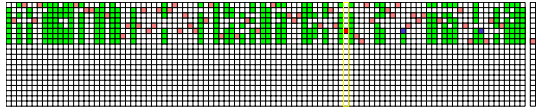
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



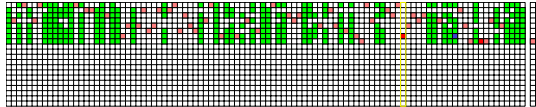
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



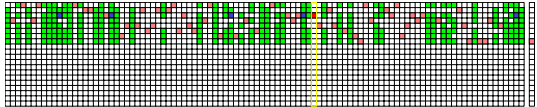
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



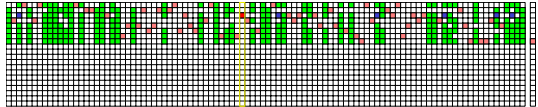
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree

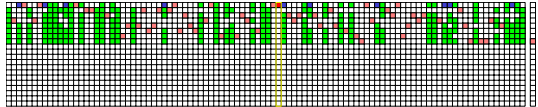


- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

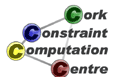




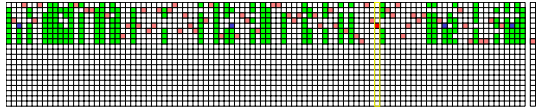
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



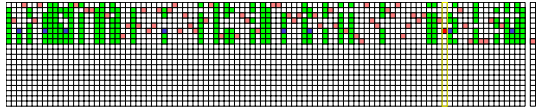
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



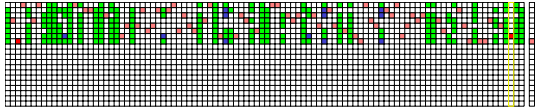
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



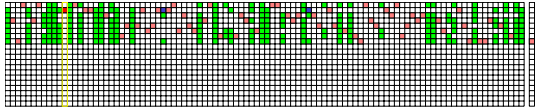
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



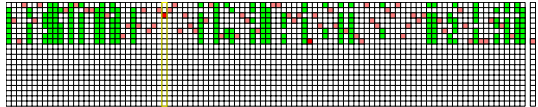
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



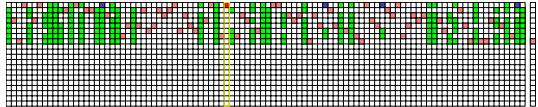
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



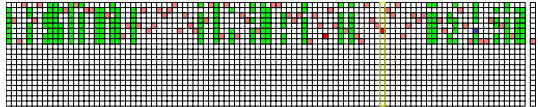
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree

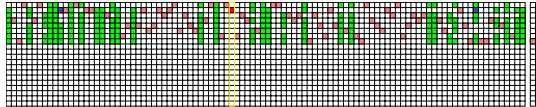


- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

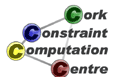




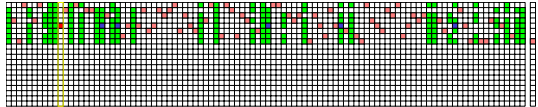
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



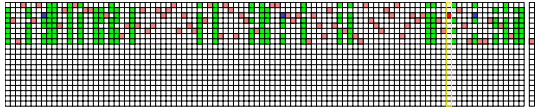
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



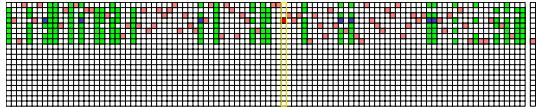
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



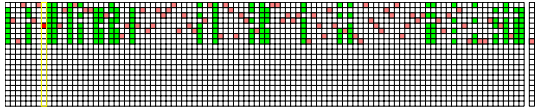
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



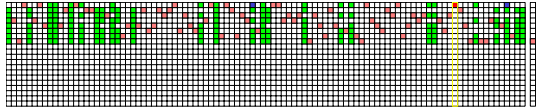
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



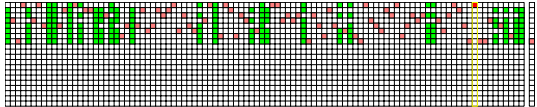
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



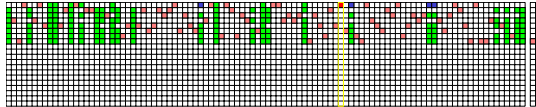
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree

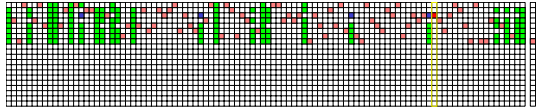


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- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

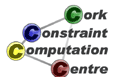




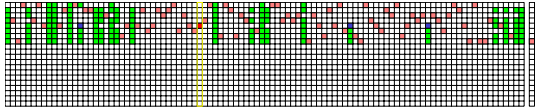
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



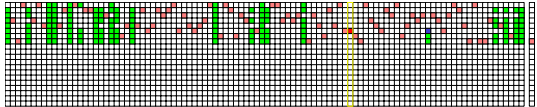
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



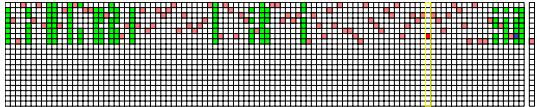
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



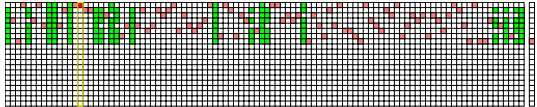
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



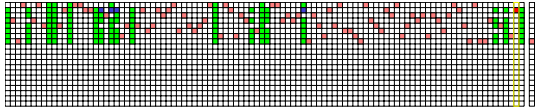
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



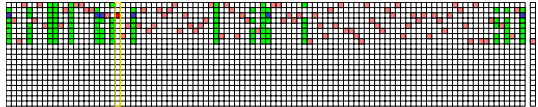
# Searchtree



◀ Back to Start   ▶ Cost Update   ▶ First Solution   ▶▶ Skip Animation



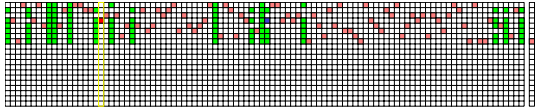
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- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree

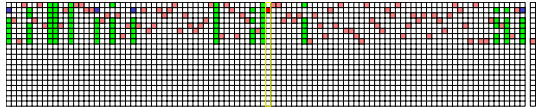


- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

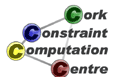




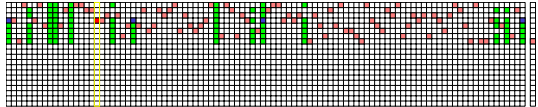
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



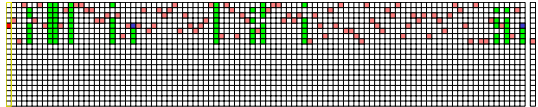
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



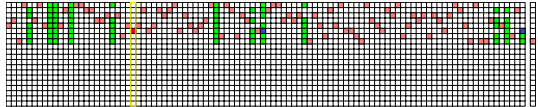
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



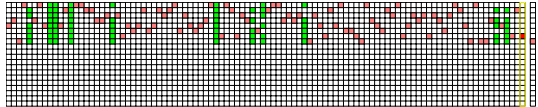
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



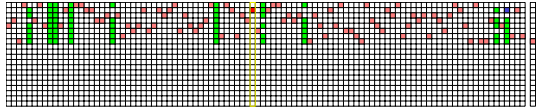
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



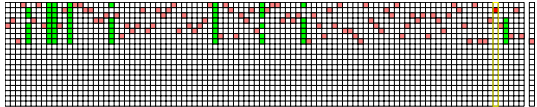
# Searchtree



- ◀ Back to Start
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# Searchtree



◀ Back to Start

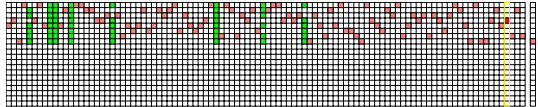
▶ Cost Update

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# Searchtree

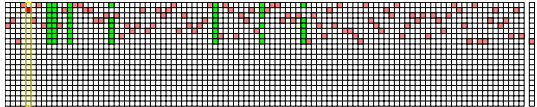


- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation

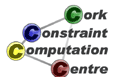




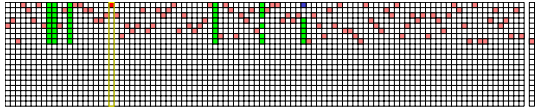
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



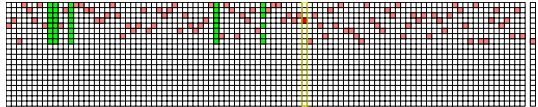
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
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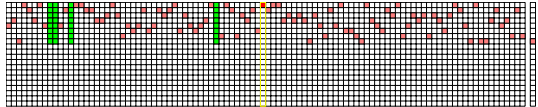
# Searchtree



- ◀ Back to Start
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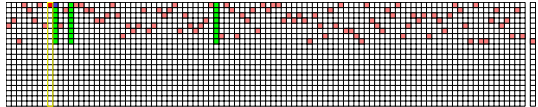
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- ◀ Back to Start
- ▶ Cost Update
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- ▶▶ Skip Animation



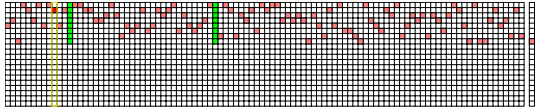
# Searchtree



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- ▶ First Solution
- ▶▶ Skip Animation



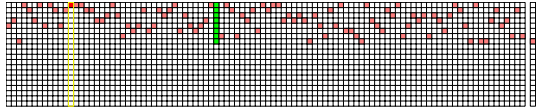
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



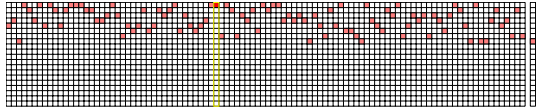
# Searchtree



- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution
- ▶▶ Skip Animation



# Searchtree



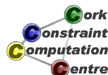
- ◀ Back to Start
- ▶ Cost Update
- ▶ First Solution





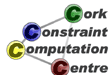
# Observations

- Optimal solution found with minimal backtracking
- Reaching lower bound avoids enumeration proof of optimality
- Not guaranteed to be optimal for original problem
- Given decomposition destroys flexibility in finding solution



# Further Experiments

- Vary number of demands to be handled
- Make 100 runs with randomized demands



# Multiple Runs (100 experiments)

Network	Nr Demands	Avg LB	Avg Sol	$\Sigma$ Sol	Avg Gap
mci	20	3.71	3.71	0.711	0.00
mci	40	5.85	5.85	0.931	0.00
mci	60	7.69	7.69	1.324	0.00
mci	80	9.48	9.48	1.353	0.00
mci	100	11.34	11.34	1.687	0.00
mci	120	12.89	12.89	1.928	0.00
mci	140	14.59	14.59	2.298	0.00
mci	160	16.28	16.28	2.421	0.00
mci	180	17.89	17.89	2.656	0.00
mci	200	19.52	19.52	2.456	0.00

# Conclusions

- These are not hard problem instances
- In general, graph coloring can be much more difficult
- Fast, simple solution to RWA problem
- Quality gap to be determined

