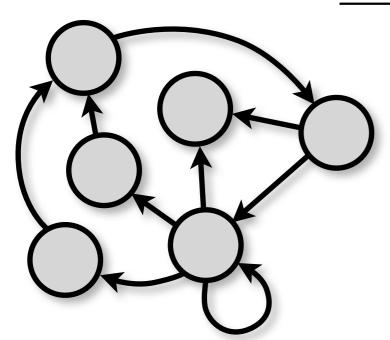
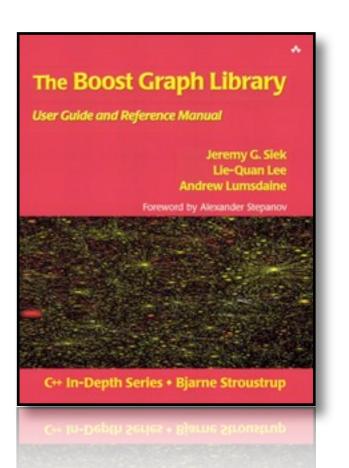


# The Boost Graph Library

http://boost.org/libs/graph





# Graph Applications

**Networks** 

Compilers

EDA, GUI, GIS\*

Scheduling

**Finance** 

Linear Algebra

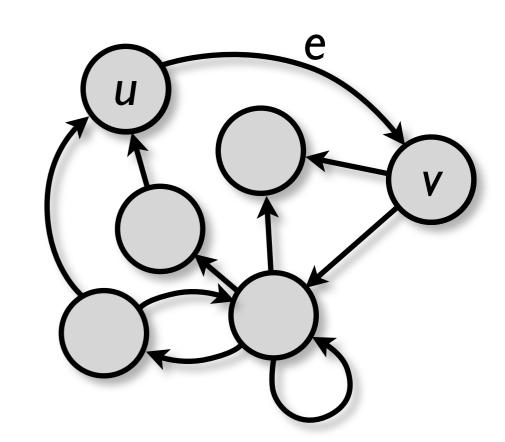
Scientific Computing...





# Graph Abstraction

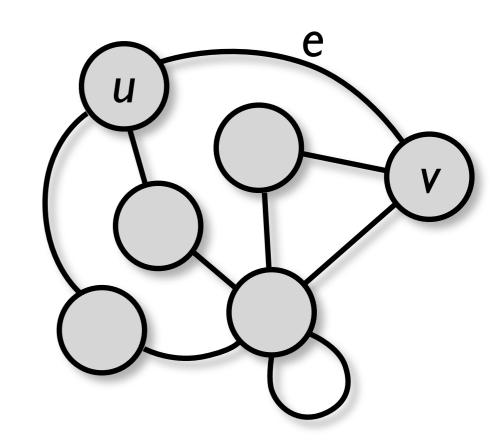
- Vertex set V
- Edge set  $E \subseteq V \times V$
- Graph G = (V, E)
- Directed Graph:
  - $e \in E$  is an ordered pair (u,v)
  - e is an <u>out-edge</u> of <u>source vertex</u> u
  - e is an <u>in-edge</u> of <u>target vertex</u> v
- Undirected Graph:  $(u,v) \equiv (v,u)$





# Graph Abstraction

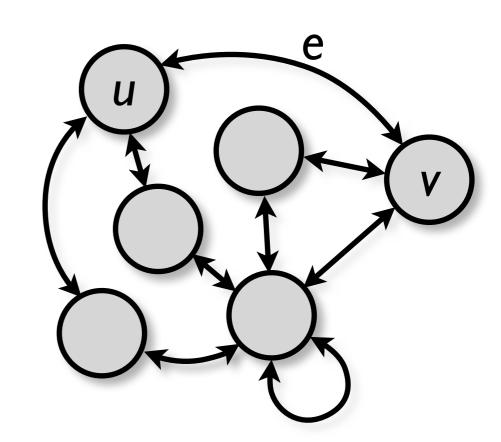
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- Undirected Graph:  $(u,v) \equiv (v,u)$





# Graph Abstraction

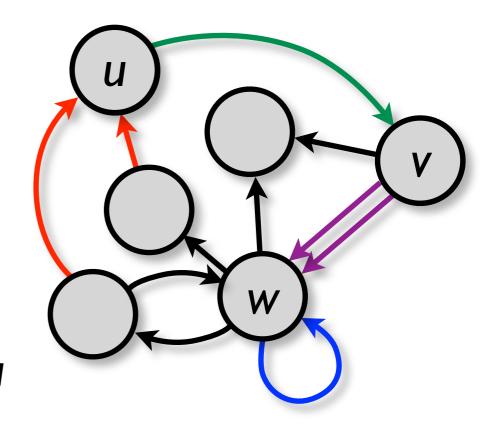
- Vertex set V
- Edge set  $E \subseteq V \times V$
- Graph G = (V, E)
- Directed Graph:
  - $e \in E$  is an ordered pair (u,v)
  - e is an <u>out-edge</u> of <u>source vertex</u> u
  - e is an <u>in-edge</u> of <u>target vertex</u> v
- Undirected Graph:  $(u,v) \equiv (v,u)$





# Directed Graph Terms

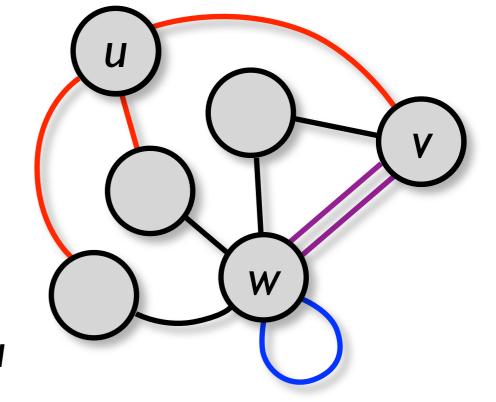
- u has <u>in-degree</u> 2
- u has <u>out-degree</u> I
- $(u,v) \in E \Leftrightarrow v \text{ is adjacent to } u$
- (w,w) is a self-loop
- In a multigraph, parallel edges are allowed





# Undirected Graph Terms

• u has <u>degree</u> 3



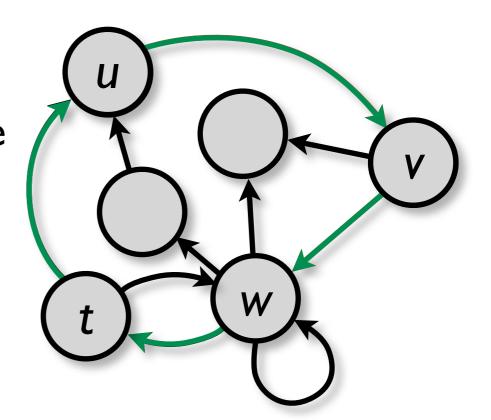
- $(u,v) \in E \Leftrightarrow v \text{ is adjacent to } u$
- (w,w) is a <u>self-loop</u>
- In a <u>multigraph</u>, <u>parallel edges</u> are allowed



## Paths

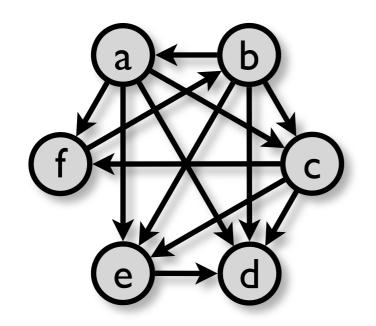
- Path: a sequence of edges such that the target of each edge is the source of its successor, e.g. [ (u,v), (v,w) ]
- w is <u>reachable</u> from u iff there is a path from u to w
- Cycle: a path that starts and ends with the same vertex, e.g.

• A graph with no cycles is acyclic

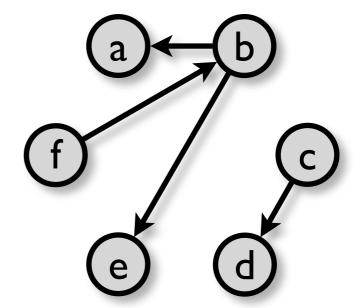




# Sparsity $\alpha = \frac{|E|}{|V|}$



Dense:  $\alpha = |V|$ 



Sparse:  $\alpha \ll |V|$ 

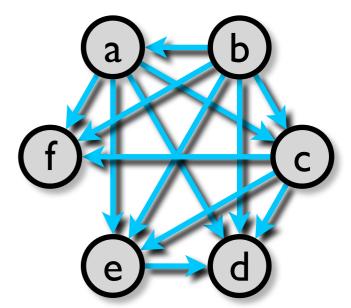




# Graph Representations

# Adjacency Matrix

- Space:  $O(|V|^2)$
- Add edge: O(I)
- Query edge: O(I)
- Remove edge: O(1)
- Add Vertex: O(|V|<sup>2</sup>)
- Remove Vertex:  $O(|V|^2)$

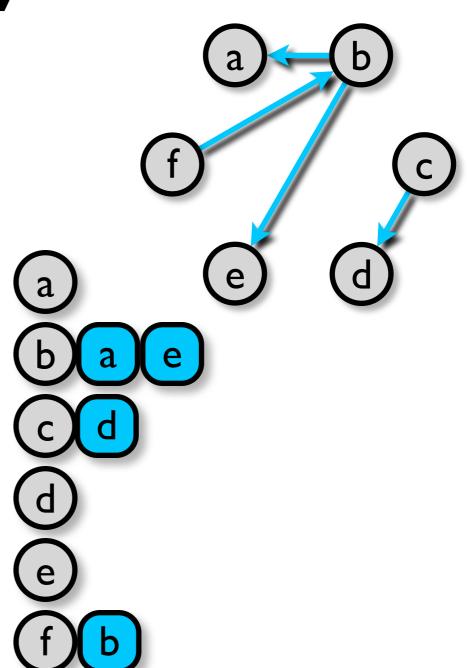


	a	b	С	Ь	е	f
a	0	0		0		
b		0				
С	0	0	0		0	
В	0	0	0	0	0	0
е	0	0	0		0	0
f	0	0	0	0	0	0



# Adjacency List

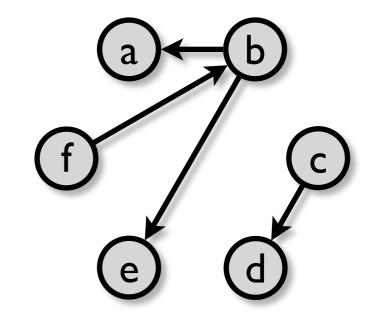
- Space: O(|V|+|E|)
- Add edge: O(I)
- Query edge:  $O(\alpha)$
- Remove edge:  $O(\alpha)$
- Add Vertex: O(I)
- Remove Vertex: O(|V|)

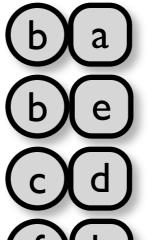




# Edge List

- Space: O(|E|)
- Add edge: O(I)
- Query edge: O(|E|)
- Remove edge: O(|E|)
- Add Vertex: O(?)
- Remove Vertex: O(|E|)





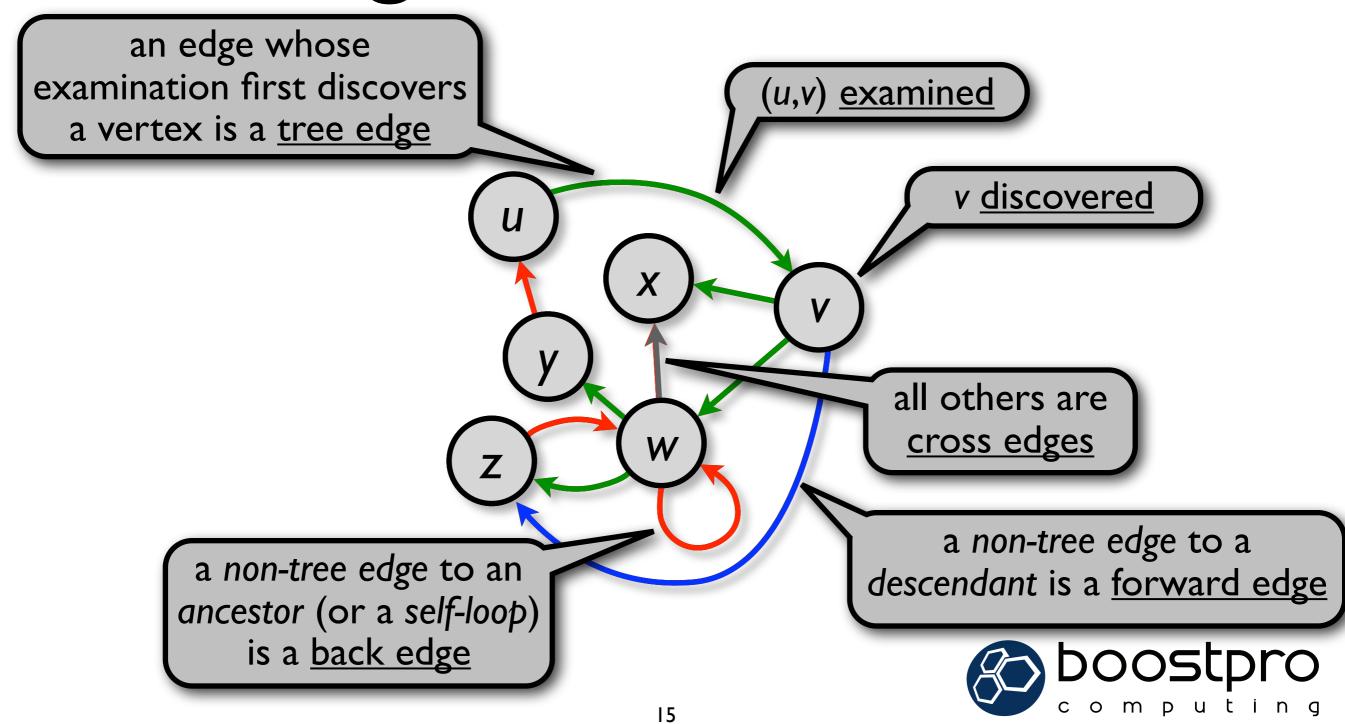




# Graph Traversals

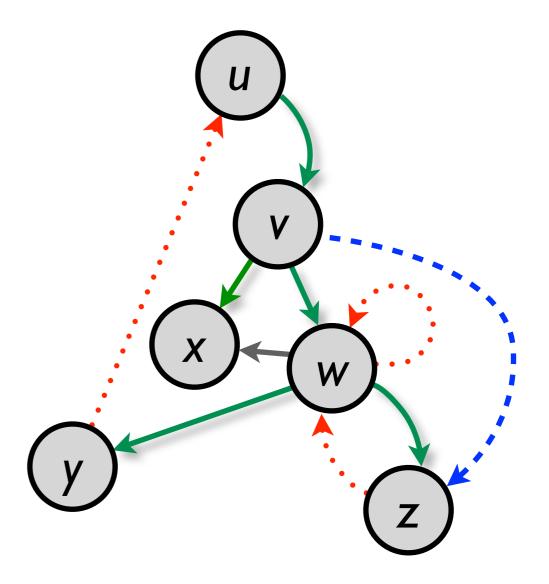
Foundational Algorithms

# Graph Traversal / Edge Classification



# Graph Traversal / Edge Classification

- Tree edges form one or more trees
- Forward edges point to descendants
- Back edges point to ancestors (and self).
- Cross edges are the others





## Breadth-First Search

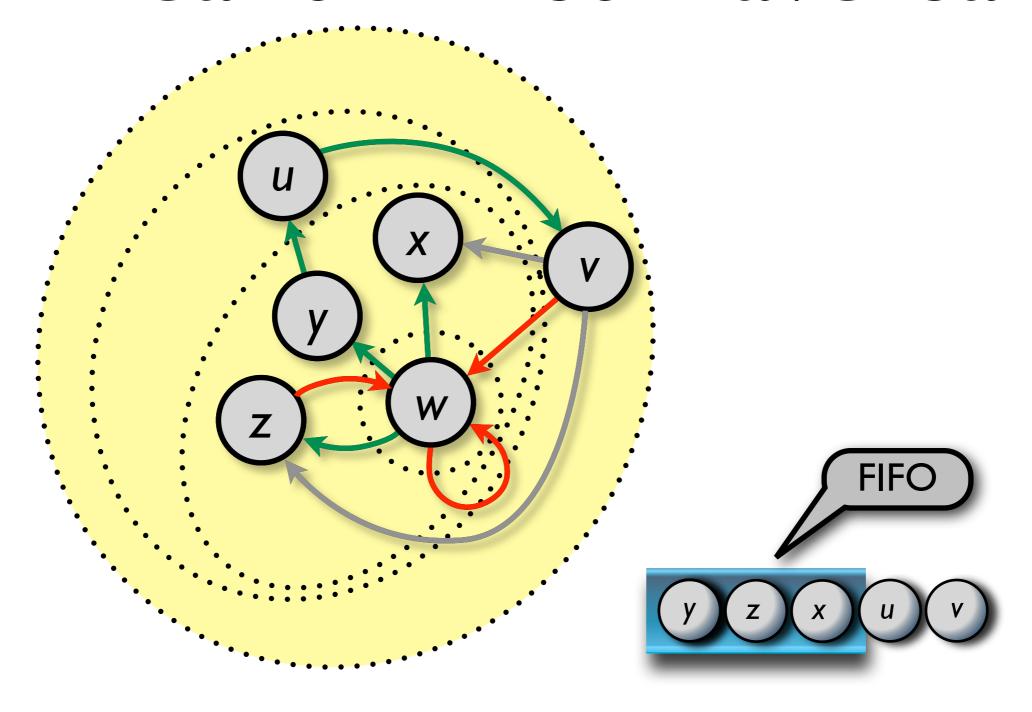
```
BFS(G, s)
   for each vertex u \in V[G]
                                         \triangleleft <u>initialize</u> vertex u
      color[u] \leftarrow WHITE

    □ discover vertex s

   color[s] \leftarrow GRAY
   ENQUEUE(Q, s)
   while (Q \neq \emptyset)
                                         \triangleleft discover vertex u
      u \leftarrow \mathsf{DEQUEUE}(Q)
      for each v \in Adj[u]
                                         \triangleleft examine edge (u, v)
         if (color[v] = WHITE)
                                         \triangleleft (u, v) is a tree edge
           color[v] \leftarrow GRAY
           ENQUEUE(Q, v)
         else
                                         \triangleleft (u,v) is a back or cross edge
      color[u] \leftarrow BLACK
```

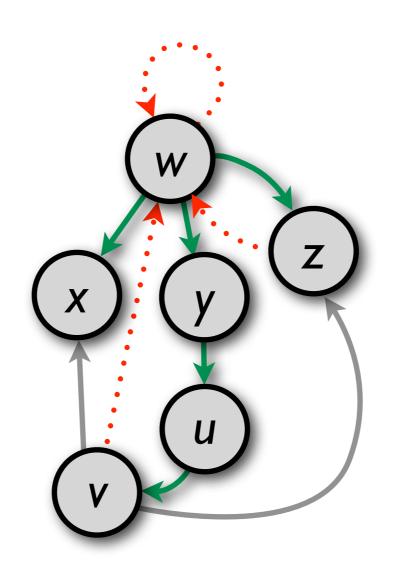


## Breadth-First Traversal





## Breadth-First Traversal



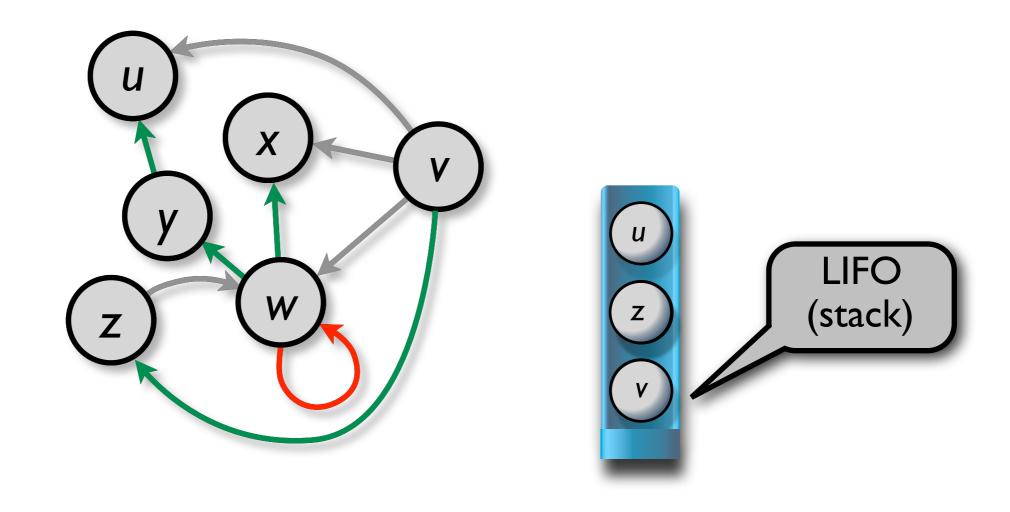


# Depth-First Search

```
DFS(G)
   for each vertex u \in V[G]
                                         color[u] ← WHITE
   for each vertex u \in V[G]
      if (color[v] = WHITE)
         call DFS-VISIT(G, u)
\mathsf{DFS}\text{-}\mathsf{VISIT}(G,u)
                                         \triangleleft discover vertex u
   color[u] \leftarrow GRAY
   for each v \in Adj[u]
                                         \triangleleft examine edge (u, v)
      if (color[v] = WHITE)
                                         \triangleleft (u, v) is a tree edge
         call DFS-VISIT(G, u)
      else if (color[v] = GRAY)
                                         \triangleleft (u,v) is a back edge
      else
                                         \triangleleft (u,v) is a cross or forward edge
   color[u] \leftarrow BLACK
```

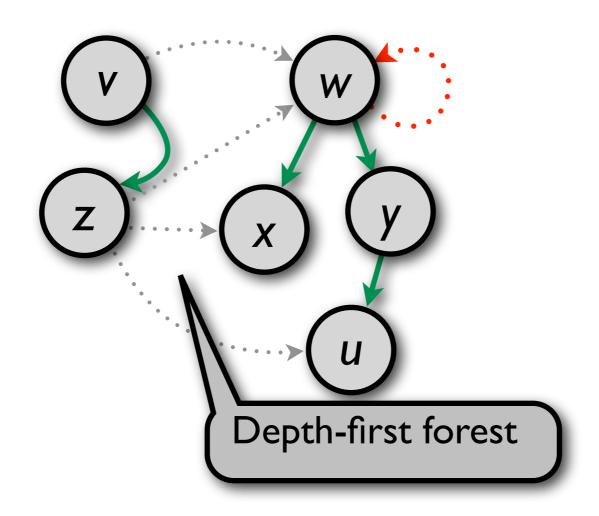


# Depth-First Traversal





# Depth-First Traversal







# Boost Graph Library

Motivation and Design Principles

## Earlier Graph Libraries

- One of two categories
  - Easy to use but inefficient (LEDA, GTL)
  - Fast but incomprehensible (Fortran)
- All were inflexible:
  - Tied to their own graph data structures, ...
  - ...which have have hard-coded properties
  - Algorithms not extensible



# Properties

- Data associated with vertices and edges
- Storage:
  - Internal: in graph data structure
  - <u>External</u>: in other data structure, addressed by vertex/edge id

Purpose	Example(s)		
Input	edge length/flow/ capacity		
State	vertex/edge color parent vertex in tree		
Output	shortest path length/ predecessor		
Static	Vertex index, out-degree		
User	vertex/edge label, etc.		



# Algorithm Extension

```
BFS(G, s)
                                                   DIJKSTRA(G, s)
   for each vertex u \in V[G]
                                                      for each vertex u \in V[G]
     c[u] \leftarrow WHITE
                                                        d[u] \leftarrow \infty
   c[s] \leftarrow GRAY
                                                      d[s] \leftarrow 0
   ENQUEUE(Q, s)
                                                      ENQUEUE(Q, s)
   while (Q \neq \emptyset)
                                                      while (Q \neq \emptyset)
     u \leftarrow \mathsf{DEQUEUE}(Q)
                                                        u \leftarrow \mathsf{DEQUEUE}(Q)
     for each v \in Adj[u]
                                                        for each v \in Adj[u]
        if (c[v] = WHITE)
                                                           if (d[v] > weight(u,v)+d[u])
          c[v] \leftarrow GRAY
                                                             d[v] \leftarrow weight(u,v)+d[u]
          ENQUEUE(Q, v)
                                                             ENQUEUE-RELAX(Q, v)
        else
                                                           else
     c[u] \leftarrow BLACK
```



# Desiderata: Axes of Genericity

- Graph representation category
- Details of specific graph representation
- Choice of vertex and edge properties
- Details of vertex and edge property storage
- Algorithm/data-structure decoupling
- Algorithm composability
- Algorithm extensibility

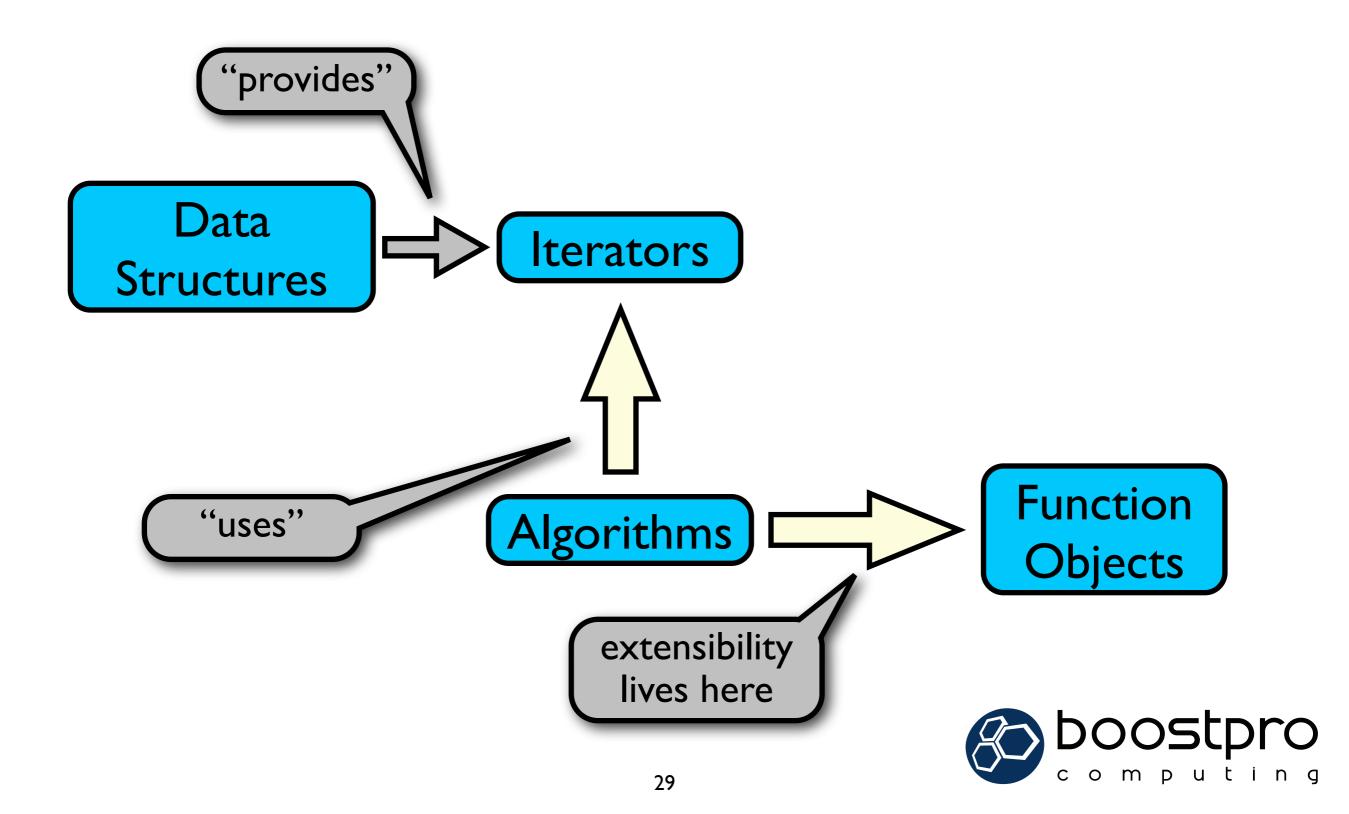


## Desiderata: General

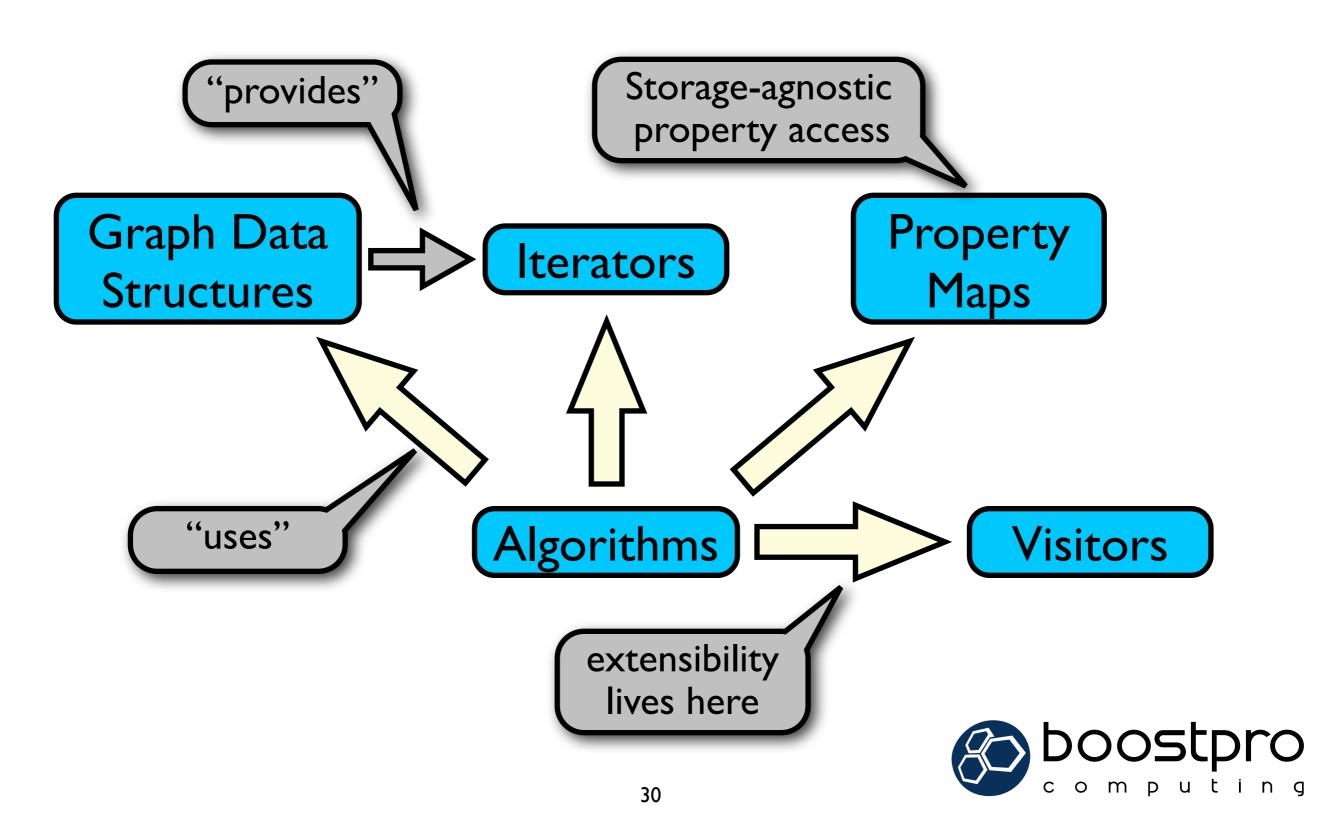
- High Performance
- Natural
  - Similar to pseudocode in literature
  - Close to existing libraries
  - Compatible with STL and built-in types



## STL Architecture



## **BGL** Architecture



## BGL Algorithms Cheatsheet

#### Basic Operations

- copy\_graph
- transpose graph

#### Core Searches

- breadth\_first\_search
- breadth\_first\_visit
- depth\_first\_search
- depth\_first\_visit
- undirected dfs

#### Other Core

- topological\_sort
- transitive\_closure
- lengauer tarjan dominator tree

### Shortest Paths/Cost Minimization

- dijkstra\_shortest\_paths
- dijkstra\_shortest\_paths\_no\_color\_map
- bellman\_ford\_shortest\_paths
- dag\_shortest\_paths
- johnson\_all\_pairs\_shortest\_paths
- floyd\_warshall\_all\_pairs\_shortest\_paths
- resource-constrained shortest paths
- astar\_search

### Minimum Spanning Tree

- kruskal\_minimum\_spanning\_tree
- prim\_minimum\_spanning\_tree

#### Connected Components

- connected\_components
- strong components
- biconnected components
- articulation\_points
- Incremental Connected Components
  - initialize incremental components
  - incremental components
  - same component
  - component index

### Maximum Flow and Matching

- edmonds\_karp\_max\_flow
- push\_relabel\_max\_flow
- kolmogorov\_max\_flow
- edmonds\_maximum\_cardinality\_matching

#### • Sparse Matrix Ordering

- cuthill\_mckee\_ordering
- king\_ordering
- minimum\_degree\_ordering
- sloan\_ordering
- sloan\_start\_end\_vertices

### Graph Metrics

- ith/max/aver/rms\_wavefront
- bandwidth
- ith\_bandwidth
- brandes\_betweenness\_centrality
- minimum/maximum\_cycle\_ratio

#### Structure Comparisons

- isomorphism
- mcgregor common subgraphs

#### Layout

- random\_graph\_layout
- circle\_layout
- kamada\_kawai\_spring\_layout
- fruchterman\_reingold\_force\_directed\_layout
- gursoy\_atun\_layout

#### Clustering

betweenness\_centrality\_clustering

#### Planarity

- boyer\_myrvold\_planarity\_test
- planar\_face\_traversal
- planar\_canonical\_ordering
- chrobak\_payne\_straight\_line\_drawing
- is\_straight\_line\_drawing
- is kuratowski subgraph
- make\_connected
- make\_biconnected\_planar
- make\_maximal\_planar

#### Miscellaneous

- metric\_tsp\_approx
- sequential\_vertex\_coloring

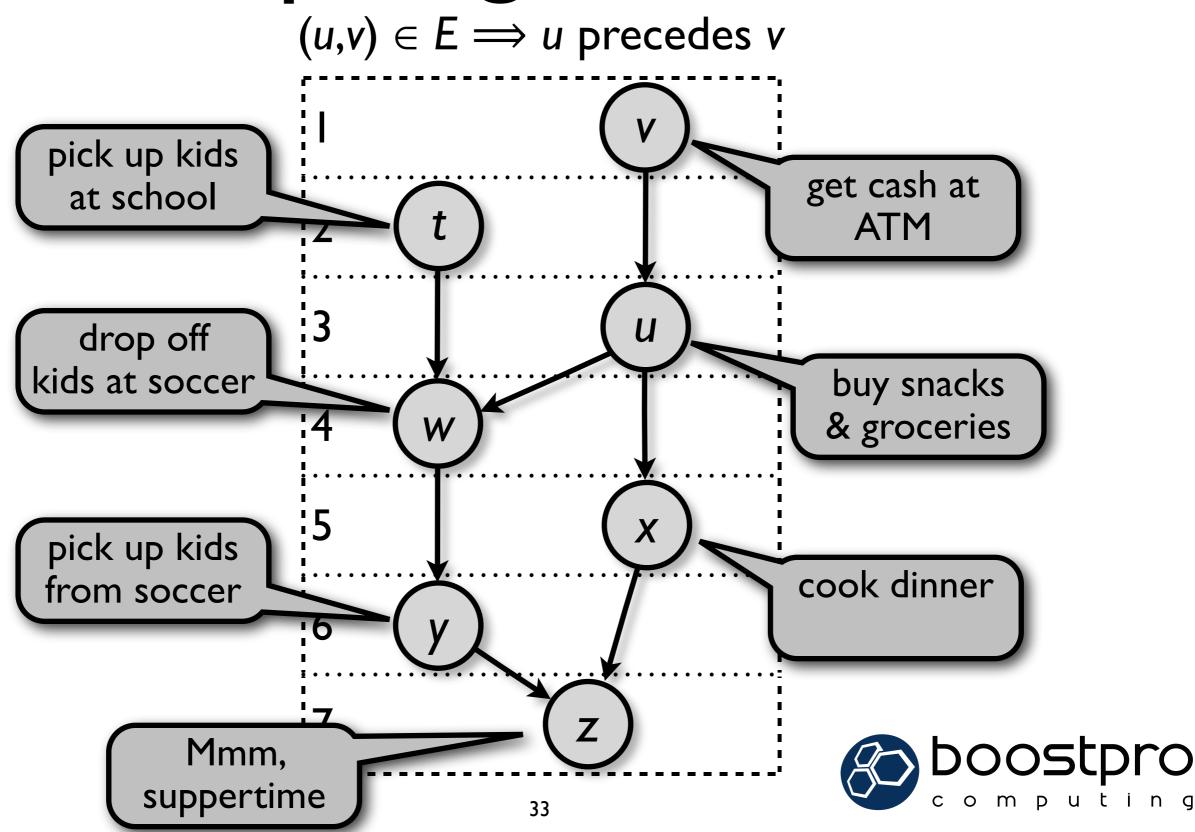




## Hello, BGL!

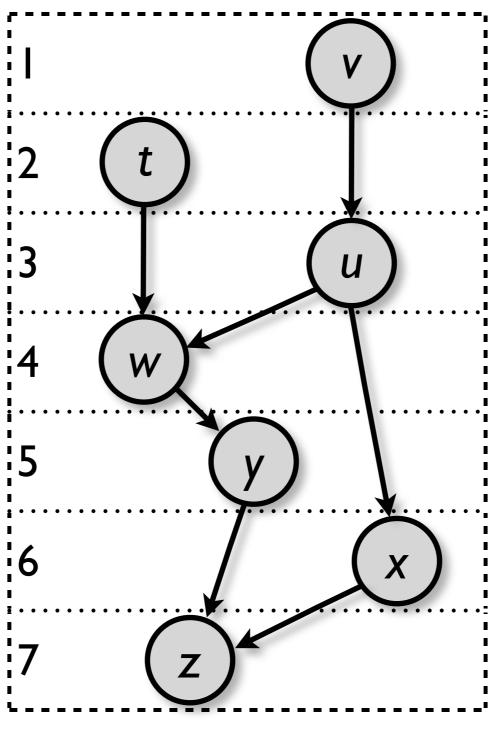
Example: topological sort

## Topological Sort:



# Topological Sort:

 $(u,v) \in E \Longrightarrow u \text{ precedes } v$ 





library L

## client

session



```
// Write g's vertex ids to result_iter in reverse topological order
template <typename Graph, typename OutputIterator>
void topological_sort(Graph& g, OutputIterator result_iter);
```

### library

### client

### session

```
#include <deque>
                                                post-hoc
#include <vector>
#include <list>
                                               adaptation
#include <iostream>
#include <boost/graph/vector_as_graph.hpp>
#include <boost/graph/topological_sort.hpp>
const char* tasks☐ = {
    "pick up kids from school",
                                          // 0
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
                                          // 3
    "drop off kids at soccer practice",
                                          // 4
    "cook dinner",
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
{
    std::vector< std::list<int> > g(n_tasks);
    q[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
```

```
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
    std::vector< std::list<int> > g(n_tasks);
    g[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
    g[3].push_back(5);
    g[4].push_back(6);
    g[5].push_back(6);
    std::deque<int> topo_order;
    boost::topological_sort(
      g, std::front_inserter(topo_order),
      vertex_index_map(boost::identity_property_map()));
    for (std::deque<int>::iterator i = topo_order.begin();
       i != topo_order.end(); ++i)
      std::cout << tasks[*i] << std::endl;</pre>
```

#### library

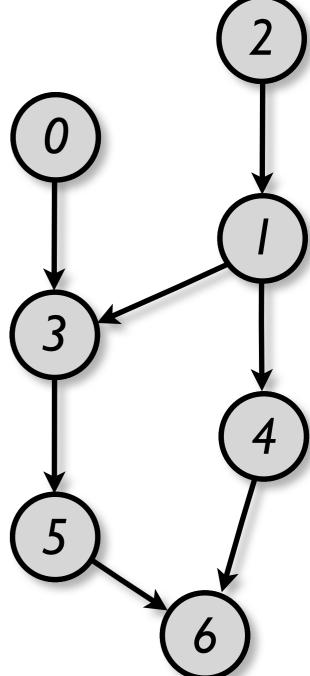
#### client

J session 🕻

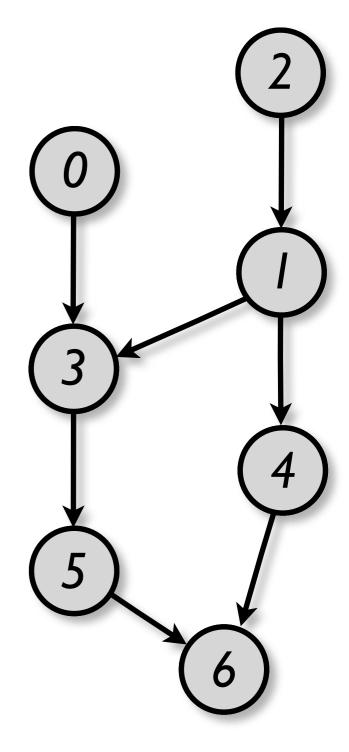


\$ ./x
get cash at ATM
buy groceries (and snacks)
cook dinner
pick up kids from school
drop off kids at soccer practice
pick up kids from soccer
eat dinner

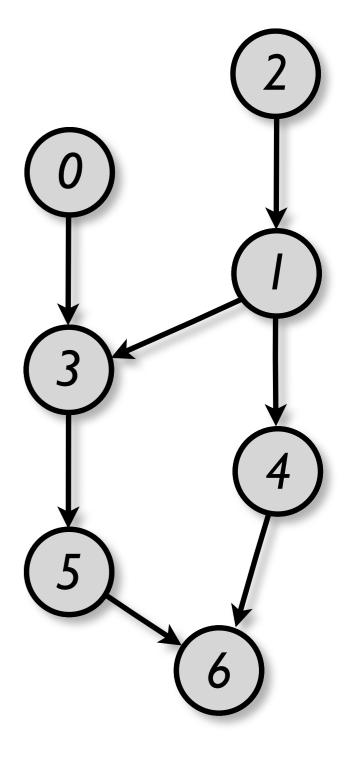
```
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
    std::vector< std::list<int> > g(n_tasks);
    g[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
    g[3].push_back(5);
    g[4].push_back(6);
    g[5].push_back(6);
    std::deque<int> topo_order;
    boost::topological_sort(
      g, std::front_inserter(topo_order),
      vertex_index_map(boost::identity_property_map()));
    for (std::deque<int>::iterator i = topo_order.begin();
        i != topo_order.end(); ++i)
    {
      std::cout << tasks[*i] << std::endl;</pre>
    }
```



```
#include <boost/graph/vector_as_graph.hpp>
#include <boost/graph/topological_sort.hpp>
const char* tasks[] = {
    "pick up kids from school",
                                          // 0
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
    std::vector< std::list<int> > g(n_tasks);
    g[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
    g[3].push_back(5);
    g[4].push_back(6);
    g[5].push_back(6);
```



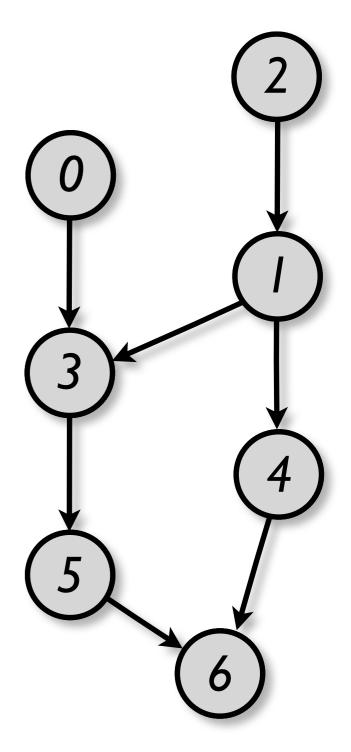
```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/topological_sort.hpp>
const char* tasks[] = {
    "pick up kids from school",
                                          // 0
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
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    std::vector< std::list<int> > g(n_tasks);
    g[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
    g[3].push_back(5);
    g[4].push_back(6);
    g[5].push_back(6);
```



#### client



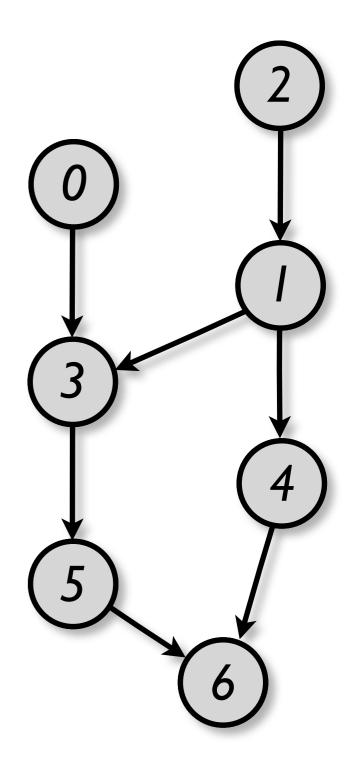
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#include <boost/graph/adjacency_list.hpp>
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    "pick up kids from school",
                                          // 0
    "buy groceries (and snacks)",
                                           // 1
    "get cash at ATM",
                                           // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                           // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
    std::vector< std::list<int> > g(n_tasks);
    g[0].push_back(3);
    g[1].push_back(3);
    g[1].push_back(4);
    g[2].push_back(1);
    g[3].push_back(5);
    g[4].push_back(6);
    g[5].push_back(6);
```



#### client



```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/topological_sort.hpp>
const char* tasks[] = {
    "pick up kids from school",
                                          // 0
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);
```



#### library

#### client

J session 🏻 🥰



```
$ ./x
get cash at ATM
buy groceries (and snacks)
cook dinner
pick up kids from school
drop off kids at soccer practice
pick up kids from soccer
eat dinner
```

## This Works, Too

(with appropriate adaptation)

```
typedef struct vertex_struct
{
    struct arc_struct* arcs;
} Vertex;

typedef struct arc_struct
{
    Vertex* tip;
    struct arc_struct* next;
} Arc;

typedef struct graph_struct
{
    Vertex* vertices;
} Graph;
```

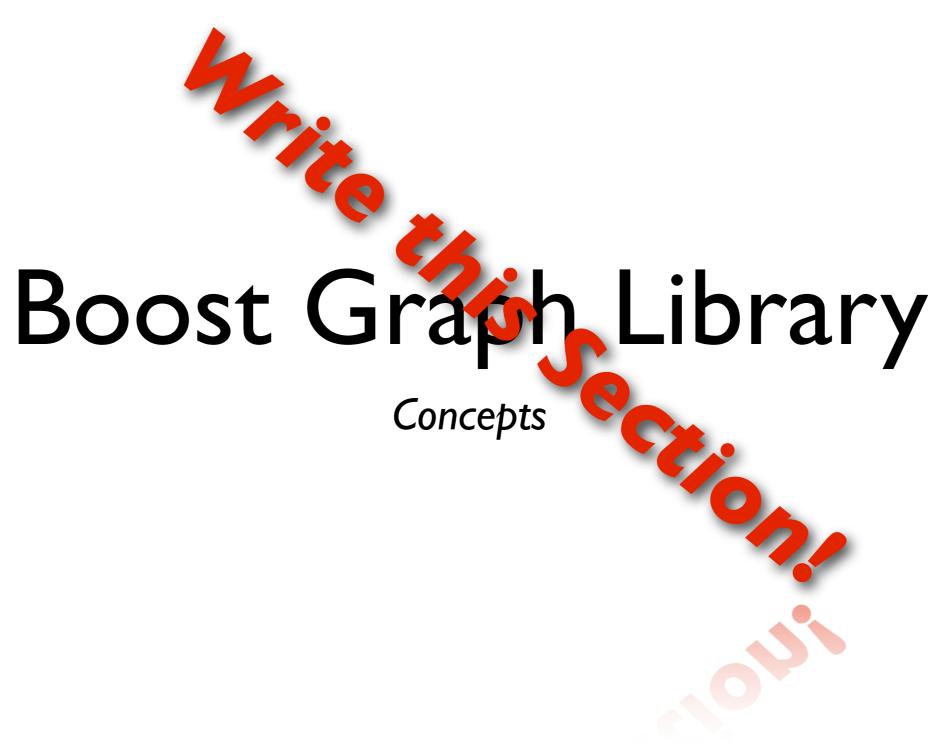


# Desiderata: Axes of Genericity

- Graph representation category
- √ Details of specific graph representation
- Choice of vertex and edge properties
- Details of vertex and edge property storage
- √ Algorithm/data-structure decoupling
- Algorithm composability
- Algorithm extensibility









# Boost Graph Library

Descriptors, Property Maps, and Visitors

## Descriptors

- Meaning and specific representation of "vertex" and "edge" are below the level of graph abstraction.
- BGL must model only relationships.
- <u>Descriptor</u>: a token or ID used to identify a vertex or edge
  - Expected to be a lightweight value type
  - Otherwise opaque from BGL's point-of-view
  - Access types as graph\_traits<G>::vertex\_descriptor, graph\_traits<G>::edge\_descriptor



# Property Maps

- Expected to be a lightweight value type
- Interface: get(m, key) put(m, key, v)
- Lvalue property maps only: pmap[key]
- BGL uses vertex/edge descriptors as keys
- Exterior property map: passed to algorithm as argument
- Interior property map: extracted by algorithm from graph if no exterior map supplied



### Visitors

- A "multi-callback" bundle
- Interface: vis.eventname( descriptor, graph)
- Expected to be a lightweight value type
- Used to extend the functionality of algorithms



## Breadth-First Visitor

```
BFS(G, s)
    for each vertex u \in V[G]
                                                  \triangleleft vis.<u>initialize_vertex</u>(u,G)
       color[u] ← WHITE

    vis.discover_vertex(u,G)

    color[s] \leftarrow GRAY
    ENQUEUE(Q, s)
    while (Q \neq \emptyset)
       u \leftarrow \mathsf{DEQUEUE}(Q)
                                                  \triangleleft vis.examine_vertex(u,G)
       for each v \in Adj[u]
                                                  \triangleleft vis. examine_edge((u,v), G)
          if (color[v] = WHITE)
             color[v] \leftarrow GRAY
                                                  \triangleleft vis.<u>tree_edge</u>((u,v),G)
             ENQUEUE(Q, v)

    vis.discover_vertex(v,G)

          else

    vis.non_tree_edge(v,G)

             if (color[v] = GRAY)
                                                  \triangleleft vis.gray_target((u,v),G)
             else
                                                  \triangleleft vis.black_target((u,v),G)
       color[u] \leftarrow BLACK

√ vis. finish_vertex(u, G)
```



add\_edge(5, 6, g);

```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/topological_sort.hpp>
const char* tasks[] = {
                                          // 0
    "pick up kids from school",
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
{
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
```

#### library

#### client



```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/breadth_first_search.hpp>
const char* tasks[] = {
                                          // 0
    "pick up kids from school",
    "buy groceries (and snacks)",
                                          // 1
    "get cash at ATM",
                                          // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                          // 5
    "eat dinner"
                                          // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
int main()
{
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);
```

#### library L

#### client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
       std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    }
    template <class Vertex, class Graph>
    void discover_vertex(Vertex u, const Graph&)
    {
       std::cout << "Found vertex #" << vcounter++ << "\n";</pre>
private:
    std::size_t ecounter, vcounter;
};
int main()
{
```

#### library (

#### client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
      std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    template <class Vertex, class Graph>
    void discover_vertex(Vertex u, const Graph&)
    {
       std::cout << "Found vertex #" << vcounter++ << "\n";</pre>
private:
    std::size_t ecounter, vcounter;
};
int main()
{
```

#### library client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
       std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    }
    template <class Vertex, class Graph>
    void discover_vertex(Vertex u, const Graph&)
      std::cout << "Found vertex #" << vcounter++ << "\n";</pre>
private:
    std::size_t ecounter, vcounter;
};
int main()
{
```

#### <u>library</u>

#### client



```
int main()
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);
    std::deque<int> topo_order;
    boost::topological_sort(
      g, std::front_inserter(topo_order),
      vertex_index_map(boost::identity_property_map()));
    for (std::deque<int>::iterator i = topo_order.begin();
       i != topo_order.end(); ++i)
      std::cout << tasks[*i] << std::endl;</pre>
```

#### library L

#### client



```
int main()
{
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);

boost::breadth_first_search( g, 2, visitor( bfs_counter() ) );
}
```

#### library

#### client

#### session



\$ ./x

Found vertex #0

Found tree edge #0

Found vertex #1

Found tree edge #1

Found vertex #2

Found tree edge #2

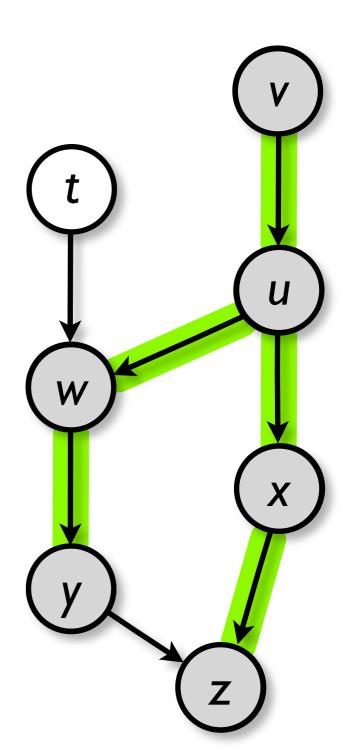
Found vertex #3

Found tree edge #3

Found vertex #4

Found tree edge #4

Found vertex #5



# Depth-First Search

```
DFS(G)
    for each vertex u \in V[G]
                                            \triangleleft vis.<u>initialize_vertex</u>(u,G)
       color[u] ← WHITE
    for each vertex u \in V[G]
       if (color[v] = WHITE)
          call DFS-VISIT(G, u)
DFS-VISIT(G, u)

√ vis.<u>discover_vertex(u,G)</u>

    color[u] \leftarrow GRAY
                                            \triangleleft vis. examine_edge((u,v), G)
    for each v \in Adj[u]
       if (color[v] = WHITE)
                                            \triangleleft vis.<u>tree_edge((u,v),G</u>)
          call DFS-VISIT(G, u)
       else if (color[v] = GRAY)
                                            \triangleleft vis.back_edge((u,v),G)
       else
                                            \triangleleft vis.cross_or_forward_edge((u,v),G)
                                            \triangleleft vis. finish_vertex(u, G)
    color[u] \leftarrow BLACK
```

All descendants finished prior to this



#### client



```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/breadth_first_search.hpp>
const char* tasks[] = {
    "pick up kids from school",
                                           // 0
    "buy groceries (and snacks)",
                                           // 1
    "get cash at ATM",
                                           // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                           // 5
    "eat dinner"
                                           // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
    {
      std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    }
```

#### client



```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/depth_first_search.hpp>
const char* tasks[] = {
    "pick up kids from school",
                                           // 0
    "buy groceries (and snacks)",
                                           // 1
    "get cash at ATM",
                                           // 2
    "drop off kids at soccer practice",
                                          // 3
    "cook dinner",
                                          // 4
    "pick up kids from soccer",
                                           // 5
    "eat dinner"
                                           // 6
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
    {
      std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    }
```

<u>library</u>

#### client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
struct bfs_counter
  : boost::default_bfs_visitor // inherit empty event point actions
{
    bfs_counter() : ecounter(0), vcounter(0) {}
    template <class Edge, class Graph>
    void tree_edge(Edge e, const Graph&)
       std::cout << "Found tree edge #" << ecounter++ << "\n";</pre>
    template <class Vertex, class Graph>
    void discover_vertex(Vertex u, const Graph&)
       std::cout << "Found vertex #" << vcounter++ << "\n";</pre>
private:
    std::size_t ecounter, vcounter;
};
int main()
```

45

library client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);

template <class OutputIterator>
struct topo_sort_visitor : boost::default_dfs_visitor
{
   topo_sort_visitor(OutputIterator iter)
        : m_iter(iter) { }

   template <class Vertex, class Graph>
   void finish_vertex(Vertex u, const Graph&)
   { *m_iter++ = u; }

private:
   OutputIterator m_iter;
};
```

```
int main()
{
```

#### <u>library</u>

#### client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);

template <class OutputIterator>
struct topo_sort_visitor : boost::default_dfs_visitor
{
    topo_sort_visitor(OutputIterator iter)
        : m_iter(iter) { }

    template <class Vertex, class Graph>
    void finish_vertex(Vertex u, const Graph&)
    { *m_iter++ = u; }

private:
    OutputIterator m_iter;
};
```

```
int main()
{
```

#### library client



```
};
int const n_tasks = sizeof(tasks) / sizeof(char*);
template <class OutputIterator>
struct topo_sort_visitor : boost::default_dfs_visitor
    topo_sort_visitor(OutputIterator iter)
      : m_iter(iter) { }
    template <class Vertex, class Graph>
    void finish_vertex(Vertex u, const Graph&)
    { *m_iter++ = u; }
private:
    OutputIterator m_iter;
};
template <class Graph, class OutputIterator>
void topological_sort(Graph& g, OutputIterator result_iter)
    topo_sort_visitor<OutputIterator> vis(result_iter);
    boost::depth_first_search(g, boost::visitor(vis));
int main()
```

#### library

#### client



```
int main()
{
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_edge(0, 3, g);
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);

boost::breadth_first_search( g, 2, visitor( bfs_counter() ) );
}
```

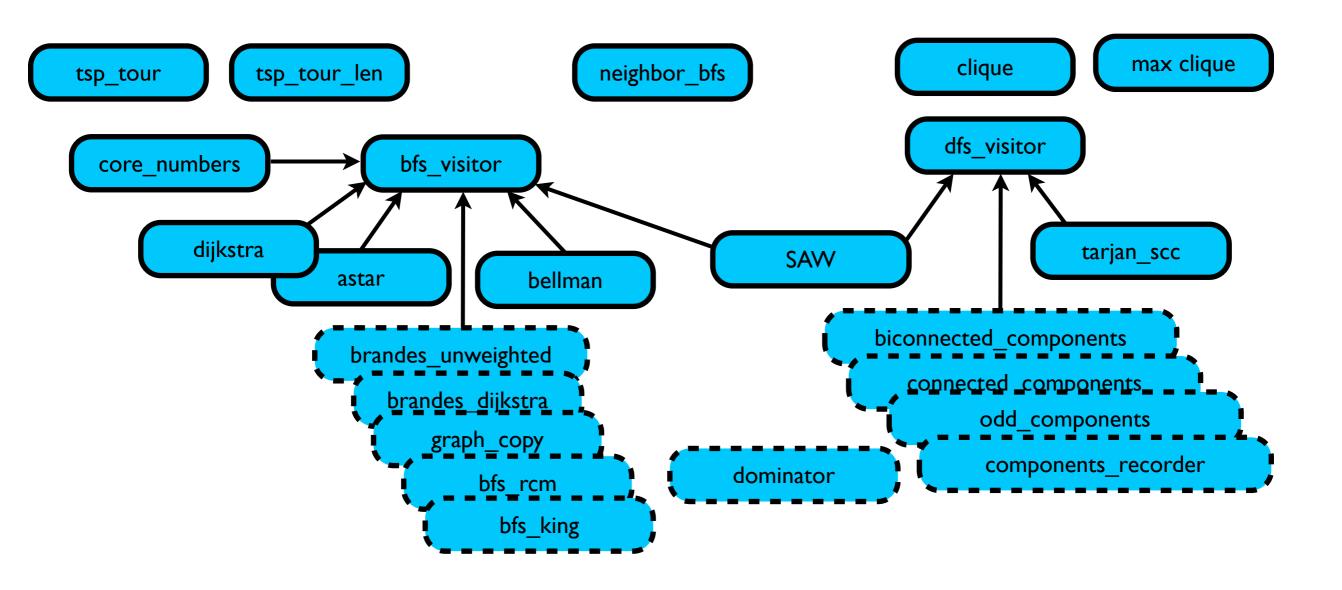
#### library

#### client



```
int main()
{
    using namespace boost;
    adjacency_list<listS, vecS, directedS> g(n_tasks);
    add_{edge(0, 3, g)};
    add_edge(1, 3, g);
    add_edge(1, 4, g);
    add_edge(2, 1, g);
    add_edge(3, 5, g);
    add_edge(4, 6, g);
    add_edge(5, 6, g);
    std::deque<int> topo_order;
    boost::topological_sort(
      g, std::front_inserter(topo_order),
      vertex_index_map(boost::identity_property_map()));
    for (std::deque<int>::iterator i = topo_order.begin();
        i != topo_order.end(); ++i)
    {
      std::cout << tasks[*i] << std::endl;</pre>
    }
}
```

## **BGL Visitor Models**







## Named Parameters

Taming the Savage Beast

# Dijkstra's Algorithm

Parameter	Role	Default		
graph	in		<ul> <li>Most parameters have useful defaults</li> </ul>	
start vertex	in			
weight map	in	interior	<ul> <li>N explicit arguments required if Nth default unsuitable</li> </ul>	
vertex index map	in	interior		
predecessor map	out	discarded		
distance map	out	discarded	<ul> <li>No parameter order can prevent wasted defaults</li> </ul>	
distance combine function	in	closed_plus <d>()</d>		
distance compare function	in	std::less <d>()</d>		
distance infinity constant	in	std::numeric_limits <d>::max()</d>		
distance zero constant	in	D()		
color map	state	<pre>vector<seminibble>(num_vertices(g))</seminibble></pre>		
visitor	in	NOP		



## Dijkstra's Algorithm/ Positional Parameters

```
typedef boost::graph_traits<G>::vertex_descriptor vertex;
std::map<vertex, vertex> p;
std::map<vertex, float> d;
boost::dijkstra_shortest_paths(
  g, start_vertex,
  boost::make_assoc_property_map(p),
  boost::make_assoc_property_map(d),
 get(boost::edge_weight, g), my_index_map,
  std::less<int>(), boost::closed_plus<int>(),
  std::numeric_limits<int>::max(),
 0, my_dijkstra_visitor()
);
```



## Dijkstra's Algorithm/ Named Parameters



## Dijkstra's Algorithm/ Boost.Parameter

Coming Soon(?) to a Boost Release Near You

```
boost::dijkstra_shortest_paths(
   g, start_vertex,
   index_map = my_index_map,
   visitor = my_dijkstra_visitor()
);
```



# Graph Generators: adjacency\_list structure

adjacency\_list<
 OutEdgeList,
 VertexList,
 Directed,
 VertexProperty,
 EdgeProperty,
 GraphProperty,
 EdgeList</pre>

Structure of each vertex's out-edge list

Structure of the "spine"

directedS or undirectedS

adjacency\_matrix<
Directed,
VertexProperty,</pre>

Selector	Container	у, ;у,
vecS	std::vector	
listS	std::list	
slistS	std/tr1::slist	
setS	std::set	
multisetS	std::multiset	
hash_setS	std/tr1::unordered_set	
hash_multisetS	std/tr1::unordered_multiset	Þ٤

# Graph Generators: "bundled" properties

adjacency\_list< OutEdgeList, adjacency\_matrix<</pre> VertexList, Arbitrary per-vertex type Directed, Directed, VertexProperty, VertexProperty, Arbitrary per-edge type EdgeProperty, EdgeProperty, Arbitrary per-graph type GraphProperty, GraphProperty, Allocator> EdgeList



## Interior Property Map Access: get(map\_id,g)

- Maps from modern bundles
  - map\_id is a bundle member pointer, e.g. &EBundle::length
  - or vertex\_bundle/edge\_bundle to access whole bundle
  - Pass explicitly, usually via named parameters:

```
weight_map( get(&EdgeBundle::length, g) )
```

- Otherwise map\_id is a predefined key such as edge\_weight
- Algorithms use some predefined keys to build default property maps:
  - *implicit interior maps*, e.g. vertex\_index\_map of adjacency\_list<..., vecS>
  - old-fashioned "internal properties via property lists"
- No special treatment of other old-fashioned internal properties (e.g. vertex\_name)
- Yes, the overloading of get(...) for this purpose is confusing. Mea culpa.



#### client

#### session



```
#include <boost/graph/adjacency_list.hpp>
#include <boost/graph/dijkstra_shortest_paths.hpp>
template <class G>
void populate(G& g)
{
    typename boost::graph_traits<G>::vertex_descriptor v = add_vertex(g);
    add_edge(v,v,g);
}
struct City
{
    std::string name;
    int population;
    std::vector<int> zipcodes;
};
struct Highway
{
    std::string name;
    double miles;
    int speed_limit;
    int lanes;
    bool divided;
};
```

```
struct City
    std::string name;
    int population;
    std::vector<int> zipcodes;
};
struct Highway
    std::string name;
    double miles;
    int speed_limit;
    int lanes;
    bool divided;
};
std::ostream& operator<<(std::ostream& o, Highway const& h)</pre>
{ return o << h.name << ": " << h.miles << " miles x "</pre>
          << h.lanes << " lanes @ " << h.speed_limit << " kph."; }</pre>
typedef boost::adjacency_list<</pre>
    boost::listS, boost::vecS,
    boost::bidirectionalS,
    City, Highway
> Graph;
```

#### library

#### client

#### session



```
typedef boost::adjacency_list<</pre>
    boost::listS, boost::vecS,
    boost::bidirectionalS,
    City, Highway
> Graph;
int main()
{
    Graph q;
    populate(g); // create vertices and edges
    // Set properties on the first vertex
    Graph::vertex_descriptor v
    = *vertices(g).first;
    g[v].name = "Troy";
    g[v].population = 49170;
    g[v].zipcodes.push_back(12180);
    // Set properties on the first edge
    Graph::edge_descriptor e
    = *out_edges(v, g).first;
    g[e].name = "I-87";
    g[e].miles = 10;
    g[e].speed_limit = 65;
    g[e].lanes = 4;
```

```
g[v].population = 49170;
g[v].zipcodes.push_back(12180);
// Set properties on the first edge
Graph::edge_descriptor e
= *out_edges(v, g).first;
g[e].name = "I-87";
g[e].miles = 10;
g[e].speed_limit = 65;
g[e].lanes = 4;
g[e].divided = true;
std::cout << get(boost::edge_bundle, g)[e] << std::endl;</pre>
std::vector<double> distances(num_vertices(g));
boost::dijkstra_shortest_paths(
  g, *vertices(g).first,
  weight_map( get(&Highway::miles, g) )
  .distance_map(
    make_iterator_property_map(
        distances.begin(), get(boost::vertex_index, g) )
```

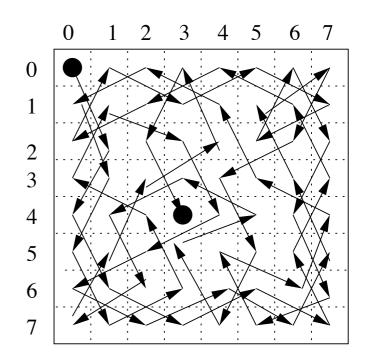


### Exercise

Implicit Graphs: Knight's Tour

## Implicit Graphs

- A graph need not be a concrete data structure
- Inputs to algorithms need only model the necessary graph concepts

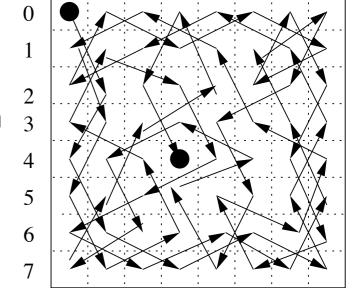


- Example: finding a path for a knight through a chessboard
  - "Knight's Tour Problem," finding a Hamiltonian path
     is NP complete
  - Start with something easier



### Your mission

- NxN chess board for arbitrary N
- Use BGL to find the shortest Knight's path from 0,0 to every other reachable position on the board
- Draw the resulting search tree for a 5x5 board



- Extra credit:
  - Implement a backtracking search for a full tour
  - Look up Warnsdorff's 1823 heuristic and apply it to your backtracking search.
  - How would your graph representation change for solving the real Knight's tour using, say, plain breadth-first search?

