

Survey of Scientific Computing (SciComp 301)

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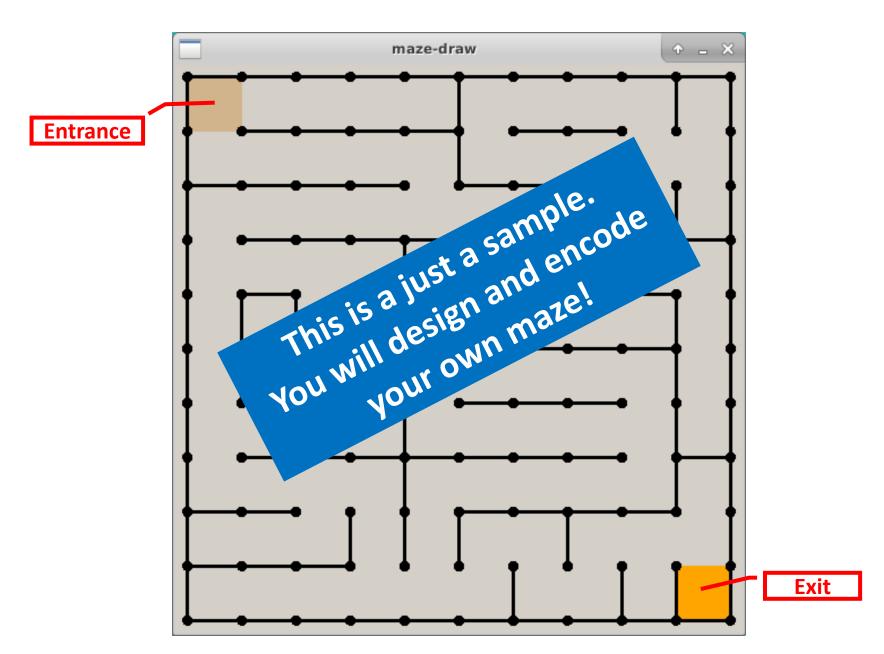
Session 22 Search Algorithms, Adjacency Matrix

Session Goals

- Create a 2D maze on graph paper
- Understand how to encode the cell walls in base 2
- Learn how bitwise operators can decode a wall value
- Perform file input / output using CSV and binary formats
- Appreciate backtracking in depth-first search algorithm
- Implement breadcrumbs using a stack data structure
- Learn how to multiply two matrices
- Create an adjacency matrix to improve search efficiency

Maze Solver

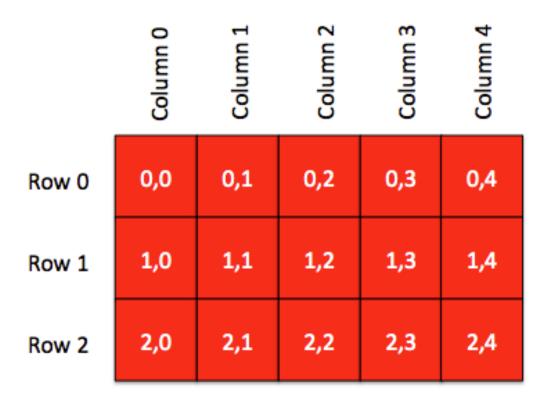
- Write a program that will find a path from the entrance to the exit of a given maze
 - The maze should be created using a simple **encoding**
 - During the search, the program cannot receive any hints from humans – it must run <u>autonomously</u>
- The maze is 10x10 cells, and must have at least one open path from entrance to exit cell
- The complete maze perimeter must not have any holes all outside edges must be walls



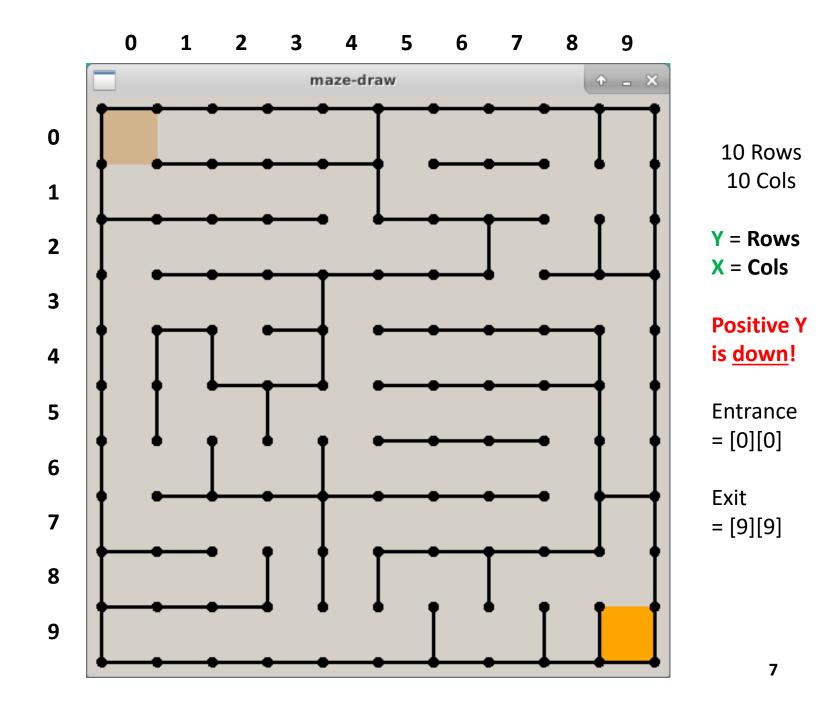
About Matrices

- Matrices are named <u>first</u> by row, then by column
 - A (3 x 2) matrix has 3 rows and 2 columns
- In Cartesian coordinates
 - The abscissa X is listed first, followed by the ordinate Y: (X, Y)
 - Abscissa++ moves the world point right
 - Ordinate++ moves the world point up
- In Matrix coordinates {an array in C++}
 - The row is listed first, followed by the column: [Row] [Col]
 - Row++ moves the cell down (inverted like screen coordinates!)
 - Col-- moves the cell to the previous element in the current Row

About Matrices



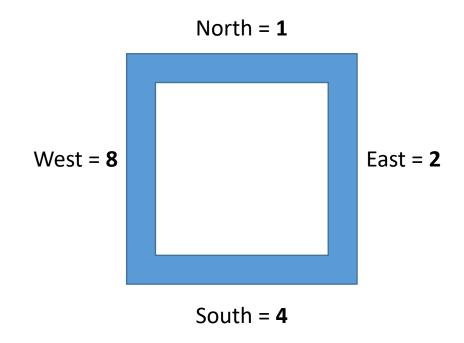
C++ arrays are 0-based



How do we encode a maze?

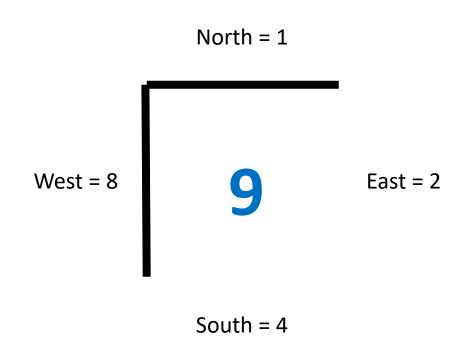
- Consider how to describe each individual square (cell) within the maze
- How can we indicate for each individual cell if a wall exists to the North, East, South, or West direction?

Encode each wall position as an increasing **power of 2**



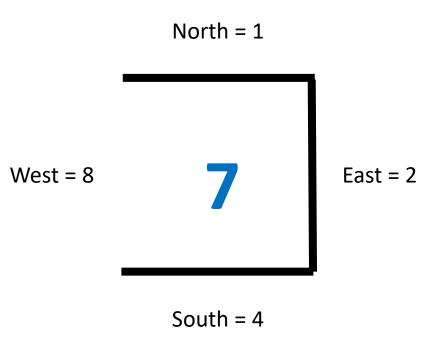
How do we encode a maze?

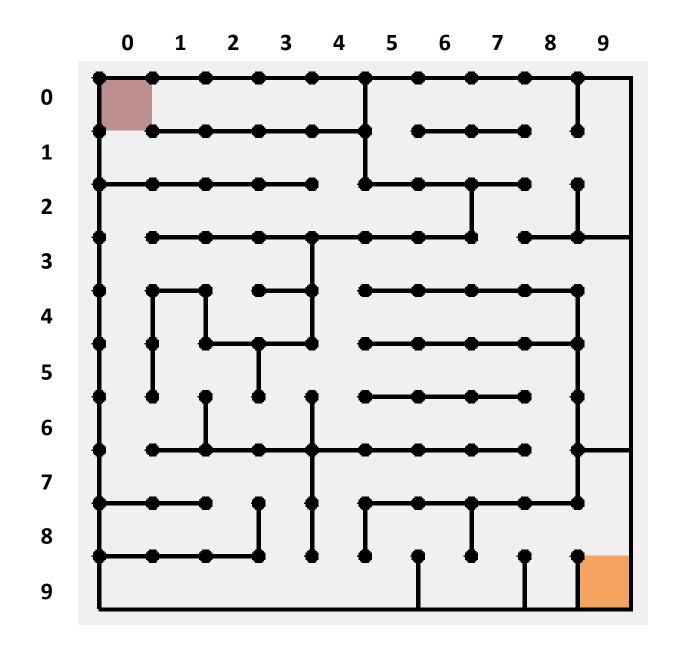
 If a wall exists in a given direction, add the value of that direction to the *total* cell value



How do we encode a maze?

- Using a power of 2 for each wall value produces an unambiguous encoding of all wall permutations
- $0 \le \text{cell value} \le 15$
- No walls = zero (0)
- 15 = a totally "walled-in" cell that is unreachable (Hint: don't make a cell = 15)





		0	1	2	3	4	5	6	7	8	9
0	1	9	5	5	5	7	9	5	5	3	11
1		12	5	5	5	3	12	5	5	0	2
2		9	5	5	5	4	5	7	9	6	14
3		8	5	1	7	9	5	5	4	5	3
4		10	11	12	7	8	5	5	5	7	10
5		10	8	3	9	0	5	5	5	3	10
6		8	6	12	6	12	5	5	5	2	14
7		12	5	1	3	9	5	5	5	6	11
8		13	5	6	10	10	9	3	9	1	2
9		13	5	5	4	4	6	12	6	14	14

Drawing the 2D Maze

- Given a maze initialized with Base 2 wall encodings, how can we draw it?
- We could use a long series of if() statements to test all 16
 possible values for a cell, and draw the required walls
- However, this would be <u>inefficient</u> in code size and run time
- We can take advantage of bitwise AND to figure out what walls to draw for a given cell

Bitwise Operators

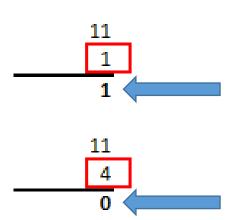
- Logical operators use <u>double</u> ampersand or pipe characters
 - Boolean X and Y conditions: if (X && Y)
 - Boolean X or Y conditions: if (X | | Y)
- Bitwise operators use single ampersand or pipe character
 - Bitwise X and Y values: X & Y
 - Bitwise X or Y values: X | Y
- Logical operators <u>only</u> return true or false
- Bitwise operators return a integer value
 - You normally only perform bitwise operations with byte or int

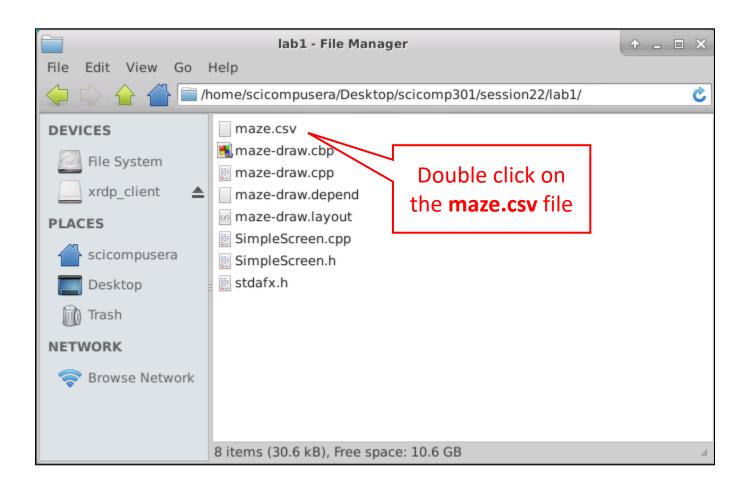
Bitwise AND

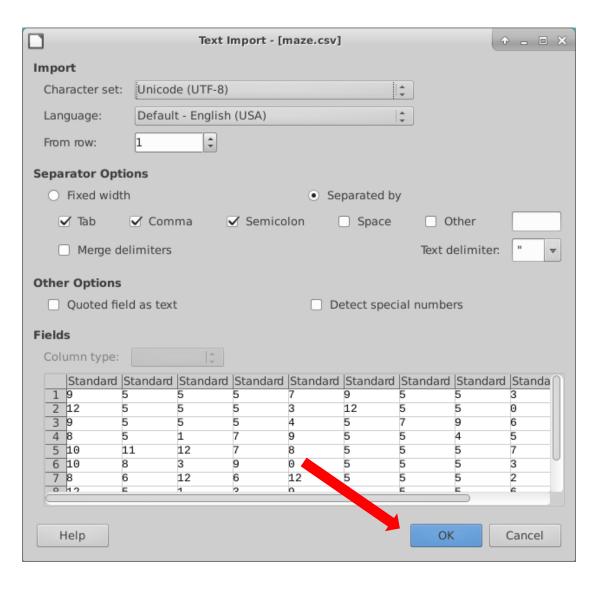
North = 1 West = 8 South = 4 Base₁₀

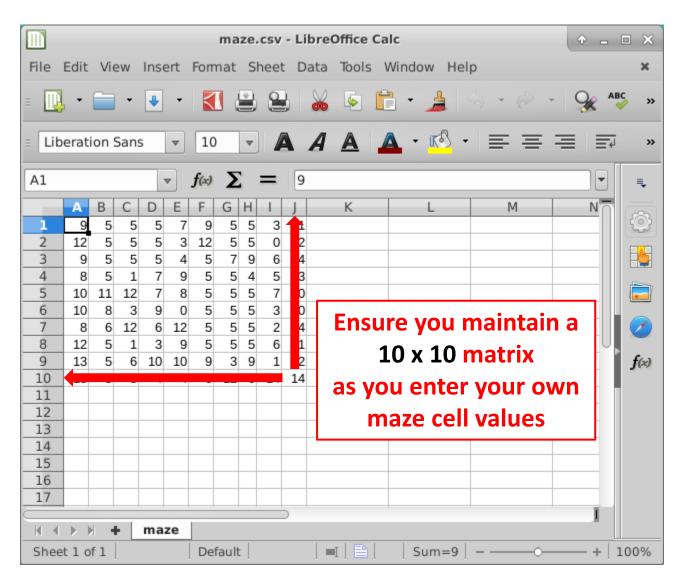
Binary	(Base ₂)	Encoding
--------	----------------------	-----------------

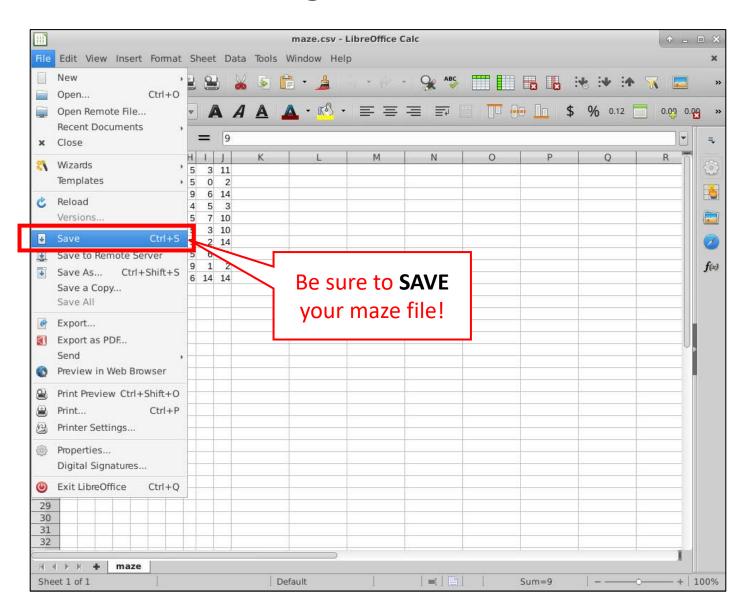
_		2.5	•	
Position	3	2	1	0
Value	8	4	2	1
	1	0	1	1
AND	0	0	0	1
	0	0	0	1
	1	0	1	1
AND	0	1	0	0
	0	0	0	0

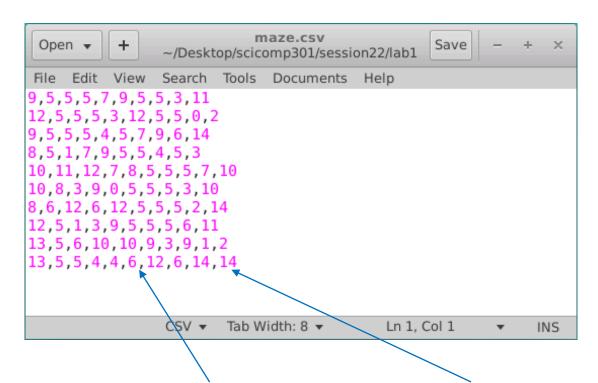








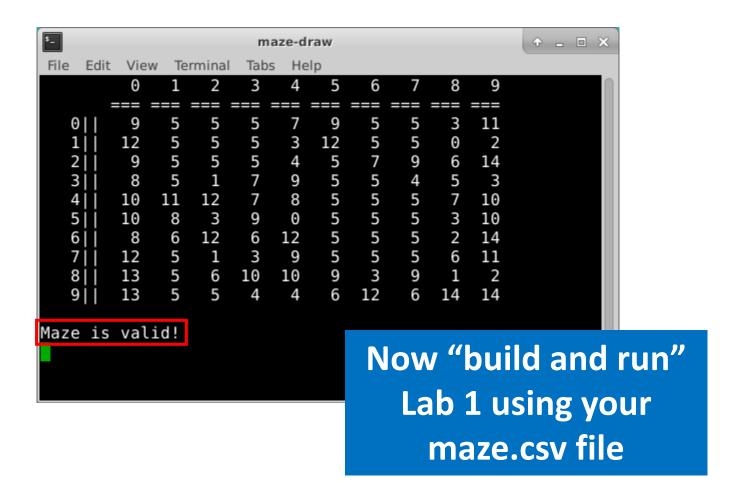




CSV = Comma Separated Values

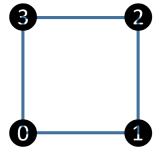
A "formatted" text file

Lab 1 – Maze Draw



```
void draw(SimpleScreen& ss)
    // Draw maze (rows by cols)
    for (int r = 0; r < 10; r++) {
        double y0 = (9 - r) * 45;
        double y1 = (9 - r) * 45 + 45;
        for (int c = 0; c < 10; c++) {
            double x\theta = c * 45:
            double x1 = c * 45 + 45:
            Point2D v0(x0, y0); // Lower-left vertex
            Point2D v1(x1, y0); // Lower-right vertex
            Point2D v2(x1, y1); // Upper-right vertex
            Point2D v3(x0, y1); // Upper-left vertex
            // Draw entrance cell
            if (r == 0 \&\& c == 0)
                ss.DrawRectangle("tan", v0.x, v0.y, 45, 45, 1, true);
            // Draw exit cell
            if (r == 9 && c == 9)
                ss.DrawRectangle("orange", v0.x, v0.y, 45, 45, 1, true);
            // Draw cell corner circles
            ss.DrawCircle(v0.x, v0.y, 2, "black", 5);
            ss.DrawCircle(v1.x, v1.y, 2, "black", 5);
            ss.DrawCircle(v2.x, v2.y, 2, "black", 5);
            ss.DrawCircle(v3.x, v3.v, 2, "black", 5);
            int cell = maze[r][c];
            // Draw north wall if required
            if ((cell & 1) == 1)
                ss.brawLine(v2, v3, "black", 3);
               Draw west wall if required
            if ((cell & 2) == 2)
                ss.brawLine(vi, v2, "black", 3);
            // Draw south wall if required
                ss.DrawLine(v0, v1, "black", 3);
               Draw east wall if required
            if ((cell & 8) == 8)
                ss.prawLine(vo, v3, "black", 3);
```

Lab 1 Maze Draw

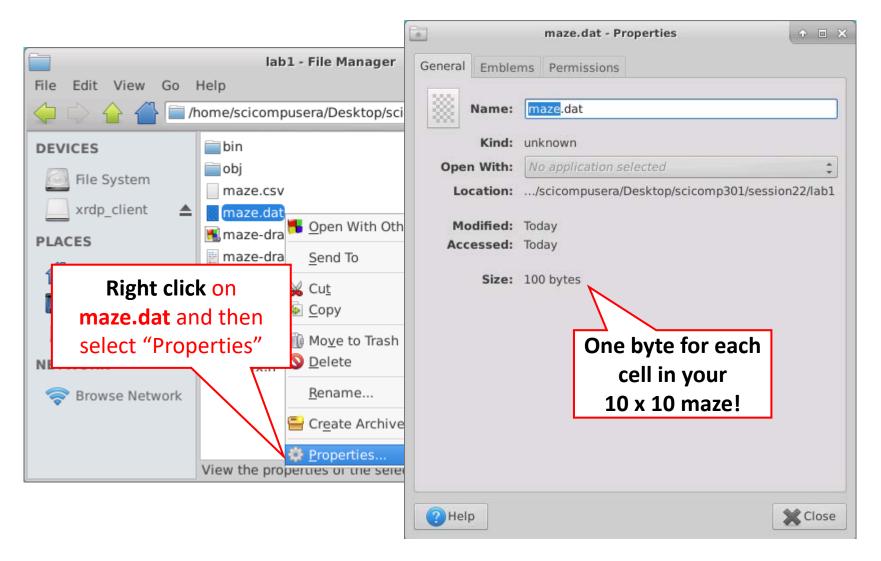


```
struct csv reader : ctype<char>
    csv_reader() : ctype<char>(get_table()) {}
    static ctype base::mask const* get table() {
        static vector<ctype base::mask>
             rc(table size, ctype_base::mask());
        rc[','] = ctype_base::space;
        rc['\n'] = ctype base::space;
        rc[' '] = ctype base::space;
        return &rc[0];
                              int maze[10][10];
                              void LoadMaze()
                                  string line;
                                  stringstream ss;
                                  ss.imbue(locale(locale(), new csv reader()));
                                  ifstream mazeFile("maze.csv");
                                  if (!mazeFile) {
  Reading
                                      cout << "Missing maze.csv file!" << endl;</pre>
                                      exit(-1);
 CSV files
                                  for (int r = 0: r < 10: r++)
                                      getline(mazeFile, line);
                                      ss.str(line);
                                      for (int c = 0; c < 10; c++)
                                         ss >> maze[r][c];
                                      ss.clear();
                                  mazeFile.close();
```

Writing data in BINARY format



Lab 1 – Binary Output File



Lab 1 – Binary Output File

You must copy your maze.dat file to the lab2 and lab3 folders!

Depth-First Search

- Depth-first is a sequential search algorithm
 - It is just you alone in the maze, you have no helpers
 - It is a zero *prior* knowledge, recursive, backtracking approach
 - You have breadcrumbs to mark your cell visitation history
- Order of step search in each cell is North, East, South, West
 - We can only proceed in a direction if there is <u>no</u> wall in the path:

if (cell value & direction) != direction

```
North (1) \rightarrow (\triangle row = -1, \triangle column = 0)

East (2) \rightarrow (\triangle row = 0, \triangle column = 1)

South (4) \rightarrow (\triangle row = 1, \triangle column = 0)

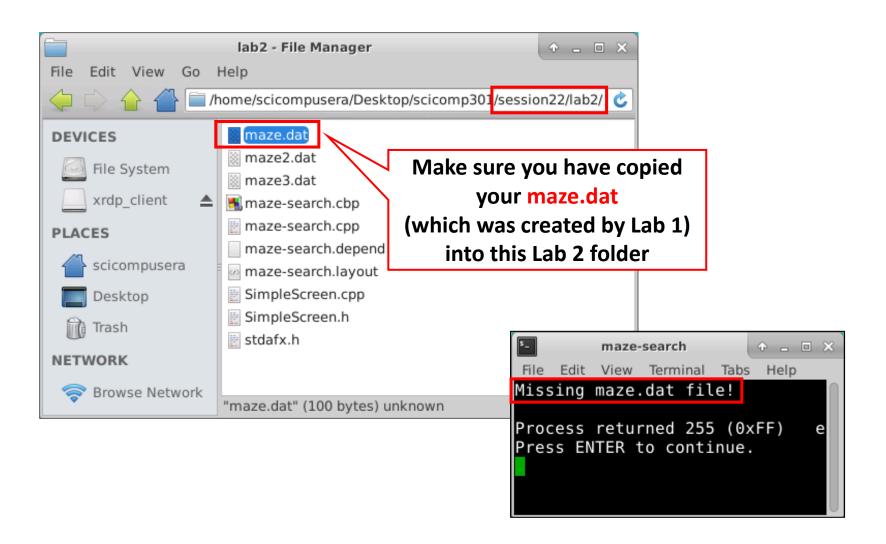
West (8) \rightarrow (\triangle row = 0, \triangle column = -1)
```

Depth-First Search Algorithm

- 1. Drop a breadcrumb as you enter each cell
- Take a step in the very first direction that is open, and go to step #1
- 3. If there are no more open directions in the cell, retrace your steps backwards until you reach a cell with a breadcrumb where the next open direction is one you have <u>not</u> taken yet
- 4. Take a step in that new direction, and go to step #1
- 5. Stop with you reach the exit square

Depth-First Search Breadcrumbs

- A breadcrumb matrix (array) can contain a simple bool value to indicate if you have previously visited this cell
- Breadcrumbs prevent going around in endless circles and never finding the exit
- In this program we use an **bool visitCount** array, so we can color the path according to the number of times we've visited each cell (1=Blue, 2=Green, 3=Red, 4=Orange)
- Lots of red and orange squares in the path indicates an inefficient search pattern, because you are visiting the same node too many times!



```
void LoadMaze()
{
    ifstream mazeFile("maze.dat", ios::binary);
    if (!mazeFile) {
        cout << "Missing maze.dat file!" << endl;
        exit(-1);
    }

    for (int r = 0; r < 10; r++)
        for (int c = 0; c < 10; c++)
        mazeFile.read((char*)&maze[r][c], sizeof(char));

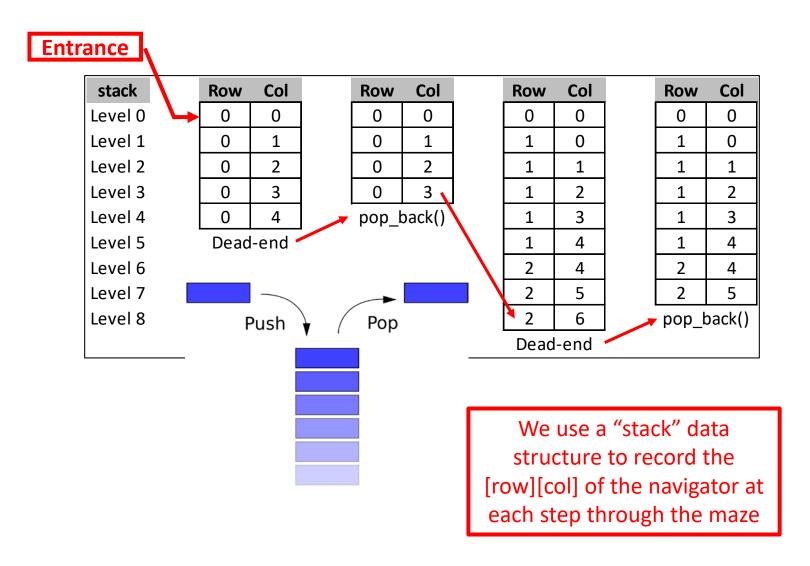
mazeFile.close();
}</pre>
```

Lab2 reads in the binary file maze.dat

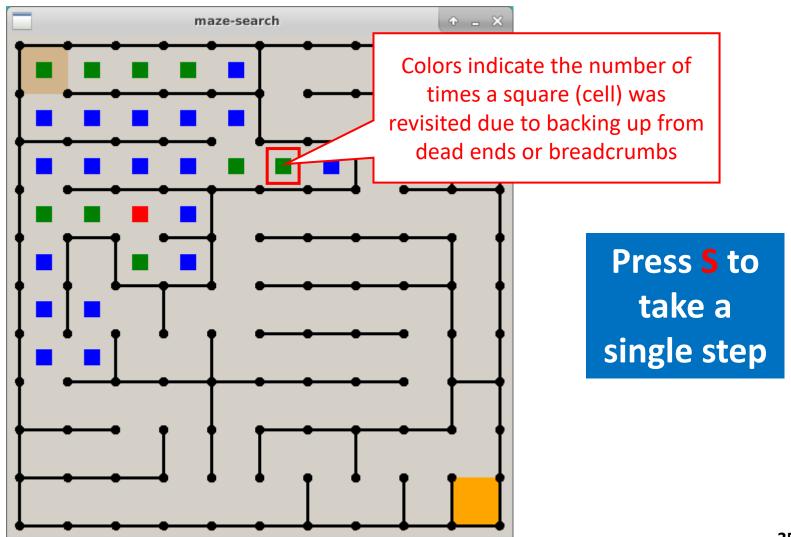
```
bool TakeStep()
    int r = get<0>(stack.back());
    int c = get<1>(stack.back());
    int r2 = r: int c2 = c:
   int dir = get<2>(stack.back());
   if (dir == 1) r2--;
   if (dir == 2) c2++;
   if (dir == 4) r2++:
      (dir == 8) c2--;
    qet<2>(stack.back()) *= 2;
   bool moved = false:
   if (((maze[r][c] & dir) != dir) &&
        visitCount[r2][c2] == 0
        tuple<int, int, int> cell(r2, c2, 1);
        stack.push back(cell);
        moved = true;
   if (dir == 16 && !moved) {
        stack.pop back();
        r2 = qet<0>(stack.back());
        c2 = get<1>(stack.back());
        moved = true;
   if (moved) {
        visitCount[r2][c2]++;
        totalSteps++;
        if (r2 == 9 && c2 == 9)
            foundExit = true;
        return true:
   return false;
```

The program tries to take a step in each direction, updating the visitCount array with each step

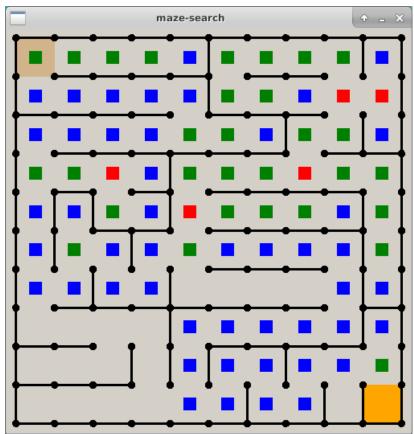
Lab 2 – Maze Draw



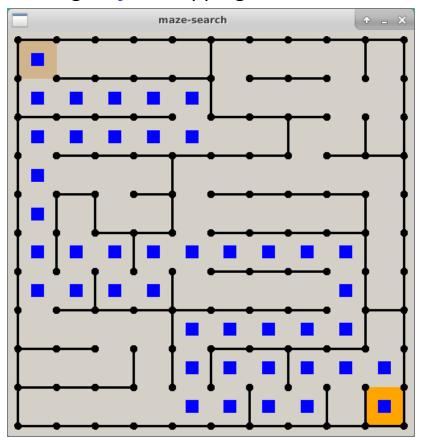
```
Press 5 to
void eventHandler(SimpleScreen& ss, ALLEGRO EVENT& ev)
                                                             take a
   if (ev.type == ALLEGRO EVENT KEY CHAR) {
       if (ev.keyboard.keycode == ALLEGRO KEY S)
                                                          single step
           if (!foundExit) {
               while (!TakeStep());
               if (foundExit) {
                   cout << "Exit found!" << endl
                       << "Total steps = " << totalSteps << endl</pre>
                       << "Path steps = " << stack.size() - 1 << endl;</pre>
                   ResetVisitCount():
                   for (auto s : stack)
                       visitCount[get<0>(s)][get<1>(s)] = 1
                   ss.Clear():
                   DrawMaze(ss);
                                           When the exit is found,
               ss.Redraw():
                                           your path will be shown
                                              (after removing any
                                                  backup steps)
```



Right *before* stepping into exit cell



Right *after* stepping into exit cell



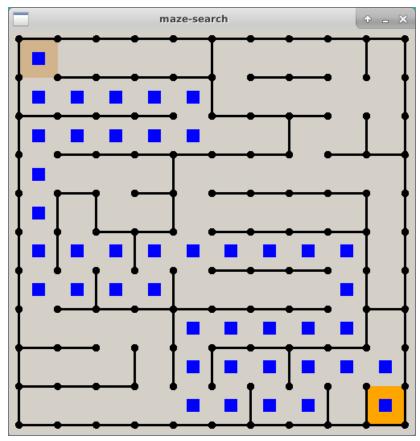
When the exit is found, your path will be shown (after removing any backup steps)

Lab 2 – Maze Search

File Edit View Terminal Tabs Help Exit found! Total steps = 122 Path steps = 42

- Total steps = How many you had to take counting backup steps
- Path steps = The best path you found minus any backup steps

Right *after* stepping into exit cell

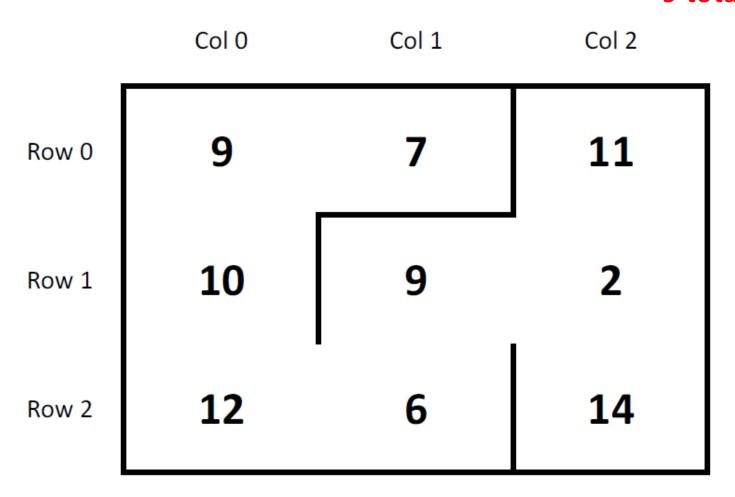


When the exit is found, your path will be shown (after removing any backup steps)

Improving Depth-First Search Efficiency

- The unaided depth-first search spends considerable time exploring paths which clearly are not on the optimal route – it hits a lot of dead ends
- What if we could calculate the shortest path length, and start backtracking the instant our current path length ≥ the shortest path length?
- It is possible to calculate the <u>minimum</u> number of steps from entrance to exit (the shortest path) without searching one cell or taking one step!

3 x 3 maze 9 total cells



Every maze square (cell) is represented along **both** the rows and columns of an adjacency matrix

		Col	0	1	2	0	1	2	0	1	2
		Row	0	0	0	1	1	1	2	2	2
Row	Col		0	1	2	3	4	5	6	7	8
0	0	0	1	1	0	1	0	0	0	0	0
0	1	1	1	1	0	0	0	0	0	0	0
0	2	2	0	0	1	0	0	1	0	0	0
1	0	3	1	0	0	1	0	0	1	0	0
1	1	4		0	0	0	1	1	0	1	0
1	2	5	0	0	1	0	1	1	0	0	1
2	0	6	0	0	0	1	0	0	1	1	0
2	1	7	0	0	0	0	1	0	1	1	0
2	2	8	0	0	0	0	0	1	0	0	1

A true (1) indicates you can reach the other cell in just one step A false (0) means that you cannot reach the other cell in just one step

The main diagonal has all one values because every cell can reach itself by definition

		Col	0	1	2	0	1	2	0	1	2
		Row	0	0	0	1	1	1	2	2	2
Row	Col		0	1	2	3	4	5	6	7	8
0	0	0	1	1	0	1	0	0	0	0	0
0	1	1	1	1	0		0	0	0	0	0
0	2	2	0	0	1		0	1	0	0	0
1	0	3	1_	0	0	1	0	0	1	0	0
1	1	4		0	0	0	1	1	0	1	0
1	2	5	0	0	1	0	1	1	0	0	1
2	0	6	0	0	0	1	0	0	1	1	0
2	1	7	0	0	0	0	1	0	1	1	0
2	2	8	0	0	0	0	0	1	0	0	1

The whole matrix is symmetric about the main diagonal because there are no "one-way" doors in the maze.

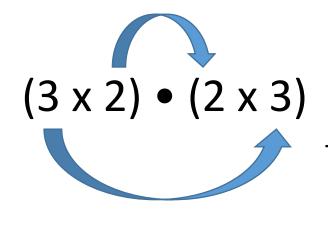
Reflexive Property: If you can get from cell A to cell B in one step, then you can also get from cell B to cell A in one step

- To find the shortest path, we keep ANDing (using the logical operator &&) the adjacency matrix against itself until a true value appears in the matrix element that represents the exit cell
- The <u>number of times</u> we had to "multiply" (AND) the adjacency matrix by itself equals the minimal # of steps from entrance to exit
- Ironically, we can know the # of steps in the shortest path, but not what the actual steps are!
- But how do we multiple two matrices together?

- In order to multiply 2-D matrices together the number of columns in matrix A must equal the number of rows in matrix B (Cols A = Rows B)
- The resulting matrix will have as many rows as there were <u>rows</u> in matrix **A**, and as many <u>columns</u> as there were in matrix **B** (Rows **A** x Cols **B**)

- Example
 - Matrix A has dimension (3 x 2) = 3 rows, 2 columns
 - Matrix B has dimension (2 x 3) = 2 rows, 3 columns

These values must match!



These two values will be the dimension of the matrix product!

- Matrix multiplication is not commutative!
 - If we multiple B x A we will get a different matrix than if we multiple A x B
 - Very strange catches even great physicists by surprise!
 - $(3 \times 2) \cdot (2 \times 3) = \text{result is a } (3 \times 3) \text{ matrix}$
 - $(2 \times 3) \cdot (3 \times 2) = \text{result is a } (2 \times 2) \text{ matrix}$
- Welcome to the world of non-commutative algebra!
 - This asymmetry is the foundation of the matrix formulation of quantum mechanics

- The algorithm is simple but tedious for A x B = C
- Sum the product of every element in each <u>row</u> of matrix A multiplied by the corresponding element in each column of matrix B
- That sum becomes one element in new matrix C
- Continue this process for all rows in matrix A
 - Every row in A gets multiplied by every column in B
 - Output matrix has dimensions (Rows A x Cols B)

Matrix A

(2 rows x 3 cols)

Matrix B

(3 rows x 2 cols)

_	Col 1	Col 2	Col 3
Row 1	4	5	8
Row 2	1	9	7

x

	Col 1	Col 2
Row 1	2	4
Row 2	6	1
Row 3	5	9

Product Cell (1,1) = A Row 1 x B Col 1 =
$$(4 \times 2 + 5 \times 6 + 8 \times 5) = 78$$

Matrix C

78	93
91	76

Matrix A

(2 rows x 3 cols)

Matrix B

(3 rows x 2 cols)

Col 2

4

1

_	Col 1	Col 2	Col3	
Row 1	4	5	8	
Row 2	1	9	7	

Row 1 2 Row 2 6

Row 3 **5 9**

Col 1

Matrix C

(2 rows x 2 20ls)

78 🖊	93
91	76

Matrix A

(2 rows x 3 cols)

Matrix B

(3 rows x 2 cols)

_	Col 1	Col 2	Col3	
Row 1	4	5	8	
Row 2	1	9	7	

F

_	Col 1	(Col 2	
ow 1	2		4	
ow 2	6		1	
ow 3	5		9	

Product Cell (1,1) = A Row 1 x B Col 1 =
$$(4 \times 2 + 5 \times 6 + 8 \times 5) = 78$$

Product Cell (2,1) = A Row 1 x B Col 2 = (4 x 4 + 5 x 1 + 8 x 9) = 93

Product Cell (1,2) = A Row 2 x B Col 1 = $(1 \times 2 + 9 \times 6 + 7 \times 5) = 91$

Product Cell (2,2) = A Row 2 x B Col 2 = (1 x 4 + 9 x 1 + x 9) = 76

Matrix C

78	93 🦊
91	76

Matrix A

(2 rows x 3 cols)

Matrix B

(3 rows x 2 cols)

	Col 1	Col 2	Col 3
Row 1	4	5	8
Row 2	1	9	7

x

	Col 1			Col 2
Row 1		2		4
Row 2		6		1
Row 3		5		9

Product Cell
$$(1,1)$$
 = A Row 1 x B Col 1 = $(4 \times 2 + 5 \times 6 + 8 \times 5)$ = 78

Product Cell (1,2) = A Row 2 x B Col 1 =
$$(1 \times 2 + 9 \times 6 + 7 \times 5) = 91$$

Product Cell (2,2) = A Row 2 x B Col 2 =
$$(1 x 4 + 9 x 1 + 7 x 3) = 76$$

Matrix C

78	53
91	76

Matrix A

(2 rows x 3 cols)

Matrix B

(3 rows x 2 cols)

_	Col 1	Col 2	12 Col3	
Row 1	4	5	8	
Row 2	1	9	7	

x

	Col 1	Col 2	2
Row 1	2	4	
Row 2	6	1	
Row 3	5	9	

Product Cell (1,2) = A Row 2 x B Col 1 =
$$(1 \times 2 + 9 \times 6 + 7 \times 5) = 91$$

Product Cell (2,2) = A Row 2 x B Col 2 = $(1 \times 4 + 9 \times 1 + 7 \times 9) = 76$

Matrix C

1= .0	~ = 00.12 /
78	93
91	76

- If it is true you can get from A to B, and it is true you can get from B to C, then it must be true that you can get from A to C (transitive property)
- When "multiplying" bool adjacency matrices, if the AND of all the elements in (Row A x Col B) is == true then the cell is set to true
 - We keep multiplying the adjacency matrix until a true appears in the cell that represents the <u>exit</u> square.
 - The total # of matrix multiplications required = the shortest path length from entrance to exit

- We can calculate the adjacency matrix before starting a depth-first search. We can then use this shortest path length to limit the current search path to improve the efficiency of the search
- Once the current stack.size() has more levels than the shortest path length calculated from the adjacency matrix, start back tracking!
- There is no reason to continue on a path which has a step count greater than the known shortest path
 - it's best to backup and try a new direction

Lab 3 – Maze Search

Lab 2 – Maze Search w/o Adj Matrix

```
int main()
{
    LoadMaze();
    ResetVisitCount();

    tuple<int, int, int> entrance(0, 0, 1);
    stack.push_back(entrance);
    visitCount[0][0] = 1;

    SimpleScreen ss(draw, eventHandler);
    ss.SetZoomFrame("white", 3);
    ss.SetWorldRect(-10, -10, 460, 460);

    DrawMaze(ss);

    ss.HandleEvents();
    return 0;
}
```

Lab 3 – Maze Search w Adj Matrix

```
int main()
{
    LoadMaze();
    ResetVisitCount();

    AdjMatrix adj;
    adj.Init(maze);
    minSteps = adj.MinSteps();

    tuple<int, int, int> entrance(0, 0, 1);
    stack.push_back(entrance);
    visitCount[0][0] = 1;

    SimpleScreen ss(draw, eventHandler);
    ss.SetZoomFrame("white", 3);
    ss.SetWorldRect(-10, -10, 460, 460);

    DrawMaze(ss);

    ss.HandleEvents();
    return 0;
}
```

The variable minSteps holds the # of steps in the shortest path from entrance to exit

Lab 3 – Maze Search

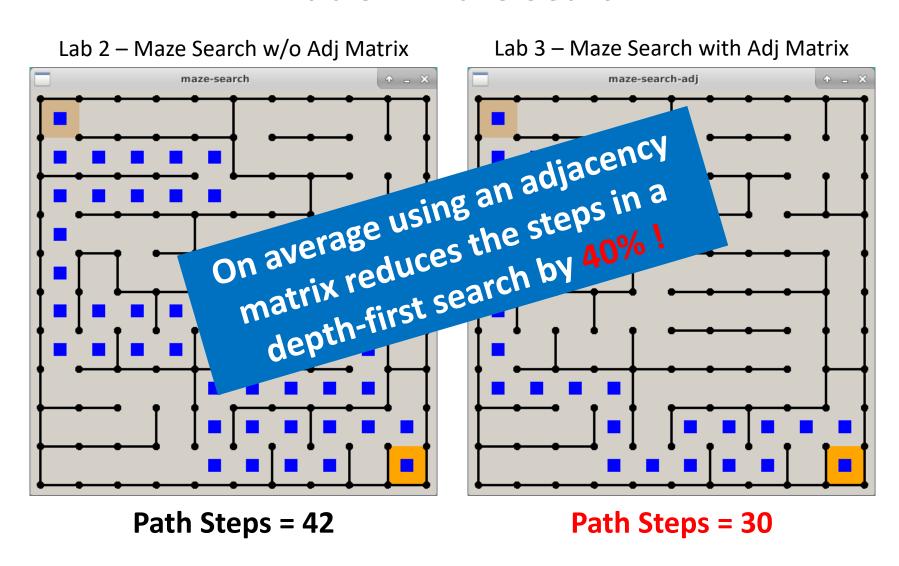
Lab 2 – Maze Search w/o Adj Matrix

```
bool TakeStep()
    int r = get<0>(stack.back());
    int c = get<1>(stack.back());
    int r2 = r; int c2 = c;
    int dir = get<2>(stack.back());
    if (dir == 1) r2--;
    if (dir == 2) c2++;
    if (dir == 4) r2++:
    if (dir == 8) c2--:
    get<2>(stack.back()) *= 2;
    bool moved = false:
    if (((maze[r][c] & dir) != dir) &&
        visitCount[r2][c2] == 0
        tuple<int, int, int> cell(r2, c2, 1);
        stack.push back(cell);
        moved = true;
    if (dir == 16 && !moved) {
        stack.pop back();
        r2 = get<\theta>(stack.back());
        c2 = get<1>(stack.back());
        moved = true;
    if (moved) {
        visitCount[r2][c2]++;
        totalSteps++;
        if (r2 == 9 && c2 == 9)
            foundExit = true:
        return true:
    return false;
```

Lab 3 – Maze Search w Adj Matrix

```
bool TakeStep()
    int r = get<0>(stack.back());
    int c = get<1>(stack.back());
    int r2 = r; int c2 = c;
    int dir = get<2>(stack.back());
    if (dir == 1) r2--;
    if (dir == 2) c2++;
    if (dir == 4) r2++:
    if (dir == 8) c2--:
    get<2>(stack.back()) *= 2;
    bool moved = false:
    if (((maze[r][c] & dir) != dir) &&
        (visitCount[r2][c2] == 0) \&\&
       (stack.size() <= minSteps))</pre>
        tuple<int, int, int> cell(r2, c2, 1);
        stack.push back(cell):
        moved = true:
    if (dir == 16 && !moved) {
        stack.pop back();
        r2 = qet<0>(stack.back());
        c2 = get<1>(stack.back());
        moved = true:
    if (moved) {
        visitCount[r2][c2]++;
        totalSteps++;
        if (r2 == 9 && c2 == 9)
            foundExit = true:
        return true;
    return false;
```

Lab 3 – Maze Search



Now you know...

- How to encode 2D maze walls in base 2
 - In C++ an [Y][X] matrix means there are Y rows and X columns
 - The bitwise AND (&) operator can decode wall values
- Depth-first search is implemented with recursion or a stack
 - You <u>must</u> use a <u>breadcrumbs</u> array to prevent infinite loops
- A logical adjacency matrix can be used to calculate the length of the shortest path from entrance to exit
 - However, the adjacency matrix <u>will not</u> identify the actual steps along that shortest path
 - Leveraging the adjacency matrix during a depth-first search will yield on average a ~40% improvement in the efficiency of the search