



COMP 4303

Video Game AI

Lecture 15

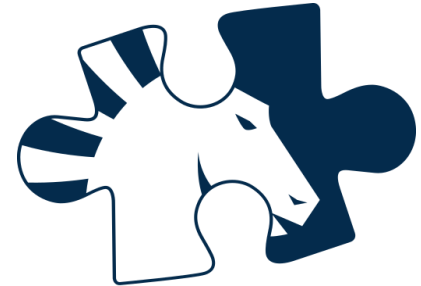
Intro to StarCraft

BWAPI – Brood War API

Intro to Starcraft AI

Starcraft / BWAPI Links

- BWAPI API Documentation
 - <https://bwapi.github.io/annotated.html>
 - https://bwapi.github.io/class_b_w_a_p_i_1_1_game.html
 - https://bwapi.github.io/class_b_w_a_p_i_1_1_unit_type.html
 - https://bwapi.github.io/class_b_w_a_p_i_1_1_unit_interface.html
- Liquipedia Articles
 - https://liquipedia.net/starcraft/Main_Page
 - <https://liquipedia.net/starcraft/StarCraft>
 - <https://liquipedia.net/starcraft/Definitions>
 - <https://liquipedia.net/starcraft/Units>
 - <https://liquipedia.net/starcraft/Buildings>
 - <https://liquipedia.net/starcraft/Portal:Beginners>



StarCraft

- Blizzard - 1998
- Best Selling RTS of all time
- Millions of players worldwide
- Professionally played - 2001
- BroodWar C++ API (BWAPI)
 - Read StarCraft Memory
 - Issue Commands to Game



Real-Time Strategy

- War-like Simulation
- Single / Multiplayer Games

- Most RTS Games:
 - Gather Resources
 - Build Town / Army
 - Combat With Enemies



Starcraft Strategy

- 3 main categories of strategy in RTS
- **Attack** (Rush / Aggressive)
 - Attack your enemy early in the game
- **Defend** (Turtle / Bunker)
 - Build defenses to fend off attacks
- **Expand** (Econ / 2nd Base)
 - Build early expansion for more income
- Rock-Paper-Scissors Effect
 - Attack > Expand > Defend > Attack ...



TERRAN

Dominate the battlefield with superior firepower

ENTER >



PROTOSS

Annihilate your enemies with psionic powers and advanced technologies

ENTER >



ZERG

Overrun entire planets with the unyielding might of the Swarm

ENTER >

Terran



- 'Human' like race, likes mech units
- Buildings can lift and be re-placed, have addons
- Early game unit: Marine
 - Low hp, ranged attack / hits flying
 - Good all game, Medic can heal them
- Mid game unit: Siege Tank
 - Siege mode – can't move but attacks far
- Late game unit: Battlecruiser
 - Huge flying ship, loads of hp



Protoss



- Civilized alien race, expensive units
- Units have shields that regenerate
- Buildings require 'power' from pylons
- Early game units: Zealot / Dragoon
 - Zealot: Tanky melee unit
 - Dragoon: Tanky ranged unit
- Mid game unit: High Templar
 - Casts psionic storm, aoe damage
- Late game unit: Carrier
 - Huge flying ship, shoots out smaller ships



Zerg



- Uncivilized alien race, make many units
- Units regenerate HP, morph / eggs
- Must build buildings on `creep`
- Early game units: Zergling
 - Very cheap, fast, can rush easily
- Mid game unit: Mutalisk
 - Fast moving flying unit, micro heavy
- Late game unit: Ultralisk / Devourer
 - Ultralist: Huge tanky melee unit
 - Devourer: Spell caster / dark swarm



Example Terran Game

- Keep making workers until 9
- Make a supply depot (increase supply)
- Make workers until you have 12
- Make 2 barracks (produces marines)
- Keep making marines / workers / supply
- Attack when you have 12 marines



What is a Build-Order?

- Sequence of economic actions
- List of buildings / units to build in order
- Players memorize 'opening books'



Build Order

[https://liquipedia.net/starcraft/2_Rax_FE_\(vs._Zerg\)](https://liquipedia.net/starcraft/2_Rax_FE_(vs._Zerg))

- 9/10 - Supply Depot
- 11/18 - Barracks
- 13/18 - Barracks
- 14/18 - Supply Depot
- 18/26 - Refinery
- 19/26 - Academy
- 24/26 - Supply Depot
- 26/34 - Stim Pack
- 28/34 - Comsat Station

Build-Order Problems

- What army to construct?
- How to predict enemy army based on current observation?
- Where to place buildings?

- Example: use human knowledge or machine learning to predict enemy composition

Brood War API (BWAPI)

- Used to talk to Starcraft with C++
- Injects a .dll into the Starcraft process
- Communicates with your C++ program
- When game starts, BWAPI connects
- BWAPI records events, triggers your code
 - onStart(), onFrame(), onUnitDestroy()
- When game is over, BWAPI disconnects

```
while (BWAPI::BWAPIClient.isConnected() && BWAPI::Broodwar->isInGame())
{
    // Handle each of the events that happened on this frame of the game
    for (const BWAPI::Event & e : BWAPI::Broodwar->getEvents())
    {
        switch (e.getType())
        {
            case BWAPI::EventType::MatchStart:      { bot.onStart();           break; }
            case BWAPI::EventType::MatchFrame:      { bot.onFrame();           break; }
            case BWAPI::EventType::MatchEnd:        { bot.onEnd(e.isWinner()); break; }
            case BWAPI::EventType::UnitShow:        { bot.onUnitShow(e.getUnit()); break; }
            case BWAPI::EventType::UnitHide:        { bot.onUnitHide(e.getUnit()); break; }
            case BWAPI::EventType::UnitCreate:      { bot.onUnitCreate(e.getUnit()); break; }
            case BWAPI::EventType::UnitMorph:       { bot.onUnitMorph(e.getUnit()); break; }
            case BWAPI::EventType::UnitDestroy:     { bot.onUnitDestroy(e.getUnit()); break; }
            case BWAPI::EventType::UnitRenegade:    { bot.onUnitRenegade(e.getUnit()); break; }
            case BWAPI::EventType::UnitComplete:    { bot.onUnitComplete(e.getUnit()); break; }
            case BWAPI::EventType::SendText:        { bot.onSendText(e.getText()); break; }
        }
    }

    BWAPI::BWAPIClient.update();
    if (!BWAPI::BWAPIClient.isConnected())
    {
        std::cout << "Disconnected\n";
        break;
    }
}
```

STARTcraft

- StarterBot for C++ / BWAPI
- Easy to set up / use (3 minutes)
- Self-documenting code tutorial
- <https://github.com/davechurchill/STARTcraft>

Starcraft Unit Commands

- Each unit can be given commands
- Cannot control enemy units
- Unit command examples
 - Move, Attack, Patrol, Build, Stop
- Unit commands take parameters
 - Move(pos), Attack(unit), Build(type, pos)
- Let's look at BWAPI examples

```
1. // https://bwapi.github.io/class\_b\_w\_a\_p\_i\_1\_1\_unit\_interface.html
2. void unitCommands(BWAPI::Unit unit)
3. {
4.     BWAPI::Position desiredPosition(400, 300);
5.     unit->move(desiredPosition);
6.     unit->rightClick(desiredPosition);
7.     unit->attackMove(desiredPosition);
8.     unit->patrol(desiredPosition);
9.     BWAPI::Unit enemyUnit = getEnemyUnitTarget();
10.    unit->attack(enemyUnit);
11.    unit->rightClick(enemyUnit);
12.    unit->burrow() // Zerg units with burrowing
13.    unit->stop();
14. }
```


Starcraft Unit Properties

- Each Unit has a number of properties
- Unit **Instance** properties - [BWAPI::Unit](#)
 - Position, Health, Shields, Player, **UnitType**
- Unit **Type** properties - [BWAPI::UnitType](#)
 - MaxHealth, Damage, WeaponType, Flying
 - MaxSpeed, Acceleration, Size
 - MineralPrice, GasPrice, Supply, VisionRadius

Protoss Unit Properties

Unit	Size	Pop	Minerals	Gas	Armor	HP	Shield	Ground Attack	Air Attack	Cooldown	Range	Attack Mod	Sight	Notes	Build Time
Arbiter	L	4	100	350	1	200	150	10e	10e	45	5	1	9	S	160
Archon	L	4	0 (100)	0 (300)	0	10	350	30s	30s	20	2	3	8		20
Carrier	L	6	350	250	4	300	150	6	6		8	1	11		140
Corsair	M	2	150	100	1	100	80	0	5es	8	5	1	9	S	40
Dark Archon	L	4	0 (250)	0 (200)	1	25	200	0	0		0	0	10	S	20
Dark Templar	S	2	125	100	1	80	40	40	0	30	1	3	7	C	50
Dragoon	L	2	125	50	1	100	80	20e	20e	30	4/6	2	8		50
High Templar	S	2	50	150	0	40	40	0	0		0	0	7	S	50
Observer	S	1	25	75	0	40	20	0	0		0	0	9/11	D,C	40
Photon Cannon	L	0	150	0	0	100	100	20	20	22	7	0	11	D	50
Probe	S	1	50	0	0	20	20	5	0	22	1	0	8		20
Reaver	L	4	200	100	0	100	80	100s/125s	0	60	8	0	10		70
Scout	L	3	275	125	0	150	100	8	28e	30/22	4	1/2	8/10		80
Shuttle	L	2	200	0	1	80	60	0	0		0	0	8		60
Zealot	S	2	100	0	1	100	60	16	0	22	1	2	7		40

Terran Unit Properties

Unit	Size	Pop	Minerals	Gas	Armor	HP	Ground Attack	Air Attack	Cooldown	Range	Attack Mod	Sight	Notes	Build Time
Battlecruiser	L	6	400	300	3	500	25	25	30	6	3	11	S	133
Dropship	L	2	100	100	1	150	0	0		0	0	8		50
Firebat	S	1	50	25	1	50	16cs	0	22/11stim	2	2	7	B	24
Ghost	S	1	25	75	0	45	10c	10c	22	7	1	9/11	S,B	50
Goliath	L	2	100	50	1	125	12	20e	22	5/8	1/4	8		40
Marine	S	1	50	0	0	40	6	6	15/7.5stim	4/5	1	7	B	24
Medic	S	1	50	25	1	60	0	0		0	0	9	S,B	30
Missile Turret	L	0	75	0	0	200	0	20e	15	7	0	11	D	30
Science Vessel	L	2	100	225	1	200	0	0		0	0	10	D,S	80
SCV	S	1	50	0	0	60	5	0	15	1	0	7		20
Siege Tank	L	2	150	100	1	150	30e/70es	0	37/75	7/12	3/5	10		50
Valkyrie	L	3	250	125	2	200	0	6es	64	6	1	8		50
Vulture	M	2	75	0	0	80	20c	0	30	5	2	8	S	30
Wraith	L	2	150	100	0	120	8	20e	30/22	5	1/2	7	S	60

Zerg Unit Properties

Unit	Size	Pop	Minerals	Gas	Armor	HP	Ground Attack	Air Attack	Cooldown	Range	Attack Mod	Sight	Notes	Build Time
Broodling	S	0	0	0	0	30	4	0	15	1	1	5	B	0
Cocoon	L	2	0	0	0	200	0	0		0	0	4	B	0
Defiler	M	2	50	150	1	80	0	0		0	0	10	B,S	50
Devourer	L	2	+150	+50	2	250	0	25e	100	6	2	10	B	40
Drone	S	1	50	0	0	40	5	0	22	1	0	7	B	20
Egg	L	0	0	0	10	200	0	0		0	0	4	B	0
Guardian	L	2	+50	+100	2	150	20	0	30	8	2	11	B	40
Hydralisk	M	1	75	25	0	80	10e	10e	15	4/5	1	6	B	28
Infested Terran	S	1	100	50	0	60	500es	0		1	0	5	B	40
Larva	S	0	0	0	10	25	0	0		0	0	4	B	20
Lurker	M	2	+50	+100	1	125	20s	0	37	6	2	8	B	40
Mutalisk	S	2	100	100	0	120	9	9	30	3	1	7	B	40
Overlord	L	0	100	0	0	200	0	0		0	0	9/11	B,D	40
Queen	M	2	100	100	0	120	0	0		0	0	10	B,S	50
Scourge	S	0.5	12	38	0	25	0	110		1	0	5	B	30
Spore Colony	L	0	+50	0	0	400	0	15	15	7	0	10	D	20
Sunken Colony	L	0	+50	0	2	300	40e	0	32	7	0	10		20
Ultralisk	L	4	200	200	1/3	400	20	0	15	1	3	7	B	60
Zergling	S	0.5	25	0	0	35	5	0	8/6	1	1	5	B	28

Starcraft Unit Sizes

- Starcraft unit size and movement in pixels





```
1. void importantClasses()  
2. {  
3.     // Starcraft unit structure, access all unit instance info  
4.     BWAPI::Unit unit = nullptr;  
5.     // Unit's type, ie: Marine, Zergling, Nexus, etc  
6.     BWAPI::UnitType type = unit->getType();  
7.     // Starcraft game instance object, get all info from here  
8.     int frame = BWAPI::Broodwar->getFrameCount()  
9.     // Player object, access to all player info  
10.    BWAPI::Player me = BWAPI::Broodwar->self();  
11.    // Position object, where is a unit?  
12.    BWAPI::Position p = unit->getPosition();  
13. }
```



```
1. void unitExamples()  
2. {  
3.     for (auto unit : BWAPI::Broodwar->getAllUnits())  
4.     {  
5.         BWAPI::Position p = unit->getPosition();  
6.         BWAPI::Player pl  = unit->getPlayer();  
7.         bool myUnit      = (pl == BWAPI::Broodwar->self());  
8.         int currentHP    = unit->getHitPoints()  
9.         BWAPI::UnitType t = unit->getType();  
10.        int groundDamage  = t.groundWeapon().damageAmount();  
11.        bool isWorker     = t.isWorker();  
12.        bool isProbe      = (t == BWAPI::UnitTypes::Protoss_Probe);  
13.    }  
14. } // BWAPI::Unit acts like a pointer, can be copied efficiently
```

Starcraft Resource Gathering

- In order to build units, you first need to gather resources with your workers
- This is easy for a human
- How to do it with a bot?
 1. Find closest mineral
 2. Find worker who is free
 3. Send worker to mine



```
1. // send all idle workers to gather minerals
2. void gatherMinerals()
3. {
4.     for (auto unit : BWAPI::Broodwar->self()->getUnits())
5.     {
6.         if (!unit->getType().isWorker()) { continue; }
7.         if (!unit->isIdle())           { continue; }
8.         BWAPI::Unit mineral = getClosestMineral(unit);
9.         unit->rightClick(mineral);
10.    }
11. }
12. // unit will continue to mine until interrupted
```

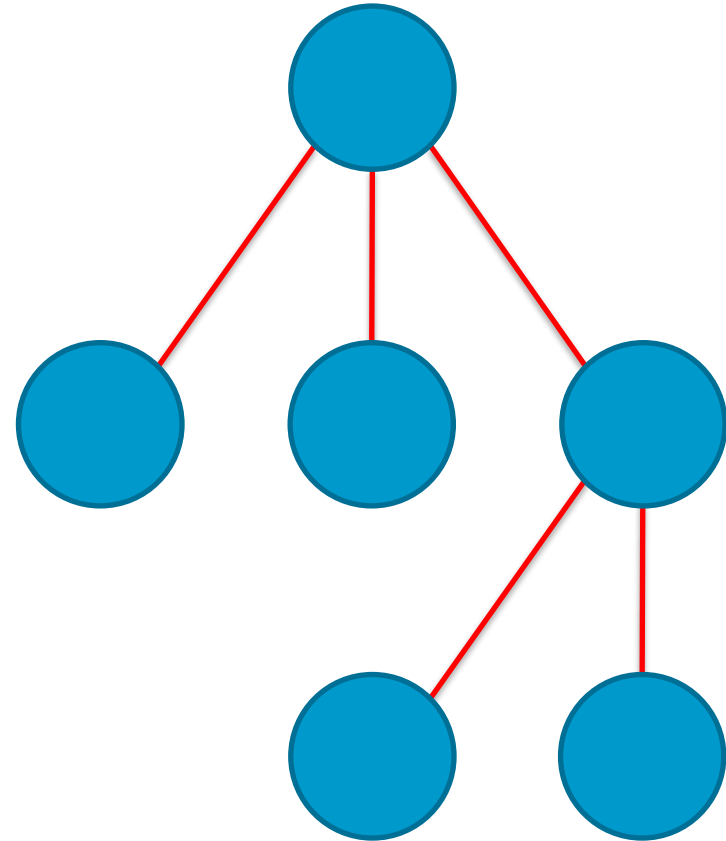
```
1. // find closest mineral to a unit
2. BWAPI::Unit getClosestMineral(BWAPI::Unit myUnit)
3. {
4.     BWAPI::Unit closestMineral = nullptr;
5.     int minDist = std::numeric_limits<int>::max();
6.     for (auto unit : BWAPI::Broodwar->getNeutralUnits())
7.     {
8.         int dist = unit->getDistance(myUnit);
9.         if (dist < minDist)
10.        {
11.            minDist = dist;
12.            closestMineral = unit;
13.        }
14.     return closestMineral;
15. }
```

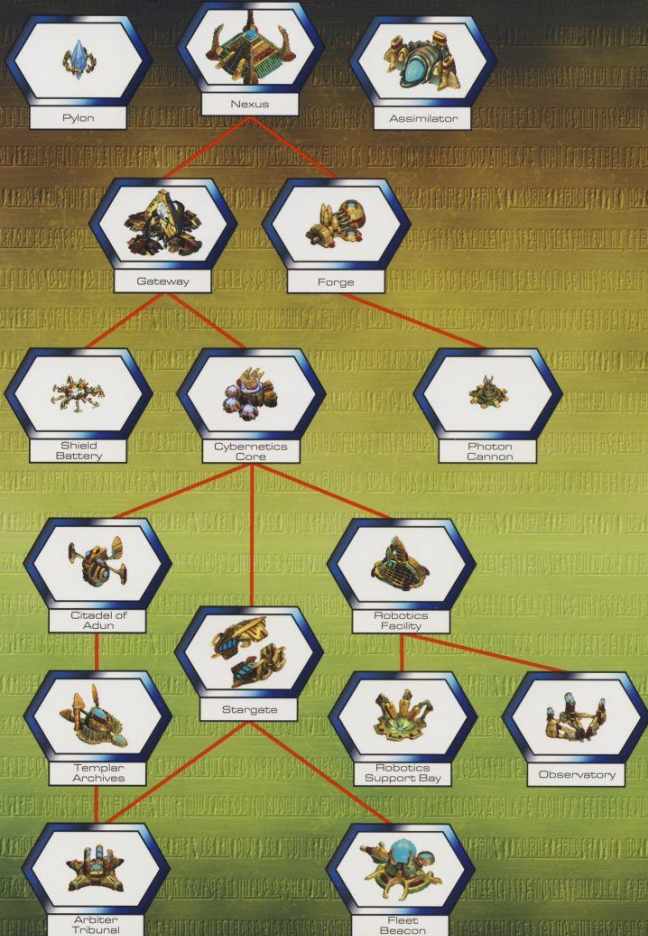
A screenshot from the game StarCraft II showing a battle between a Protoss and a Zerg army. The Protoss army, consisting of several Immortals and a Pylon, is attacking a Zerg army of many Zerglings and a few Hydralisks. The Zerglings are clustered around the Protoss units. In the background, there are Zerg structures including a Spawning Pool and a Hatchery. The scene is set on a dark, textured ground with some stone structures.

Army Composition

Starcraft Tech Tree

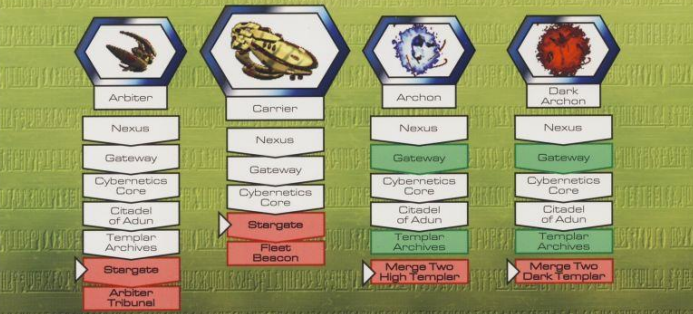
- Each building and unit in the game has a set of things required to build first
- Requirements: 'tech'
- Tree listing: tech tree





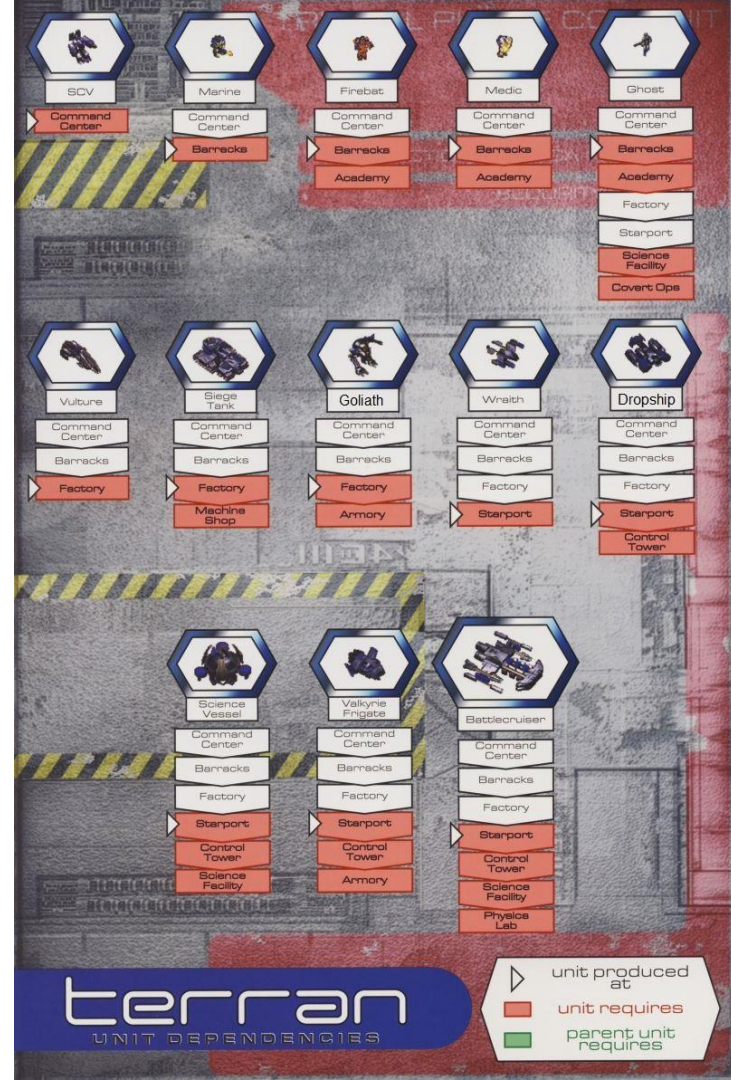
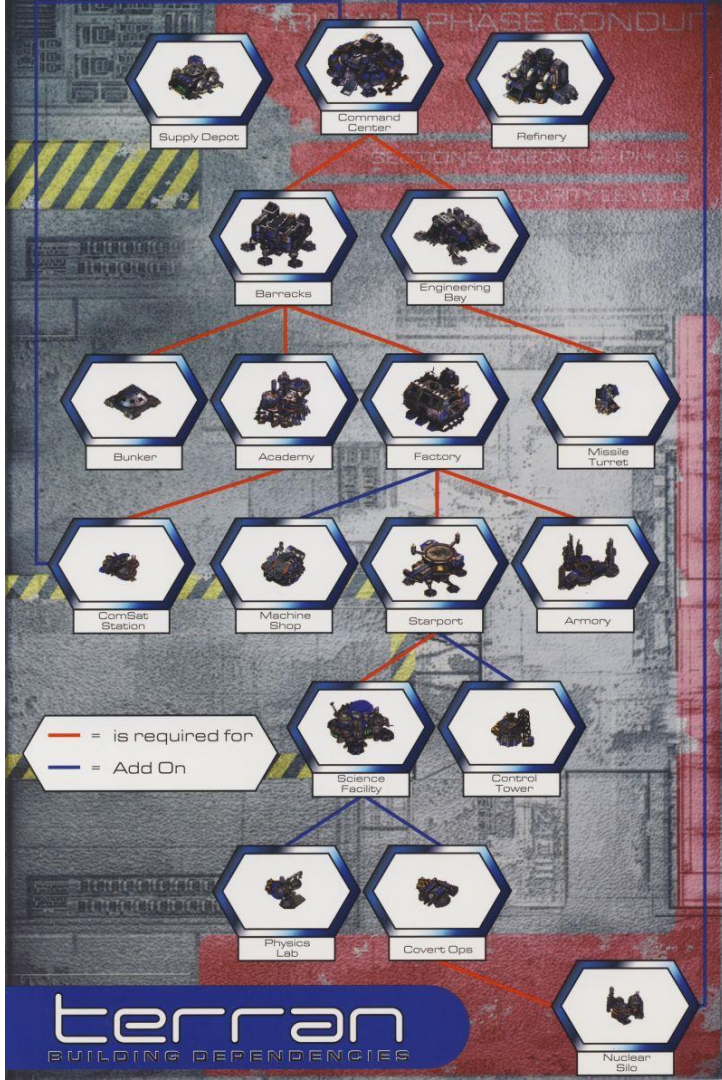
PROTOS

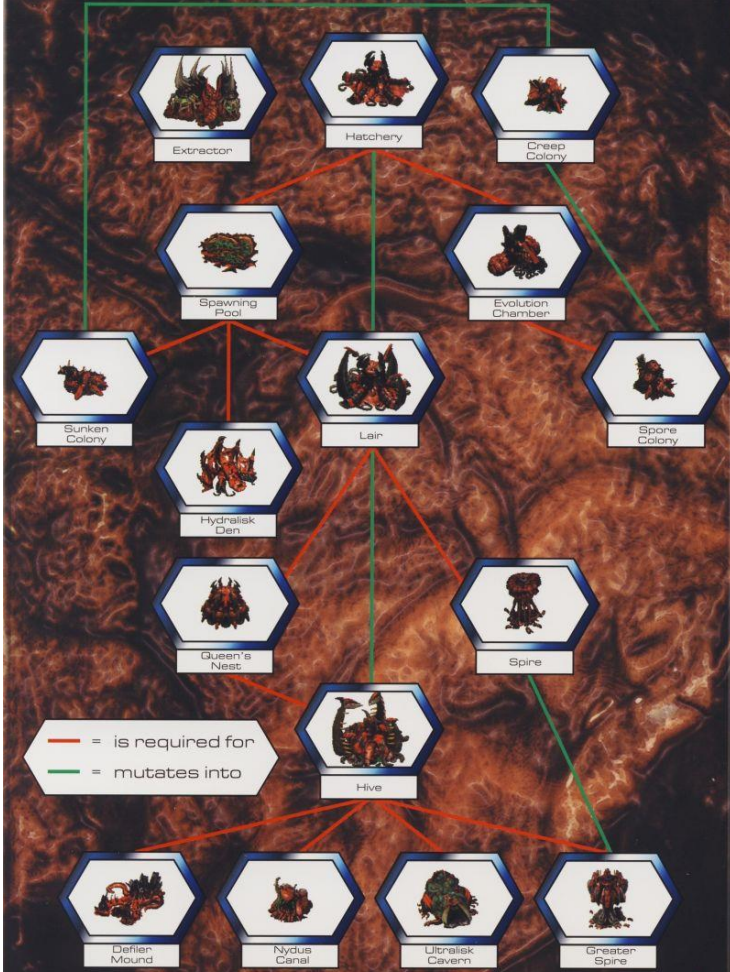
BUILDING DEPENDENCIES



PROTOS

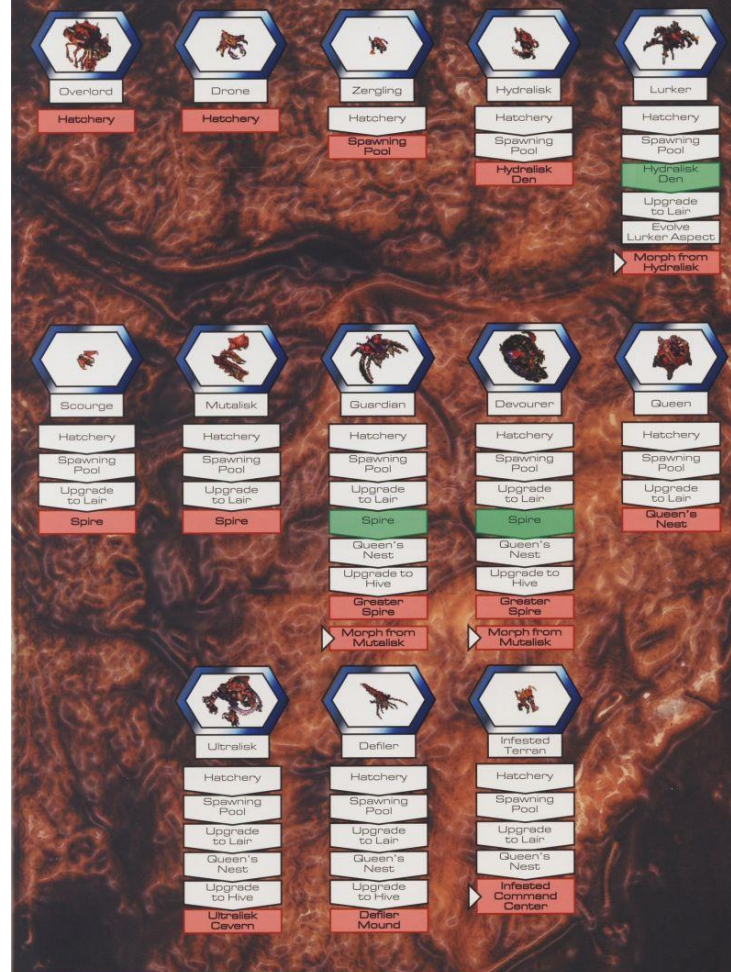
UNIT DEPENDENCIES





ZERG

BUILDING DEPENDENCIES



ZERG

UNIT DEPENDENCIES

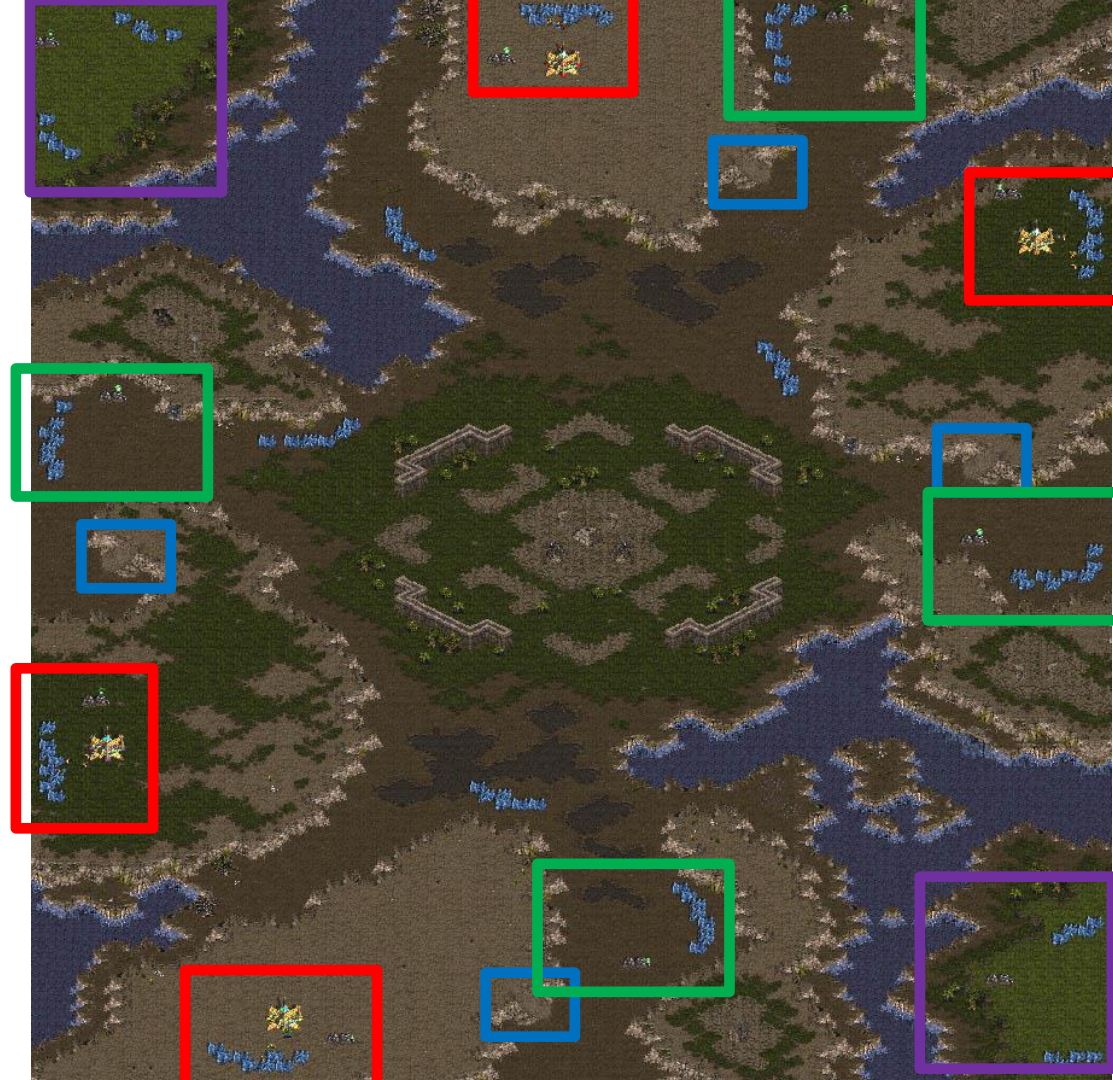
Starcraft Map

Start Locations

Choke Point

Expansions

Islands



Starcraft Map – Fog of War





Imperfect
Information

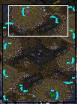
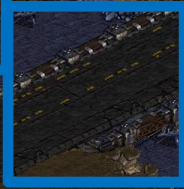
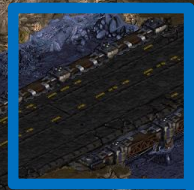


Choke Point



"Natural" Expansion

Main Base Perimeter

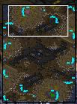


	Djem5[RU]	4 / 9	50	0	4	0	0
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	4 / 9	50	0	4	0	0

time: 00:00 speed: 1x



Protoss Base
Game Start



	Djem5[RU]	4 / 9	50	0	4	0	0
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	4 / 9	50	0	4	0	0

time: 00:00 speed: 1x



Protoss Base
First Expansion

	Djem5[RU]	72 / 82	620	414	46	20	204
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	17 / 35	21	23	16	1	2040

time: 07:20 speed: 1x



Zerg Base
Game Start





	Djem5[RU]	5 / 9	0	0	4	0	170
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	5 / 9	0	0	4	0	405

time: 00:02 speed: 1x

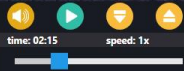


Zerg Base Building Expansion



	Djem5[RU]	14 / 17	36	0	13	0	258
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	9 / 9	75	0	8	0	552



time: 02:15 speed: 1x





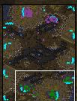
Zerg Base
Expansion Done



	Djem5[RU]	24 / 34	96	0	22	0	258
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	20.5 / 26	87	0	17	1.5	2184

time: 04:19 speed: 1x

Zerg Base Second Expansion



Djem5[RU]

68 / 82

260

318

44

14

198

Destination 1.1

SUPPLY

MINERALS

GAS

WORKERS

ARMY

APM

ualberta

20 / 35

43

101

19

1

984



time: 07:02

speed: 1x



Zerg Base
Game Over :(



	Djem5[RU]	117 / 122	797	965	61	46	162
	Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
	ualberta	0 / 0	216	150	0	0	2262

time: 09:23 speed: 1x

Starcraft Grid System

- Starcraft maps work on a Grid system
- Different types of grids, each with their own level of precision and task
- Maps are drawn in-game with textures that are applied to the underlying grid
- Grid are not visible in-game, but all game logic operates at one of these levels

StarCraft Grids

- **Pixel Level (1x1 pixel)**
 - Units move in pixel increments
 - BWAPI::Position
- **Walk Tile (8x8 pixels)**
 - Map 'walkability' Boolean grid
 - Units can't overlap 'false' tiles
 - BWAPI::WalkPosition (rarely used)
- **Build Tile (32x32 pixels)**
 - Building placed on w*h rectangle
 - Can't place on unwalkable tile
 - BWAPI::TilePosition





Green
Build Tile

Grey
Walk Tile

Red
Unit Box



490

0

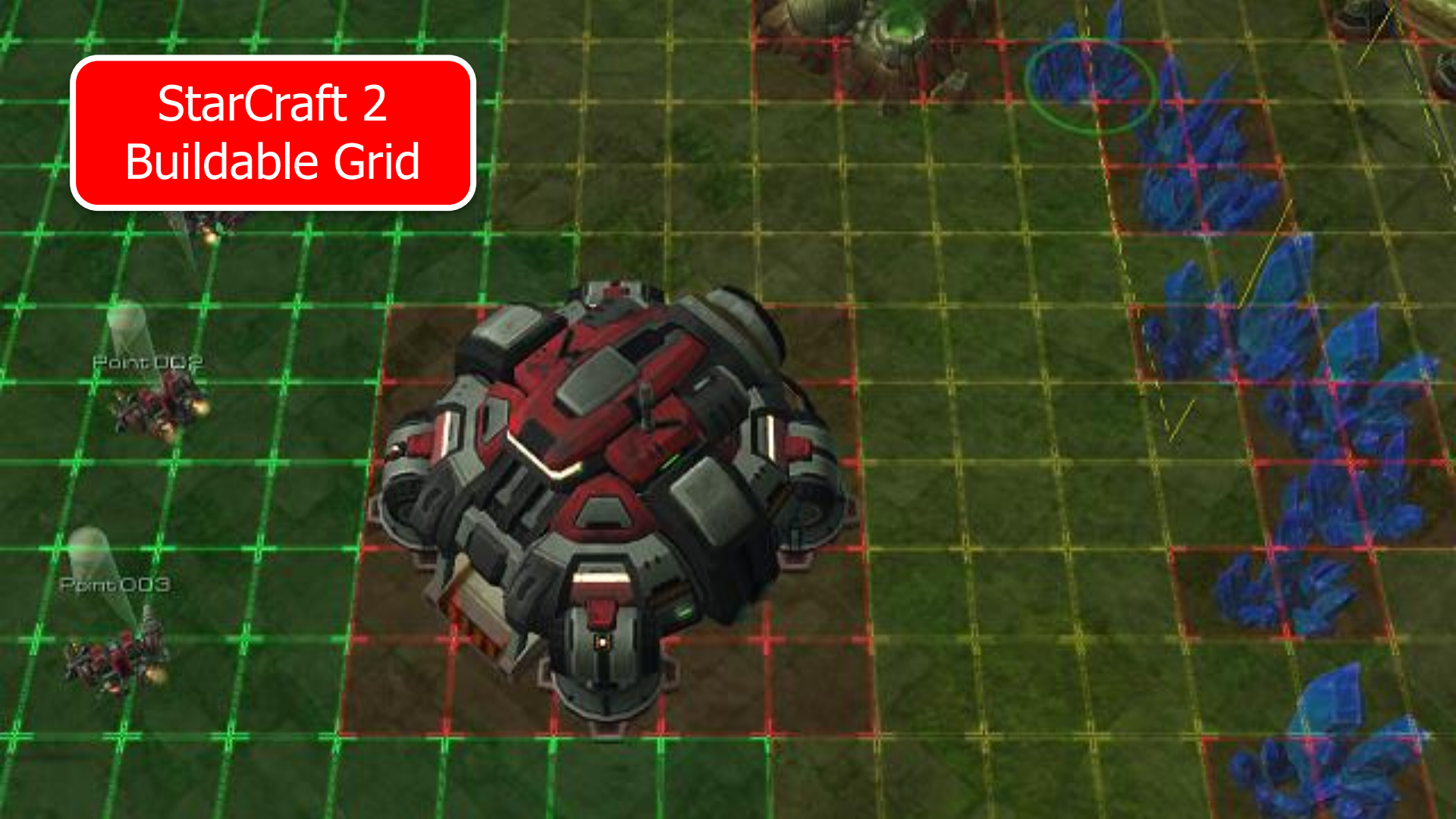
4/10

StarCraft Buildable Grid



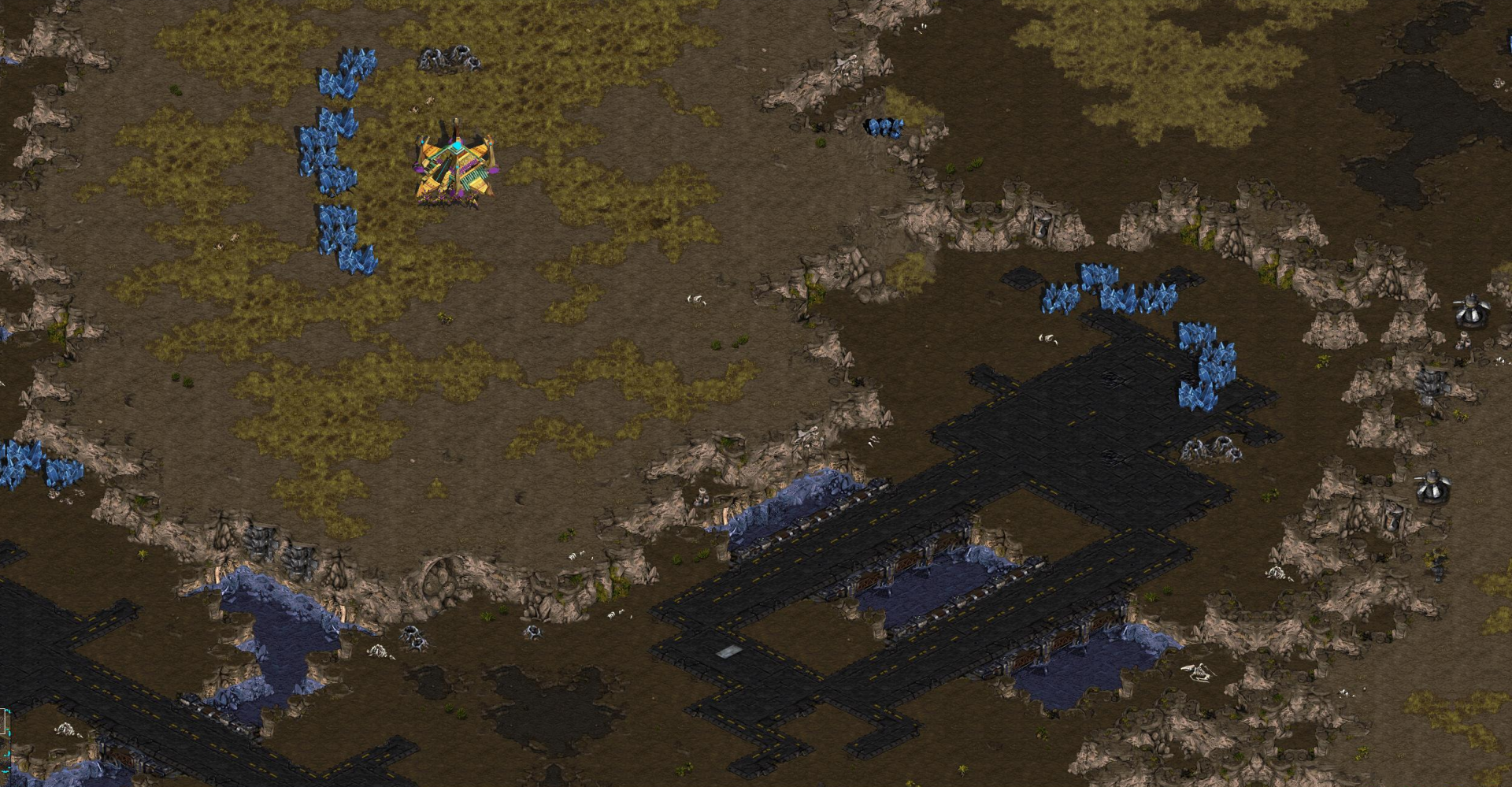
Select Location

StarCraft 2 Buildable Grid



Protoss Wall Using Grid

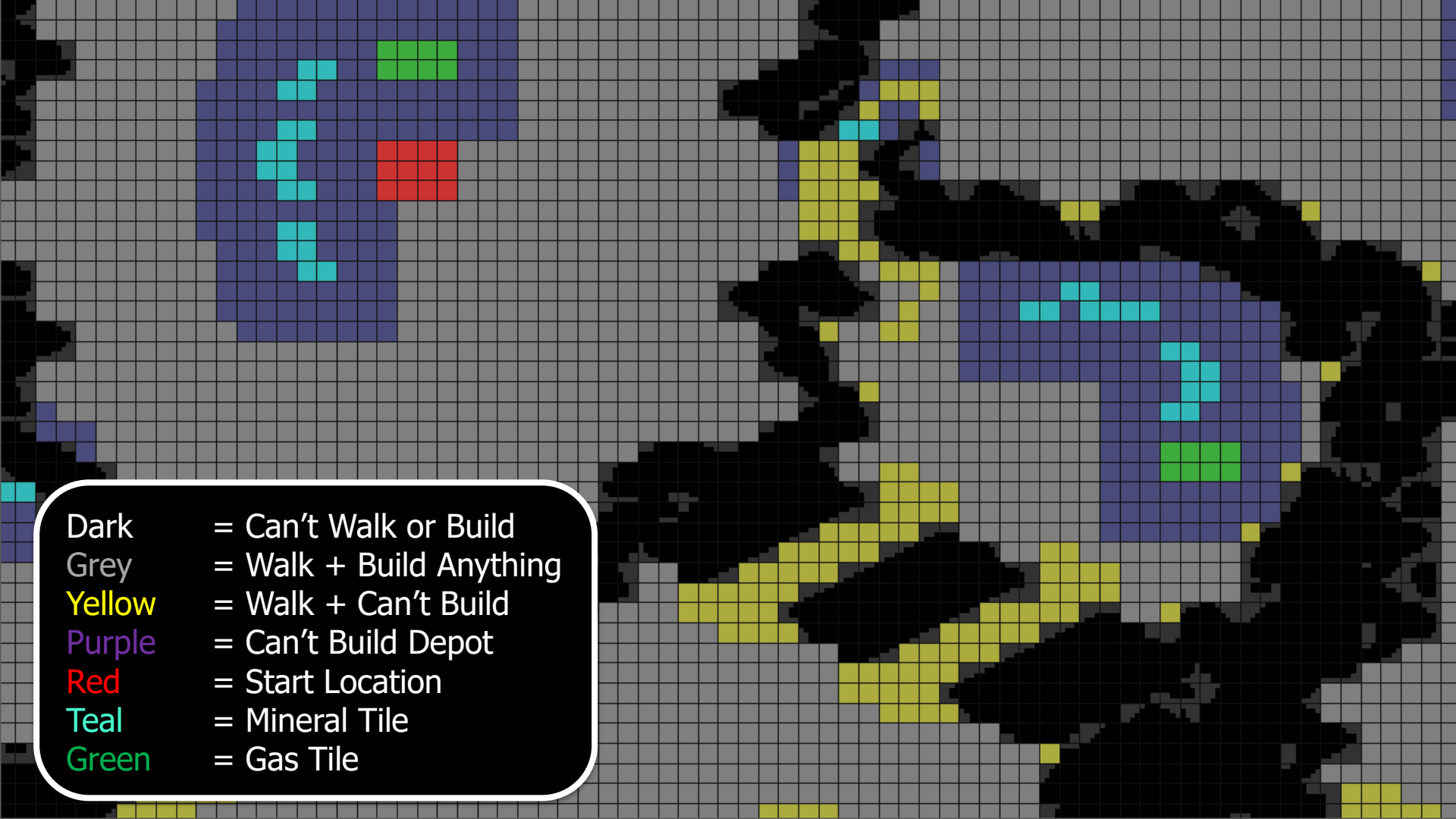




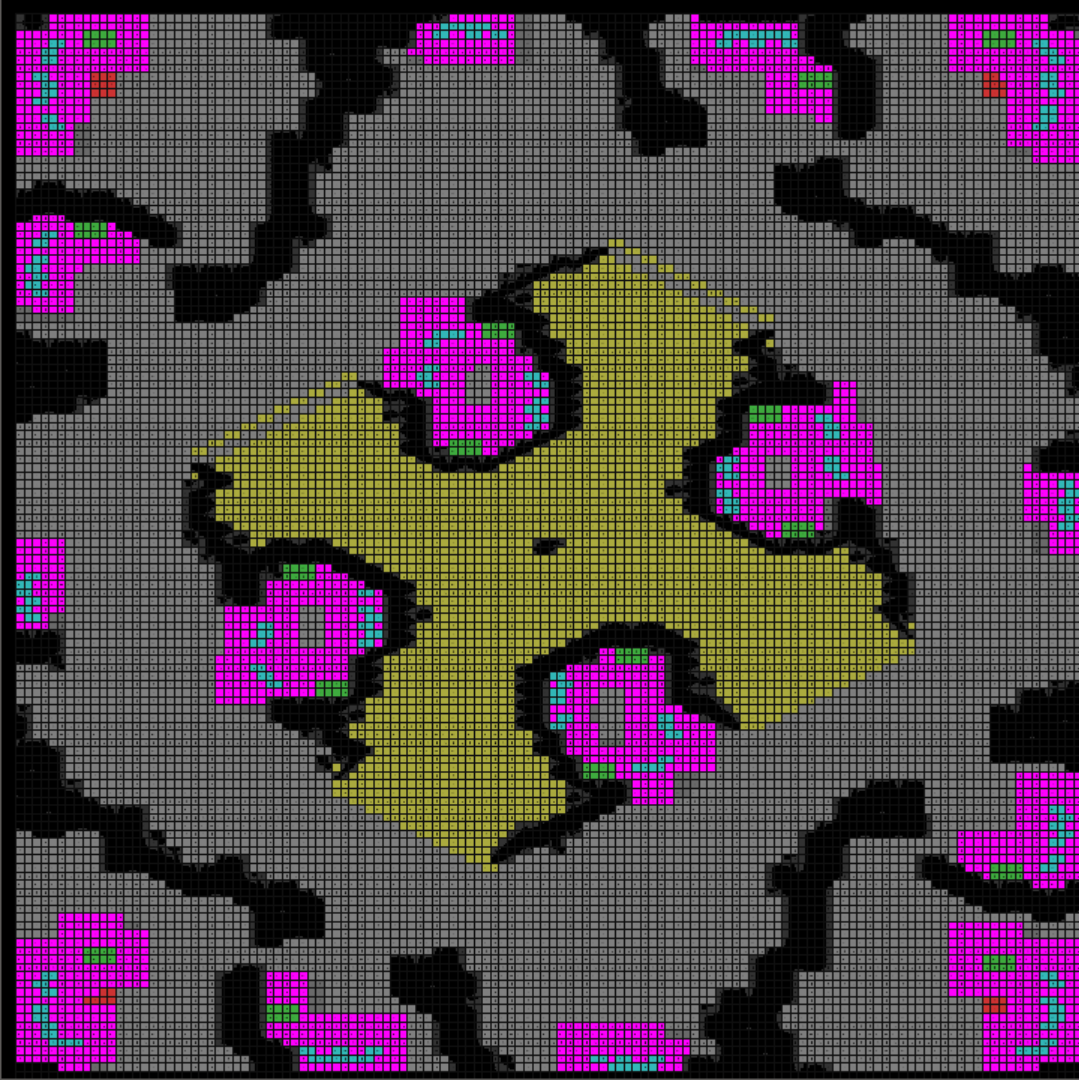
Djem5[RU]	4 / 9	50	0	4	0	0
Destination 1.1	SUPPLY	MINERALS	GAS	WORKERS	ARMY	APM
ualberta	4 / 9	50	0	4	0	0

time: 00:00 speed: 1x



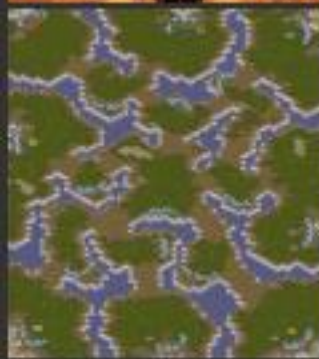
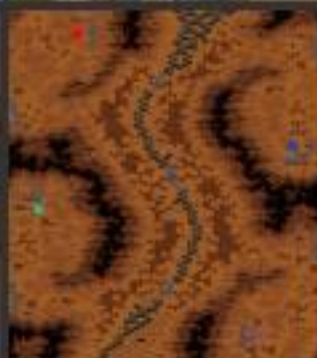
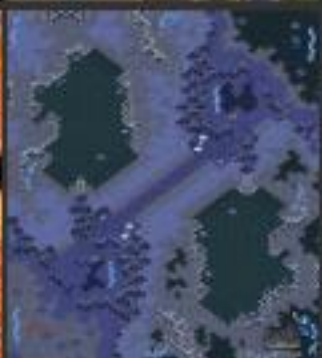
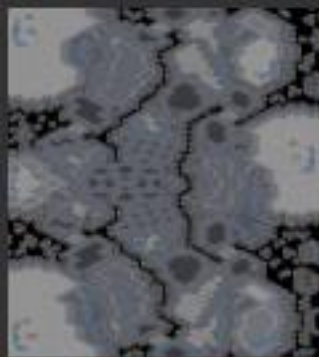


- Dark = Can't Walk or Build
- Grey = Walk + Build Anything
- Yellow = Walk + Can't Build
- Purple = Can't Build Depot
- Red = Start Location
- Teal = Mineral Tile
- Green = Gas Tile



maps\ICcup_Wuthering_H.scx.txt
Size: (128, 128) Build Tiles
(512, 512) Walk Tiles
Memory: 278kb
Players: 4

Base Location
Parsing

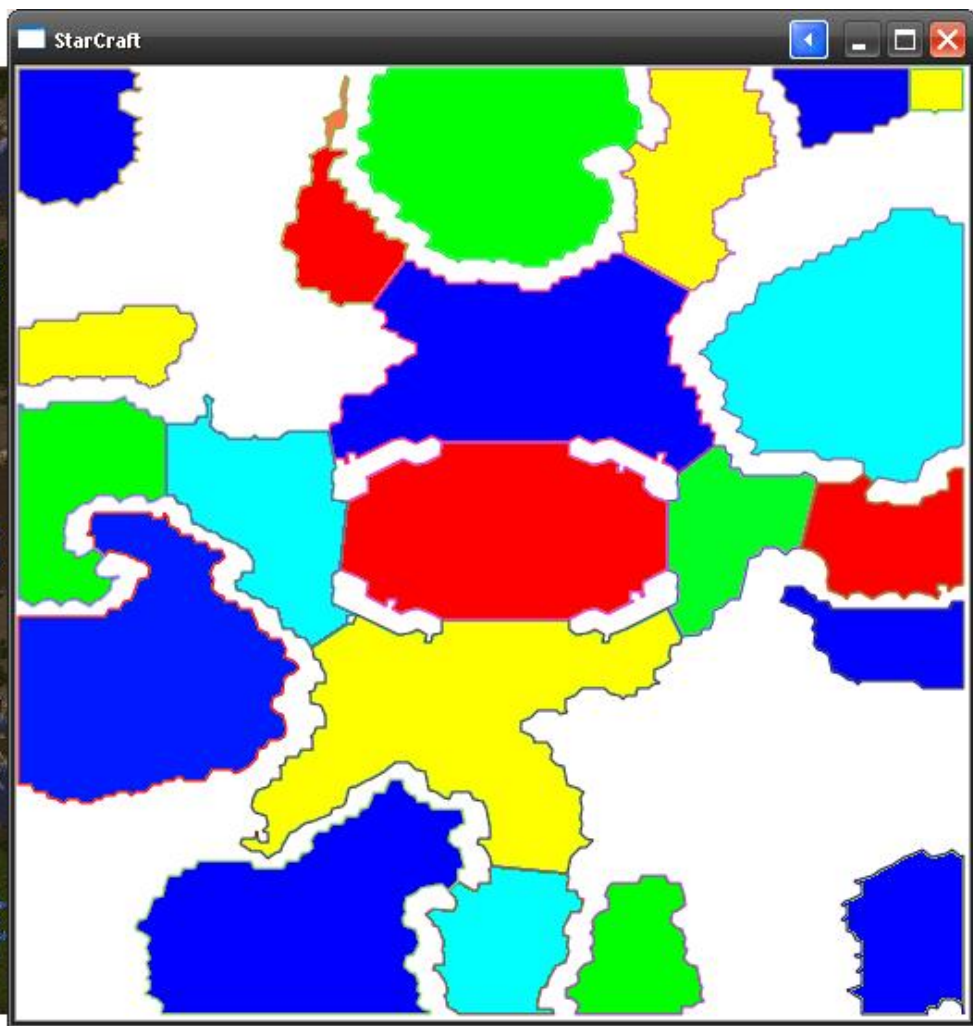


BWAPI Map Libraries

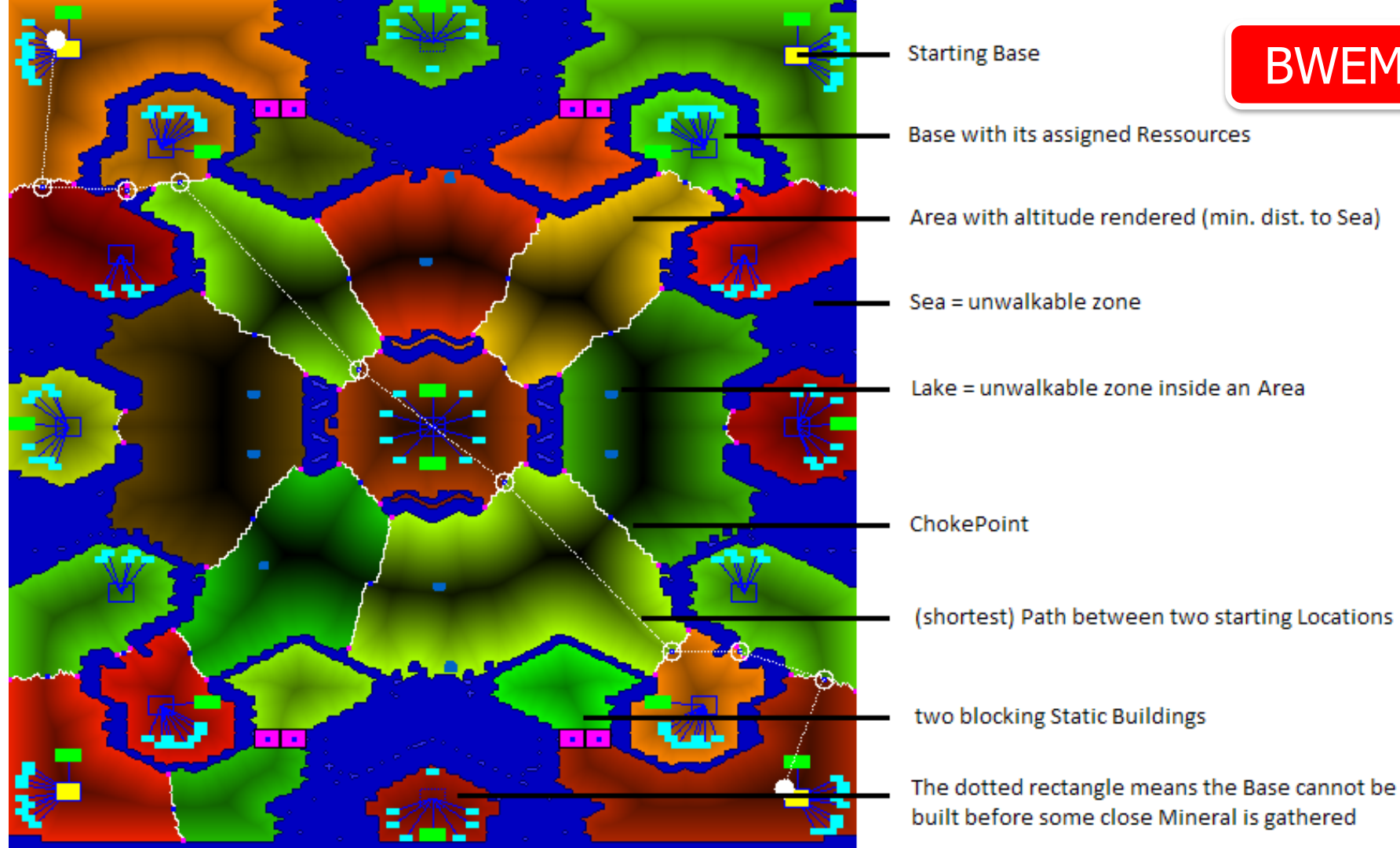
- Brood War Terrain Analysis
 - <https://code.google.com/archive/p/bwta/>
 - <https://bitbucket.org/auriarte/bwta2/src/master/>
- Brood War Easy Map
 - <http://bwem.sourceforge.net/>
 - <https://github.com/N00byEdge/BWEM-community>

BWEM-Community

(Recommended – Still Maintained)



BWEM



Scouting

- In order to attack your enemy, you need to know where their base is located
- Some maps have more than 2 starting locations, so you need to scout!
- Scouting is usually done with your worker unit after you have made a Supply Depot, Pylon, or Spawning Pool for Zerg

```
1. void scoutWithUnit(BWAPI::Unit scout)
2. {
3.     if (!scout) { return; } // be sure we have a scout
4.     for (auto tile : BWAPI::Broodwar->getStartLocations())
5.     {
6.         if (!BWAPI::Broodwar->isExplored(tile))
7.         {
8.             BWAPI::Position pos(tile); // convert tile to pos
9.             auto command = scout->getLastCommand();
10.            // repeated command each frame can cause issues
11.            if (command.getTargetPosition() == pos) { return; }
12.            scout->move(pos);
13.            return;
14.        }
15.    }
16.    // if we have explored all start locations, return scout home
17.    scout->move(BWAPI::Position(BWAPI::Broodwar->self()->getStartLocation()));
18. }
```


Starcraft Combat

- Difficult Problem
- Goal: Kill enemy units
- Advanced tactics such as flanking / surround are hard to compute
- Attacking closest unit of enemy is good



Starcraft Bot Logic Flow

- https://github.com/davechurchill/ualberta_bot/wiki/Design-and-Architecture

BWAPI Annoyances

Table 1: Sequence of events occurring after an attack command has been given in StarCraft. Also listed are the associated BWAPI `unit.isAttacking()` and `unit.isAttackFrame()` return values for the given step.

Attack Sequence	isAttacking	isAttackFrame	Additional Notes
1. Unit is Idle	False	False	Unit may be idle or performing another command (i.e.: move)
2. Issue Attack Cmd	False	False	Player gives order to attack a target unit
3. Turn to Face Target	False	False	May have 0 duration if already facing target
4. Approach Target	False	False	May have 0 duration if already in range of target
5. Stop Moving	False	False	Some units require unit to come to complete stop before firing
6. Begin Attack Anim	True	True	Attack animation starts, damage not yet dealt
7. Anim Until Damage	True	True	Animation frames until projectile released
8. Mandatory Anim	True	True	Extra animation frames after damage (may be 0)
9. Optional Anim	True	True	Other command can be issued to cancel extraneous frames
10. Wait for Reload	True	False	Unit may be given other commands until it can shoot again
11. Goto Step 3	False	False	Repeat the attack

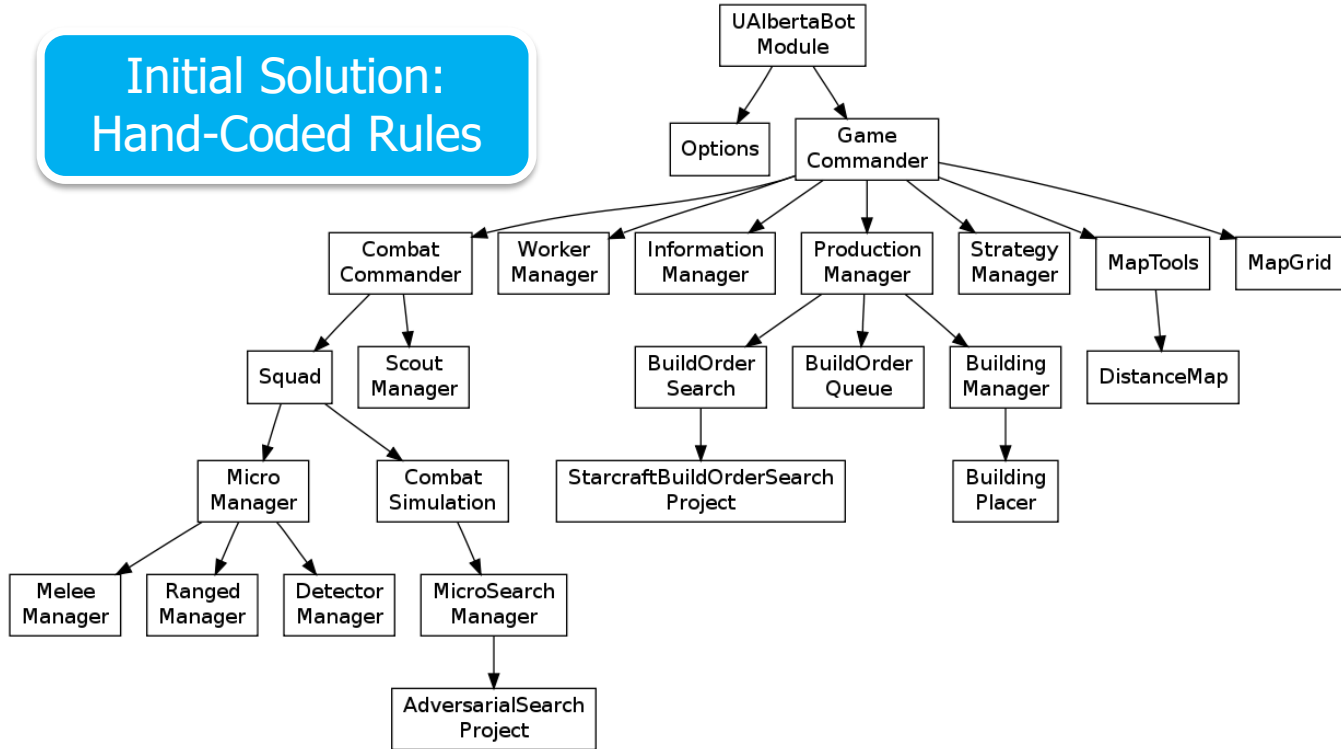
StarCraft Agents

UAlbertaBot

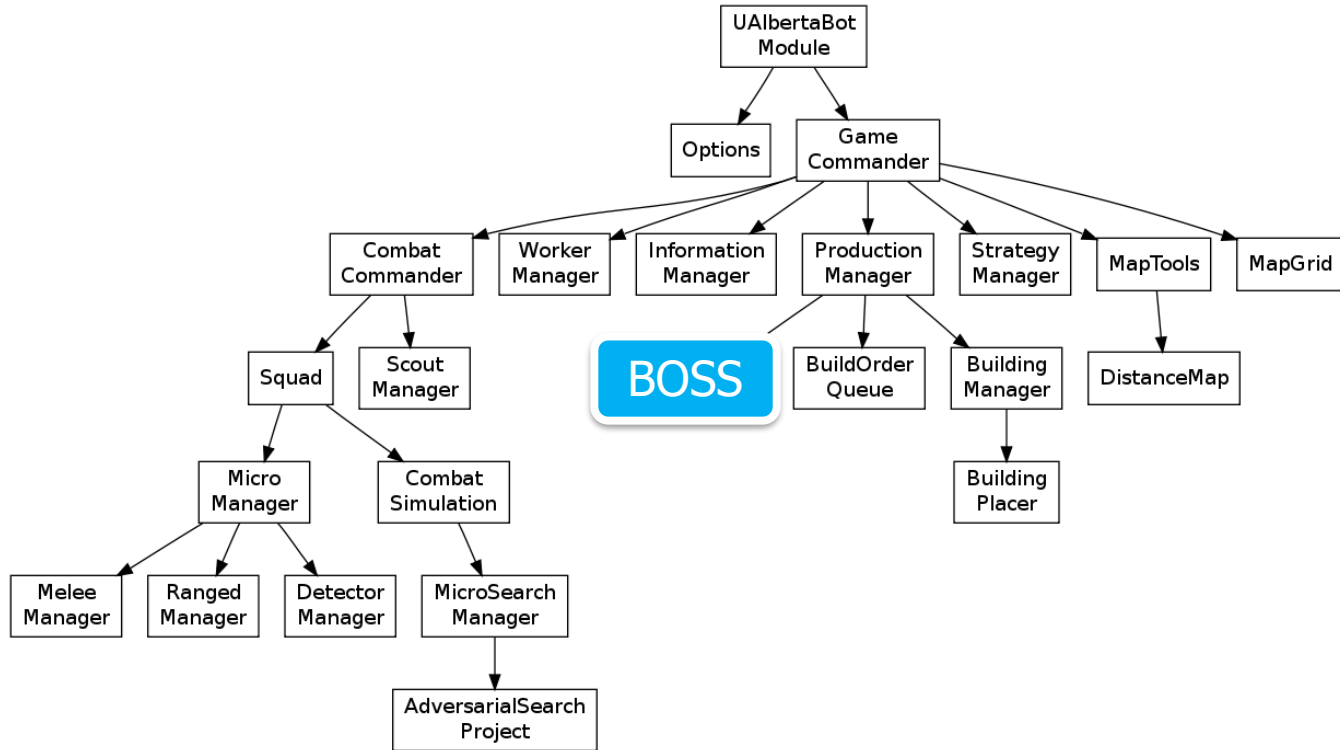
- Competing since 2010
- Plays any of the 3 StarCraft races
- 10+ “Strategies”
- Best at “Rushing” strategies

UAlbertaBot

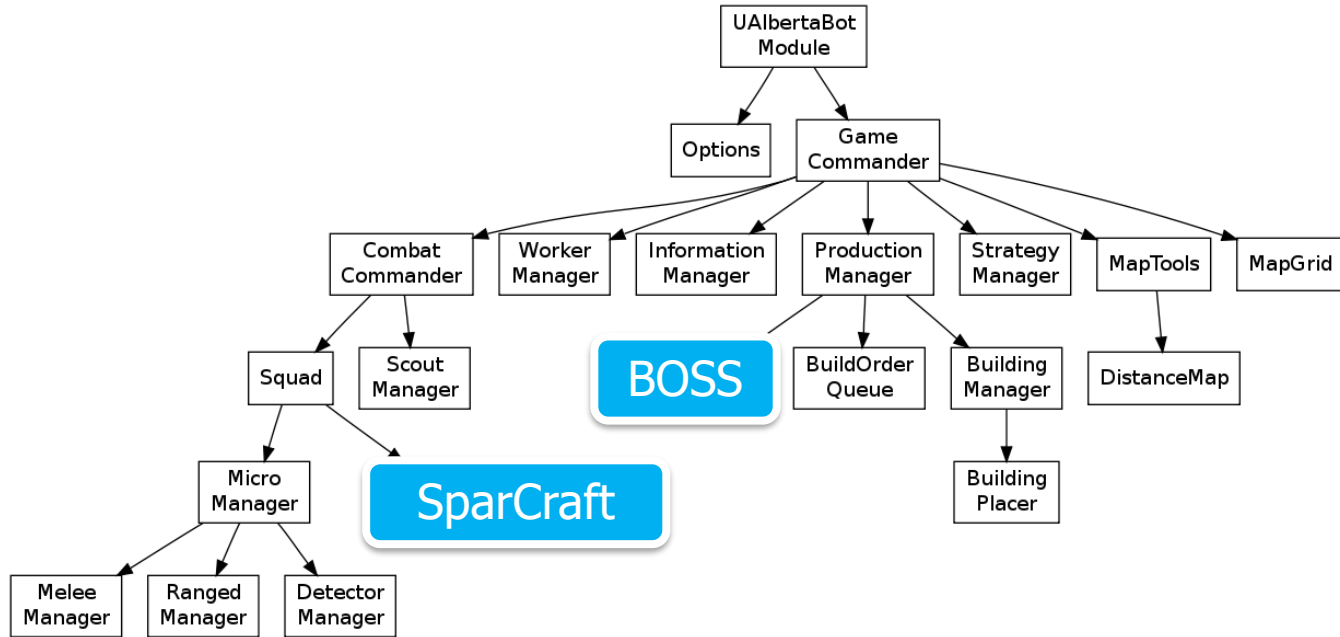
Initial Solution:
Hand-Coded Rules



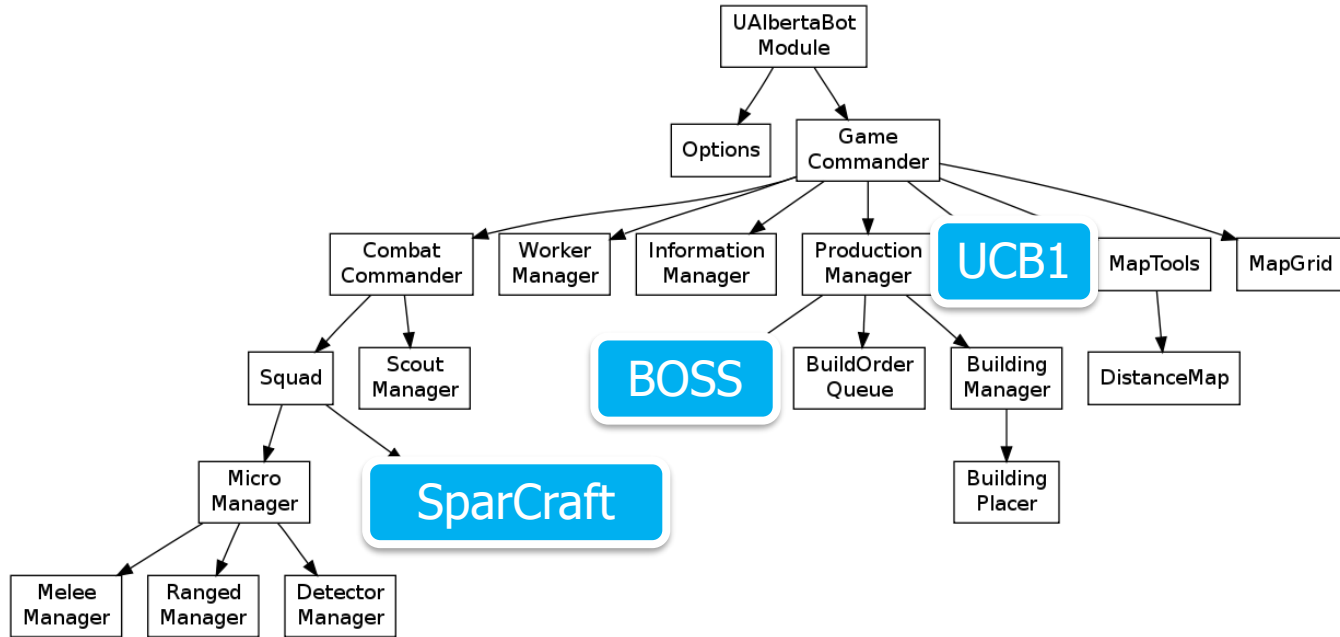
UAlbertaBot

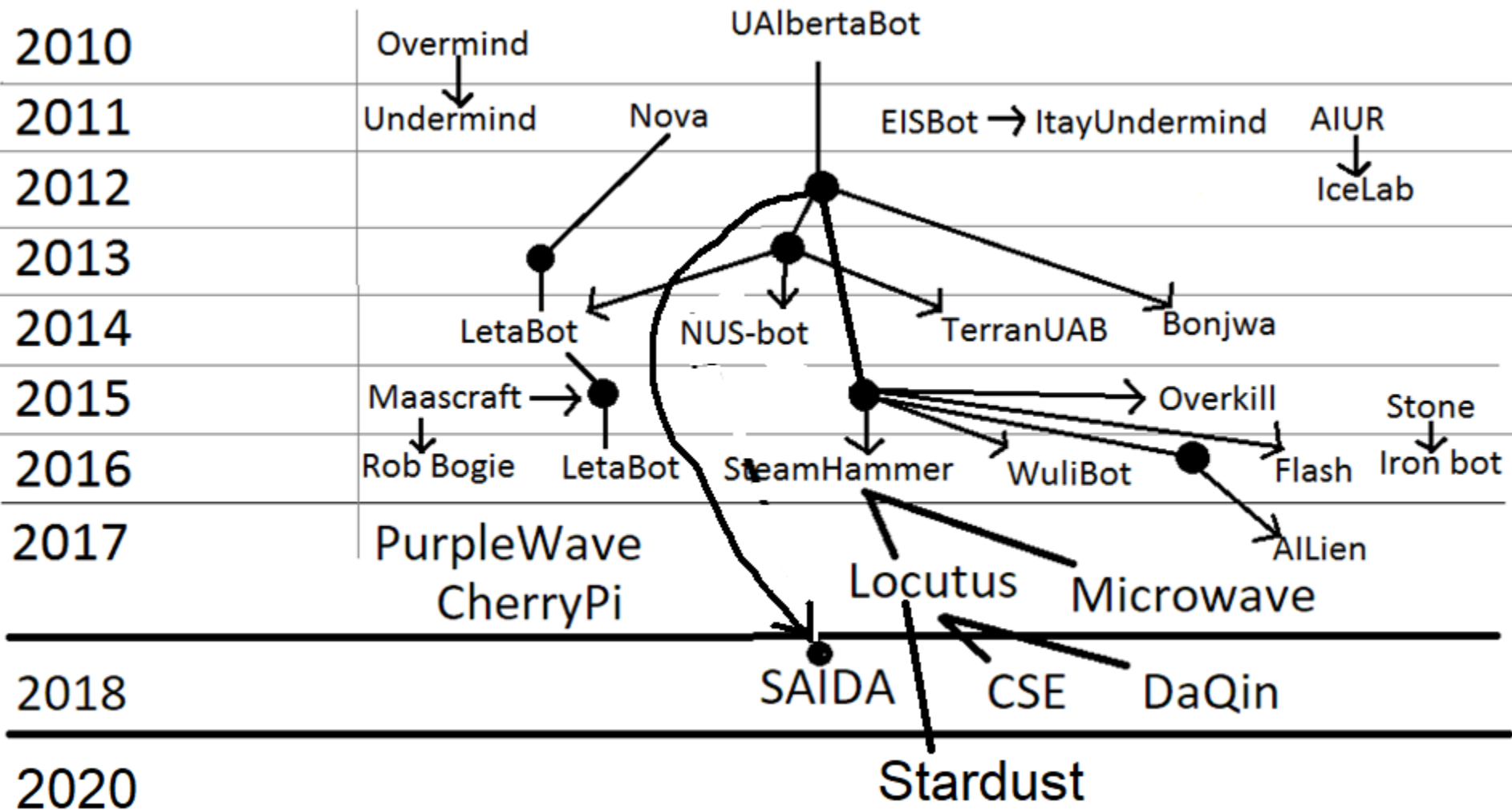


UAlbertaBot

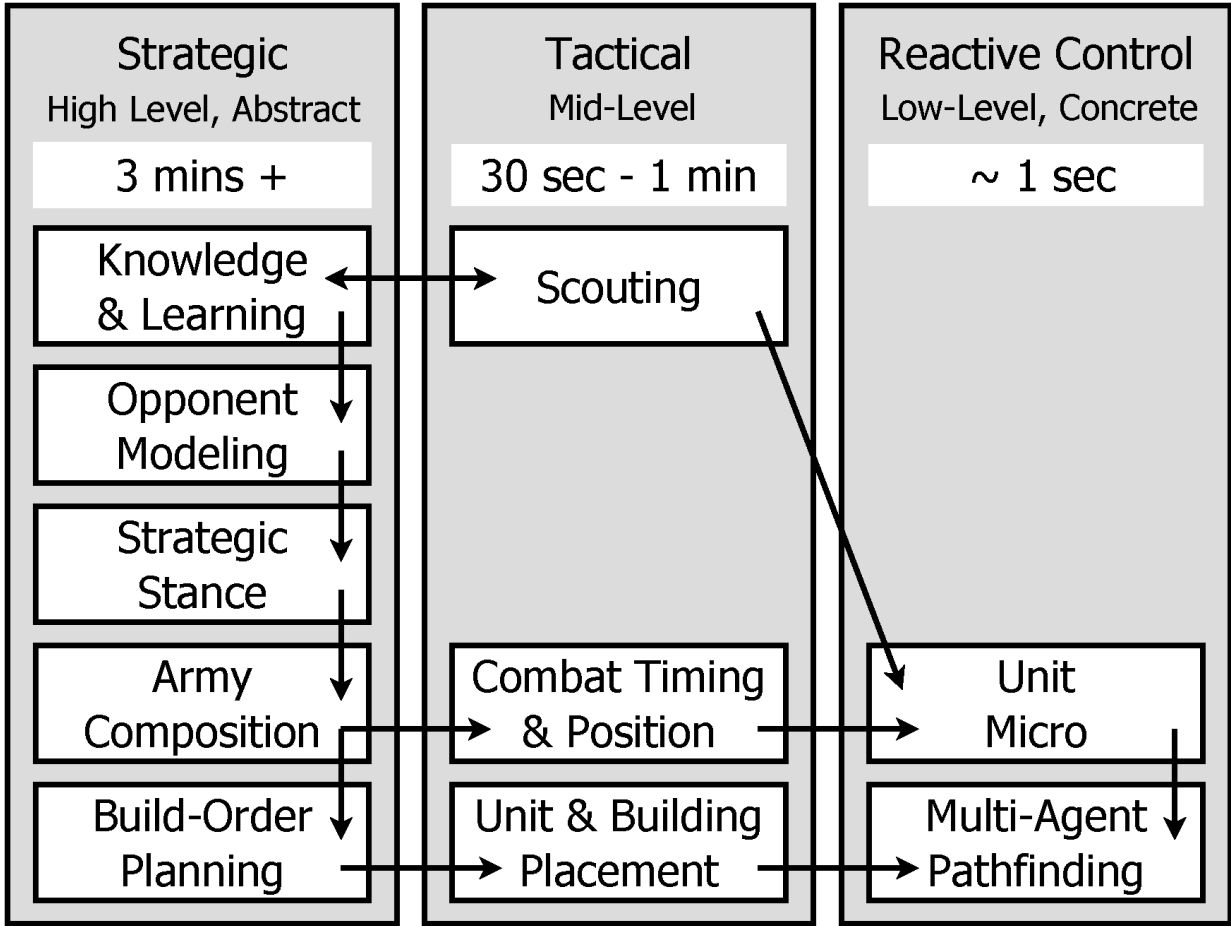


UAlbertaBot





StarCraft (Huge)



StarCraft as an AI Environment

- Huge action / state space
- Real-time decision making
- Properties similar to real-life problems
- New solutions required, not just more CPU
- Human experts can evaluate agents
- Public interest / excitement
- Educational tool / student motivation

Properties of RTS

- Real-Time
- Simultaneous Move
- Non-Deterministic
- Imperfect Information
- Multi-Unit Control
- Unknown Game Engine
- Action / State Space

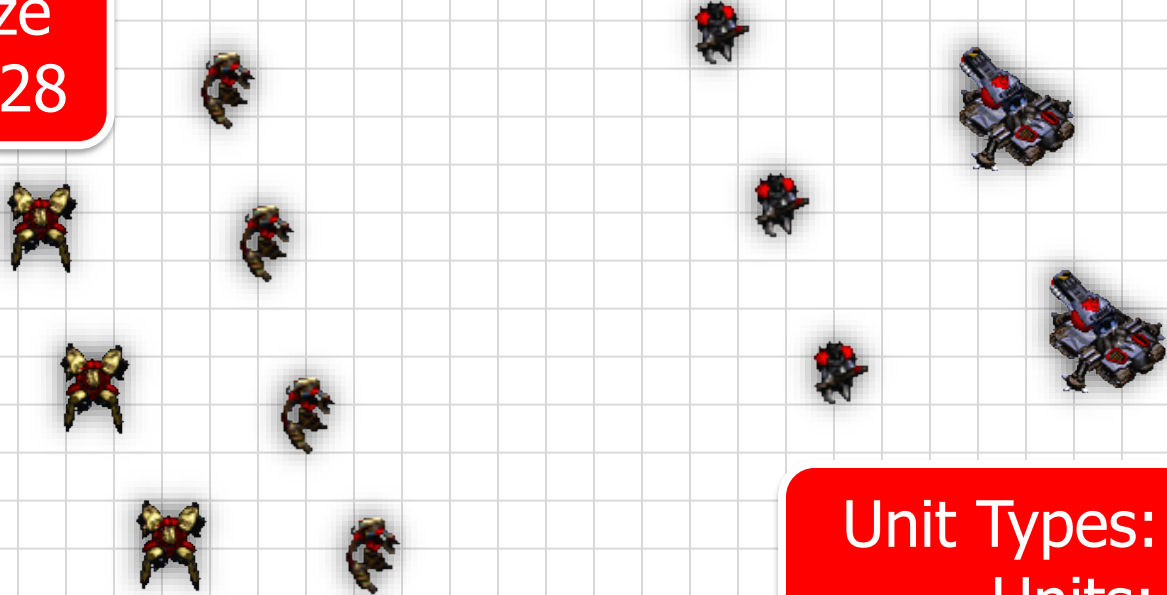


Imperfect Information



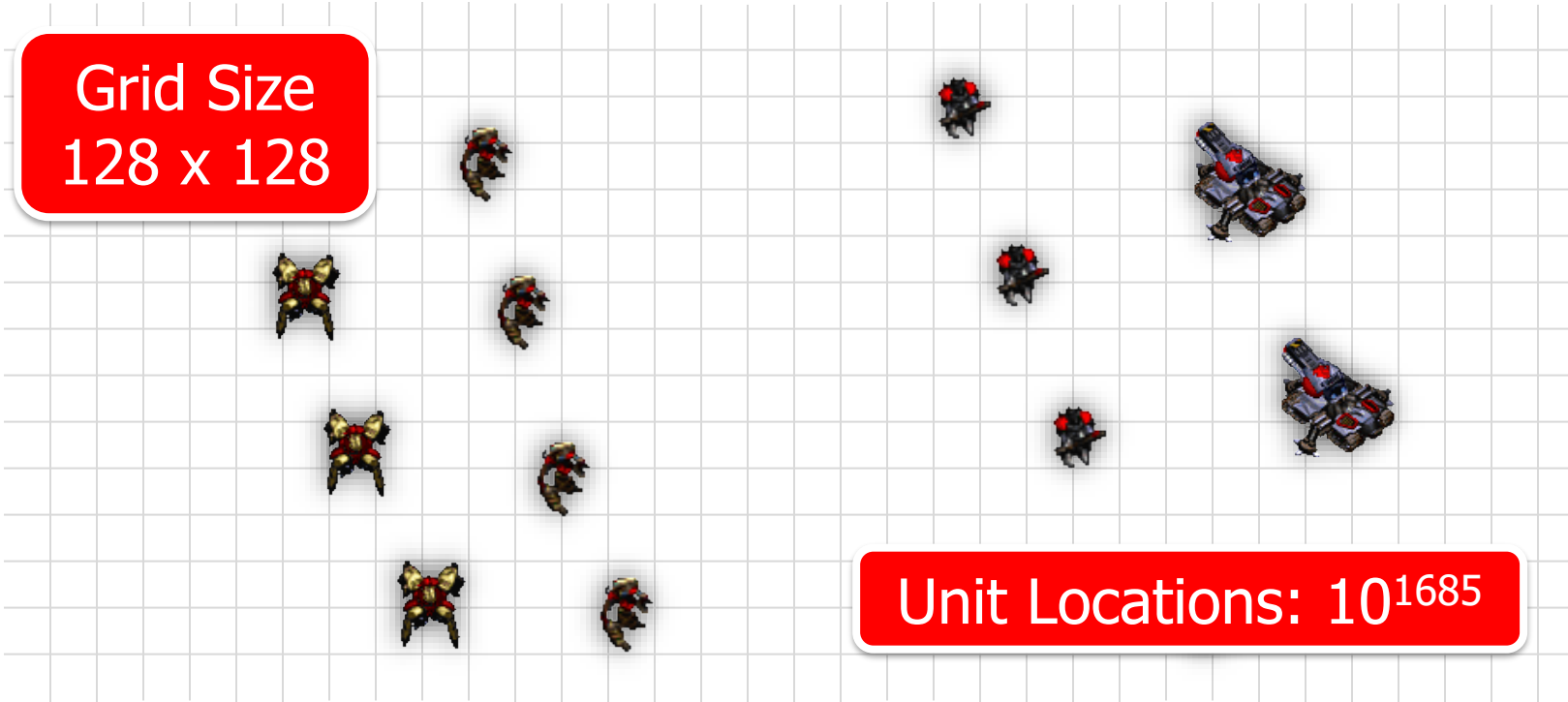
State Space

Grid Size
128 x 128



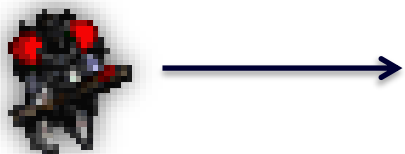
Unit Types: ~50
Units: ~200

State Space



Multi-Unit Control

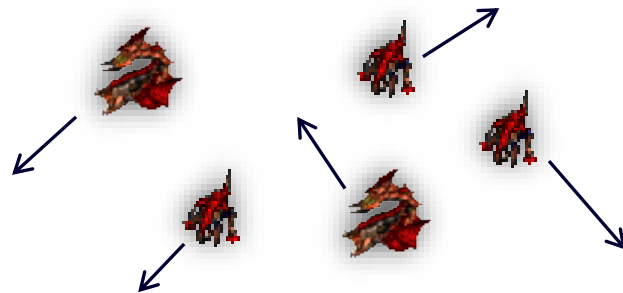
Unit Action



Units = U

Actions = A

Player Move



Player Moves $\sim A^U$

Properties of RTS

- Real-Time
- Simultaneous Move
- Non-Deterministic
- Imperfect Information
- Multi-Unit Control
- Unknown Game Engine
- Action / State Space



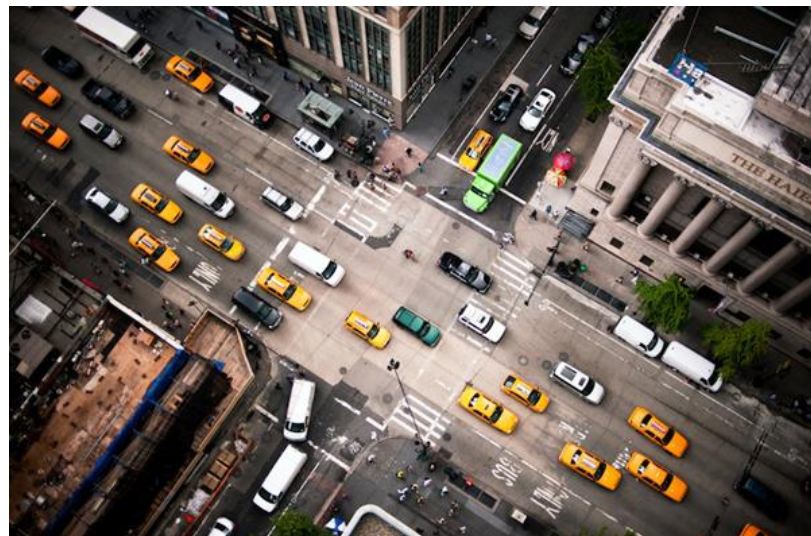
Properties of Robotics

- Real-Time
- Simultaneous Move
- Non-Deterministic
- Imperfect Information
- Multi-Unit Control
- Unknown Game Engine
- Action / State Space

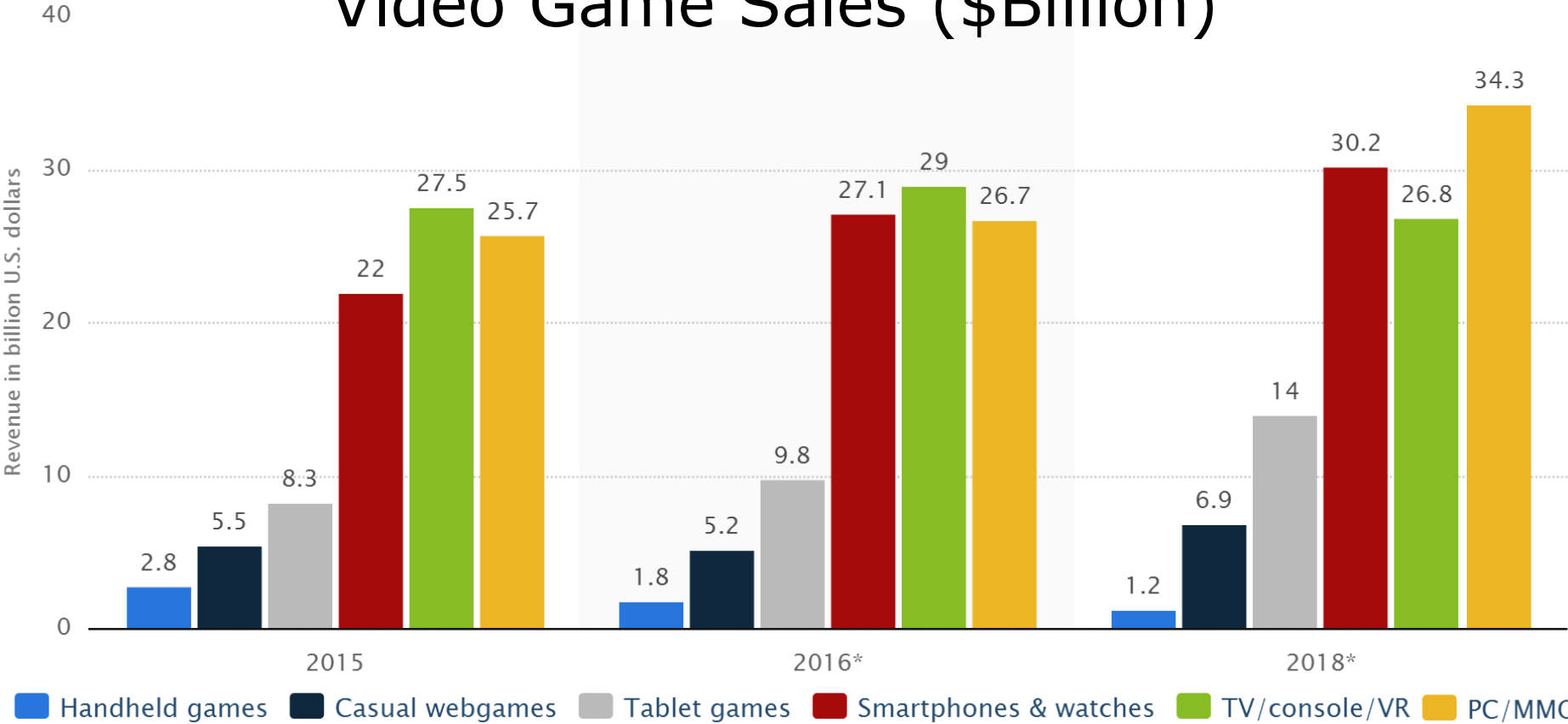


Properties of the Real World

- Real-Time
- Simultaneous Move
- Non-Deterministic
- Imperfect Information
- Multi-Unit Control
- Unknown Game Engine
- Action / State Space



Video Game Sales (\$Billion)



Benefits of RTS AI

- Better In-Game AI
 - More intelligent NPCs
 - Better single player
- Create Offline Tools
 - Game balancing
 - Reduce human testing
- Apply to any game





Human Professionals

300-500 Actions Per Minute (APM)

Human vs. Machine

