

Pick Your T-shirt – Style 1

- Piccolo Souvenir T-shirt
 - Style 1
 - Piccolo Digital World Series
 - Key elements
 - Piccolo Logo P surrounded by Piccolo codes, representing the digital world created by Piccolo





Game-Engine Explorer





Pick Your T-shirt – Style 2

- Piccolo Souvenir T-shirt
 - Style 2
 - Piccolo Pro Series
 - Key elements
 - Code between Programmers (DDDD) +Equation of quaternion function, representing professional



Game-Engine Explorer



Get Your Own T-shirt

- How to get?
 - Please comment under 《Lecture16》 @Bilibili before 10:00 am next Monday 7/25

GAMES104

- we will give out 10 T-shirts for the best comments
- Reward List for Naming Event
 - otaku小许、张茂、Frozen、核桃、王十一、李同学、蝈蝈、 塞伦斯、鄙姓金名聪、家子颜





Q&A

• Q1: Is component-based architecture best suited for gameplay logic?

• Q2: How could Blueprint System support collaborative editing?

• Q3: Will Event System consider priority of events?



Lecture 16

Gameplay Systems

Basic Artificial Intelligence

WANG XI

GAMES 104

BOOMING



G/AMES104

Outline of Artificial Intelligence Systems

01.

Al Basic

- Navigation
- Steering
- Crowd Simulation
- Sensing
- Classic Decision Making Algorithms



Advanced Al

- Planning and Goals
- Machine Learning





Navigation





Navigation In Games

Find paths from a location to another in an automatic manner



Assassin's Creed: Odyssey









Map Representations – Walkable Area

- We need to tell AI agents where they can walk Walkable area
- Walkable area of players is determined by character motion capabilities
 - Physical Collision
 - Climbing slope/height
 - Jumping distance
- Simulating movement of AI agents as players costs too much
- All agents are still expected to have the same walkable area as players



Map Representations - Formats

- Waypoint Network
- Grid
- Navigation Mesh
- Sparse Voxel Octree





Waypoint Network (1/3)

- Network connecting critical points (waypoints) from the map
- Waypoint sources:
 - Designed important locations
 - Corner points to cover walkable area
 - Internal points to connect near-by waypoints adding flexibility to navigation



GAMES104

World of Warcraft





Waypoint Network (2/3)

Usage of waypoint network is similar to subway system

- Find the nearest points to get on and off the network
- Plan the path on the waypoint network





waypoint network



path on waypoint network



Waypoint Network (3/3)

Pros:

- Easy to implement
- Fast path finding, even for large maps

Cons:

- Limited flexibility: must go to the nearest point in the network before navigation
- Waypoint selection requires manual intervention



GAMES104



Grid (1/3)

- Intuitive discretization of map
- Uniform subdivision into small regular grid shapes
- Common grid shapes
 - Square
 - Triangle
 - Hexagon



BOOMING

G/AMES104

Sid Meier's Civilization IV



Sid Meier's Civilization V





Grid (2/3)

Grid property could be modified in runtime to reflect dynamic environmental changes







Pros:

- Easy to implement
- Uniform data structure
- Dynamic

Cons:

- Accuracy depends on grid resolution
- Dense grid lowers pathfinding performance
- High memory consumption
- Hard to handle 3D map



BOOMING

GAMES104

3D overlapping walkable surface



Navigation Mesh (NavMesh)

- Solves the problem of representing overlapped walkable areas
- Approximates the walkable area of character controller based on physical collision and motion capabilities
- Lowers network density to boost pathfinding performance



Original 3D bridge



3D bridge on NavMesh





NavMesh Example

Neighboring 3D convex polygons to represent walkable areas



original mesh

NavMesh



BOOMING

GAMES104

Top-down view of NavMesh



Convex Polygon of NavMesh

Why convex polygon?

- Pathfinding generates a series of polygon
 (Polygon Corridor) need to walk through
- Convexity guarantees the final path is limited in the polygon and two adjacent polygons have only one common edge (**Portal**)







Pros:

- Support 3D walkable surface
- Accurate
- Fast in pathfinding
- Flexible for selection of start/destination
- Dynamic

Cons:

- Complex generation algorithm
- Not support 3D space



BOOMING

GAMES104

Death Stranding



Sparse Voxel Octree

- Represents "flyable" 3D space
- Similar to spatial partitioning
- Finest level voxels represents complicated boundary
- Coarser-level voxels represents uniform regions







Warframe







Path Finding (1/2)

Distances in map representations can be abstracted as edge costs in graph







Path Finding (2/2)

Pathfinding can be abstracted as shortest path problem in non-directional graph







Depth-First Search

Expand most recently added









Breadth-First Search

Expand least recently added









Dijkstra Algorithm (1/3)



for each vertex v: $dist[v] = \infty$ prev[v] = nonedist[source] = 0 set all vertices to unexplored while destination not explored: v = least-valued unexplored vertex set v to explored for each edge (v, w): if dist[v] + len(v, w) < dist[w]:</pre> dist[w] = dist[v] + len(v, w)prev[w] = v





Dijkstra Algorithm (2/3)







Dijkstra Algorithm (3/3)





A Star (A*)

- Expand lowest cost in list
- Distance is known distance from source + heuristic
- Greedy: stops when reaches the goal











A* – Cost calculation

Cost calculation: f(n) = g(n) + h(n)

- g(n): the exact cost of the path from the start to node n
- h(n): the estimated cost from node n to the goal





A* – Heuristic On Grids

- For 4 directions of movement, we can use Manhattan distance
- D_1 : cost for moving to the adjacent node
- $h(n) = D_1 \cdot (d_x + d_y)$

•
$$d_x = |x_n - x_{goal}|, d_y = |y_n - y_{goal}|$$



BOOMING

GAMES104



current node v







A* – Heuristic On NavMesh (1/2)

Multiple choices when evaluating cost on NavMesh

- Using polygon centers or vertices usually over-estimate the cost
- Using hybrid method introduces too many points to check
- Midpoints of edges a good balance









polygon centers

polygon vertices

midpoints of edges

hybrid



A* – Heuristic On NavMesh (2/2)

- On a navigation mesh that allows any angle of movement, use a straight line distance
- Use midpoint of the edge entering the current node as node cost calculation point
- *D*: the cost for moving unit distance in any direction
 - $h(n) = D \cdot \sqrt{d_x \cdot d_x + d_y \cdot d_y}$
 - $d_x = |x_n x_{goal}|, d_y = |y_n y_{goal}|$



GAMES104





A* – NavMesh Walkthrough



A* algorithm	
Graph: Explore Neighbours	
Greedy: Stop once reached	
Least Cost First Explore	1(
	1
TotalCost	15
=	1;
Cost + Heuristic	14
	1
	10
	1'
	18
Raw Path	19
	20
	2
	2
	2

Algorithm 1 A* 1: openList \Leftarrow empty list of nodes 2: closedList \Leftarrow empty list of nodes 3: startNode.f $\Leftarrow 0$ 4: add startNode to openList 5: while openList is not empty do currentNode \Leftarrow the node with the least f value 6: remove currentNode from openList 7: add currentNode to closedList 8: if currentNode is goal then 9: backtrack to get path, terminate 0: end if 1: children \Leftarrow the adjacent nodes 2: for all child in children do 3: if child is in closedList then 4: continue 5: end if 6: $g \leftarrow currentNode.g + distance(child, currentNode)$ 7: if child is in openList and a then 8: if g > child.g then 9: continue 0:end if 1: else 2: add child to openList 3: end if 24: child.g \Leftarrow g 25: $child.h \Leftarrow heuristic of distance(child, goal)$ 26: $child.f \Leftarrow child.g + child.h$ 27: end for 28: 29: end while



A* – Heuristic

- h(n) controls A*'s behavior:
 - With 100% accurate estimates, get shortest paths quickly
 - Too low, continue to get shortest paths, but slow down
 - Too high, exit early without shortest path
- Balance between pathfinding speed and accuracy





GAMES104

low h(n)


Path Smoothing

- Why we need path smoothing
 - Zigzag, many unnecessary turns
- "String Pulling" Funnel Algorithm













Path Smoothing – Funnel Algorithm (1/2)

- The scope of the funnel is the possible scope of the path
- Narrow the funnel if necessary to fit the portal







Path Smoothing – Funnel Algorithm (2/2)

Terminate when the goal is in the funnel









NavMesh Generation – Voxelization

Sample collision scene by voxelization







NavMesh Generation – Region Segmentation (1/4)

• Calculate the distance of each voxel to border

Mark border voxels

• Mark border voxels by AgentRadius to avoid clipping

5.545 ms / 403Tris / 1.6kE



max

GAMES104

Distance to the border



NavMesh Generation – Region Segmentation (2/4)

Watershed Algorithm

- Gradually "flood" the "terrain"
- Form "watershed" (dividing ridge) when "pools" meet







BOOMING

GAMES104





NavMesh Generation – Region Segmentation (3/4)

Segment the "neighboring" voxels into regions to provide a good basis for polygon mesh









NavMesh Generation – Region Segmentation (4/4)

Regions don't have overlapping voxels in 2D



Top-down view of regions





NavMesh Generation – Mesh Generation

Generate NavMesh from segmented regions







NavMesh Advanced Features – Polygon Flag

Useful for marking terrain types: plains, mountain, water, etc.

- "Paint colors" to add user-defined regions
- Polygons generated from user-defined regions have special flag





GAMES104





NavMesh Advanced Features – Tile

- Fast for responding to dynamic objects
- Avoid rebuilding the entire NavMesh
- TileSize trade-off between pathfinding and dynamic rebuilding performance



Death Stranding





NavMesh Advanced Features – Off-mesh Link

Allow agents to jump or teleport







without off-mesh link

with off-mesh link

jump in Death Stranding





Steering



From Path to Motion

- Cars cannot follow planned path exactly
- Motion of cars are limited by theirs motion abilities:
 - Linear acceleration (throttle/brake)
 - Angular acceleration (steering force)
- Motion needs to be adjusted according to the limits



G/AMES104



BOOMING

G/AMES104





Steer the agent towards / away from the target

- Position matching in the nature
- Accelerate with max acceleration towards / away from the target
- Will oscillate around the target
- Input:
 - Self position
 - Target position
- Output:
 - Acceleration



BOOMING

GAMES104







Seek / Flee Variations

Modifying the target in runtime can generate new steering behaviors



Pursue



Wander



Path Following



Flow Field Following





Matches the target velocity

- Calculate acceleration from matching time and velocity differences
- Clamp the acceleration by maximum acceleration of agents
- Input:
 - Target velocity
 - Self velocity
 - Matching time
- Output:
 - Acceleration



BOOMING

GAMES104

Arrive





Align

Matches target orientation

- Input:
 - Target orientation
 - Self orientation
- Output:
 - Angular acceleration







Crowd Simulation





Crowd

A large group of individuals share information in the same environment alone or in a group

- Collision avoidance
- Swarming
- Motion in formation









Crowd Simulation Models

- Started from "Boids" system of Reynolds
- Three families of models:
 - Microscopic models
 - "Bottom-Up"
 - Focus on individuals
 - Macroscopic models
 - Crowd as a unified and continuous entity
 - Mesoscopic models
 - Divide the crowd into groups



GAMES104

C. W. Reynolds Flocks, Herds, and Schools: A Distributed Behavioral Model





Microscopic Models – Rule-based Models

Flock dynamics of animal crowds as an emergent behavior by modeling motion of each individuals with simple predefined rules:

- Separation: to steer away from all of its neighbors
- Cohesion: to steer towards the "center of mass"
- Alignment: to line up with agents close by



Separation



Cohesion



Alignment





Microscopic Models – Rule-based Models



Easy to implement, but not suitable to simulate complex behavior rules





Simulate crowd motion from a macro perspective

- Treat the crowd as a unified and continuous entity
- Control motions with potential field or fluid dynamics
- Does not consider interactions between individuals and the environment in individual level





Flow Field In UE5 MassAl







Mesoscopic Models

Simulate crowd motion taking care of both details and the whole

- Divide the crowd into groups
- Deals with interactions between groups and individuals in each group
- combinations of microscopic models and formation rules or psychological models









Collision Avoidance – Force-based Models

- A mixture of socio-psychological and physical forces influencing the behavior in a crowd
- The actual movement of an individual depends on the desired velocity and its interaction with the environment
- Can simulate dynamical features of escape crowd panic







Collision Avoidance – Force-based Models

Pros:

- can be extended to simulate more emergent behaviors of human crowds
 Cons:
- Similar to physics simulation, simulation step should be small enough





Collision Avoidance – Velocity-based models

Consider the neighbor information to make decisions in velocity space

GAMES104

- able to simulate in local space
- applied to collision avoidance

Reciprocal Velocity obstacle methods – Current standard collision avoidance algorithms

- Velocity Obstacle (VO)
- Reciprocal Velocity Obstacle (RVO)
- Optimal Reciprocal Collision Avoidance (ORCA)





- Calculate its own dodge velocity, assuming other agent is unresponsive
- Appropriate for static and unresponsive obstacles
- Overshoot
- Causes oscillation between two agents attempting to avoid each other



G/AMES104





- Assuming the other agent is using the same decision process (mutually cooperating)
- Both sides move half way out of the way of a collision
- Only guarantees no oscillation and avoidance for two agents

Optimal Reciprocal Collision Avoidance (ORCA)







Sensing





Sensing or Perception









Internal Information

- Information of the agent itself
 - Position
 - HP
 - Armor status
 - Buff status
 - . . .
- Can be accessed freely







Static Spatial Information





Navigation Data



Smart Object





Tactical Map



Cover Point

Dynamic Spatial Information (1/2) – Influence Map





Influence has increased



BOOMING

GAMES104

Marks on navigation data



Sight Area




Dynamic Spatial Information (2/2) – Game Objects

GAMES104

- Information being sensed from a character
- Multiple character information can exist for a single character as it can be sensed by multiple agents
- Usually contains:
 - Game Object ID
 - Visibility
 - Last Sensed Method
 - Last Sensed Position



Sensing Simulation

- Light, sound, and odor travels in space
- Have max traveling range
- Attenuates in space and time with different patterns
 - Sight is blocked by obstacles
 - Smelling ranges shrinks over time
- Radiating field can simulate sensing signals
 - Can be simplified as Influence Map
 - Agents covered by the field can sense the information



GAMES104





GAMES104

Classic Decision Making Algorithms



Decision Making Algorithms

- Finite State Machine
- Behavior Tree
- Hierarchical Tasks Network
- Goal Oriented Action Planning
- Monte Carlo Tree Search
- Deep Learning







Finite State Machine

- Change from one State to another according to some Conditions
- The change from one state to another is called a **Transition**







Finite State Machine









Finite State Machine – Pros & Cons

Pros

- Easy to implement
- Easy to understand
- Very fast to deal with simple case

Cons

- Maintainability is bad, especially add or remove state
- Reusability is bad, can't used in other projects or characters
- Scalability is bad, hard to modify for complicated case



For Complicated Case





Hierarchical Finite State Machine (HFSM)

Tradeoff between reactivity and modularity

- Reactivity: the ability to quickly and efficiently react to changes
- Modularity: the degree to which a system's components may be separated into building blocks, and recombined







Behavior Tree (BT)





Behavior Tree

Focus on state abstraction and transition conditions

Similar to human thinking:

- If ghost close, run away
- But if I'm powerful, chase it
- Otherwise, eating







?

Behavior Tree – Execution Nodes

Execution node (leaf node)

- Condition node
- Action node







Control flow node (internal node)

- Control flow determined by the return value of child nodes
- Each node has a return value which is success, failure or running



Eat Pills





Control Node – Sequence (1/2)

- Order
 - Execute children from left to right
- Stop Condition and Return Value
 - until one child returns *Failure* or *Running*, then return value accordingly
 - or *all children return Success*, then return *Success*
- If Stop and Return Running
 - the next execution will start from the *running* action



Algorithm 1 Sequence Node

- 1: for all child in children do
- 2: $\operatorname{childStatus} \leftarrow \operatorname{tick}(\operatorname{child})$
- 3: **if** childStatus is Running **then**
 - status \Leftarrow Running, terminate
- 5: else if childStatus is Failure then
 - status \Leftarrow Failure, terminate
- 7: end if
- 8: end for

4:

6:

9: status \Leftarrow Success





Control Node – Sequence (2/2)

Sequence

• Allows designers to make a "plan"







Control Node – Selector (1/2)

- Order
 - Execute children from left to right
- Stop Condition and Return Value
 - until one child returns Success or Running, then return value accordingly
 - or *all children return Failure*, then return *Failure*
- If Stop and Return Running
 - the next execution will start from the *running* action



GAMES104

Algorithm 2 Selector Node

- 1: for all child in children do
- 2: $\operatorname{childStatus} \leftarrow \operatorname{tick}(\operatorname{child})$
- 3: **if** childStatus is Running **then**
 - status \Leftarrow Running, terminate
- 5: else if childStatus is Success then
 - status \leftarrow Success, terminate
- 7: end if
- 8: end for

4:

6:

9: status \Leftarrow Failure





Control Node – Selector (2/2)

Selector

- Could select one action to do response to different environment
- Could do the right thing according to priority







Control Node – Parallel (1/2)

Order

- Logically execute all children simultaneously
- Stop Condition and Return Value
 - Return **Success** when at least **M** child nodes (between 1 and N) have succeeded
 - Return *Failure* when at least N M + 1 child nodes (between 1 and N) have failed
 - Otherwise return *Running*
- If Stop and Return Running
 - the next execution will start from the running actions



GAMES104

- Algorithm 3 Parallel Node
 - 1: for all child in children do
 - 2: childStatus \leftarrow tick(child)
 - 3: end for
 - 4: if number of Success childStatus $\geq M$ then
 - 5: status \Leftarrow Success, terminate
 - 6: else if number of Failure childStatus > N M then
 - 7: status \Leftarrow Failure, terminate
 - 8: end if
 - 9: status \Leftarrow Running





Control Node – Parallel (2/2)

Parallel

• Could do multiple things "at the same time"









Behavior Tree

Execution nodes

- Action
- Condition

Control flow nodes

- Sequence
- Selector
- Parallel

Node Type	Symbol	Succeeds	Fails	Running
Sequence	\rightarrow	If all children succeed	If one child fails	If one child returns Running
Selector	?	If one child succeeds	If all children fail	If one child returns Running
Parallel	†	If $\geq M$ children succeed	If > N - M children fail	else
Condition	text	Upon completion	If impossible to complete	During completion
Action	text	If true	If false	Never



Tick a Behavior Tree

- The tick of BT is like thinking
- Every tick start from root node
- Go through different nodes from up to down, left to right
- Each node must return failure, success or running



BOOMING

GAMES104



Behavior Tree – Decorator (1/2)

Decorator

- A special kind of control node with a single child node
- Usually some behavior pattern which is commonly used



- For example, some common policies:
 - Loop execution
 - Execute once
 - Timer
 - Time Limiter
 - Value Modifier
 - Etc.



Examples of Decorator Nodes







Behavior Tree – Decorator (2/2)

Decorator

• Example: Use timer to implement "patrol"







Behavior Tree – Precondition







Behavior Tree – Blackboard

Blackboard : the memory of behavior tree







Behavior Tree – Pros (1/2)

- Modular, Hierarchical organization
 - each subtree of a BT can be seen as a module, with a standard interface given by the return statuses
- Human readable
- Easy to maintain
 - Modification only affect parts of tree







Behavior Tree – Pros (2/2)

- Reactivity
 - Think every tick to quickly change behavior according to environment
- Easy to Debug
 - Every tick is a whole decision making process, so taht it is easy to debug







Behavior Tree – Cons

Cons

- Each tick starts from root node which costs much more
- The more reactive, the more condition to be checked and the more costs per tick





Upcoming: AI Planning and Goals

To make the AI more deliberative, game designers introduced the AI Planning technique to improve the planning ability of AI

AI Planning:

- Manage a set of actions
- A planner make a plan according to the initial world state







References





Navigation

• Amit Patel's fabulous website with animated demonstration of pathfinding algorithms:

http://theory.stanford.edu/~amitp/GameProgramming/

- In-depth explanation of Detour Recast Navmesh generation algorithm: <u>http://critterai.org/projects/nmgen_study/</u>
- Al Summit: 'Death Stranding': An Al Postmortem, Eric Johnson, Kojima Productions, GDC 2021: <u>https://gdcvault.com/play/1027144/Al-Summit-Death-Stranding-An</u>
- Getting off the NavMesh: Navigating in Fully 3D Environments, Dan Brewer, Digital Extremes, GDC 2015: <u>https://gdcvault.com/play/1022016/Getting-off-the-NavMesh-Navigating</u>
- Mikko Mononen, Author of Recast Detour, blog on Funnel Algorithm :

http://digestingduck.blogspot.com/2010/03/simple-stupid-funnel-algorithm.html?m=1





Steering & Sensing

 Steering Behaviors For Autonomous Characters, Craig W. Reynolds, Sony Computer Entertainment America:

https://www.researchgate.net/publication/2495826_Steering_Behaviors_For_Autonomous_Characters

- Al For Games, Ian Millington, 3rd Edition, CRC Press, 2019
- Knowledge is Power, an Overview of AI Knowledge Representation in Games, Daniel Brewer: http://www.gameaipro.com/GameAIProOnlineEdition2021/GameAIProOnlineEdition2021_Chapter04_Knowledge_is_Power_an_Overview_of_AI_Knowledge_Representation_in_Games.pdf



Crowd Simulation

 A review on crowd simulation and modeling, Shanwen Yang, Tianrui Li, Xun Gong, Bo Peng, Jie Hu: <u>https://www.sciencedirect.com/science/article/abs/pii/S1524070320300242</u>

GAMES104

- Forced-Based Anticipatory Collision Avoidance in Crowd Simulations, Stephen Guy, Ioannis Karamouzas, University of Minnesota, GDC 2015: <u>https://www.gdcvault.com/play/1022465/Forced-Based-Anticipatory-Collision-Avoidance</u>
- RVO and ORCA How They Really Work, Ben Sunshine-Hill:

https://www.taylorfrancis.com/chapters/edit/10.1201/9780429055096-22/rvo-orca-ben-sunshine-hill

- RVO2 Library: Reciprocal Collision Avoidance for Real-Time Multi-Agent Simulation, Jur van den Berg, et al.: <u>https://gamma.cs.unc.edu/RVO2/</u>
- Documentation of AI systems in Unreal Engine 5: <u>https://docs.unrealengine.com/5.0/en-US/artificial-intelligence-in-unreal-engine/</u>





Classical Decision Making Algorithms

 Behavior Trees in Robotics and AI: an Introduction, Michele Colledanchise and Petter Őgre, 1st Edition, CRC Press, 2018,

https://www.researchgate.net/publication/319463746_Behavior_Trees_in_Robotics_and_AI_An_Introd uction

- The Behavior Tree Starter Kit, Alex Champandard, Philip Dunstan, Game Al Pro, 2013: <u>http://www.gameaipro.com/GameAlPro/GameAlPro_Chapter06_The_Behavior_Tree_Starter_Kit.pdf</u>
- FSM: Finite-State Machines: Theory and Implementation,

https://gamedevelopment.tutsplus.com/tutorials/finite-state-machines-theory-and-implementation-gamedev-11867

 Managing Complexity in the Halo 2 AI System, Damian Isla, Moonshot Games, GDC 2005: <u>https://www.taylorfrancis.com/chapters/edit/10.1201/9780429055096-22/rvo-orca-ben-sunshine-hill</u>



-



Lecture 16 Contributor

- Olorin
- 新之助

大喷 並並 -

- 喵小君 -将

- Hoya











Enjoy;) Coding



Course Wechat

Follow us for further information