# Automated Path Prediction for Redirected Walking Using Navigation Meshes

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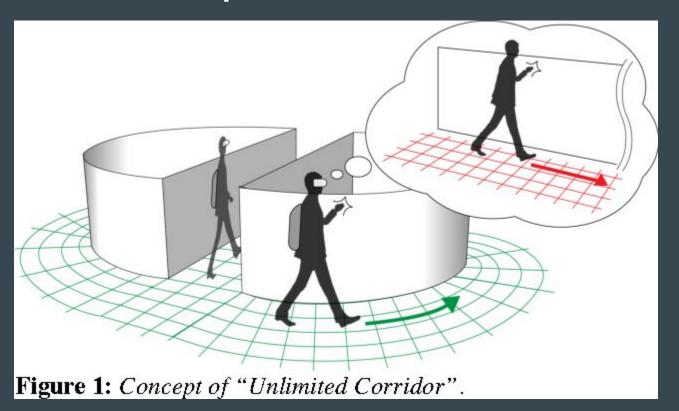
#### Preface

- To simulate a large virtual environment in a fixed small physical tracked area.
- How to simulate an infinite corridor in a small room?
- How to provide an illusion of a huge space in a small room?
- How to steer the user away from the physical area's boundary?

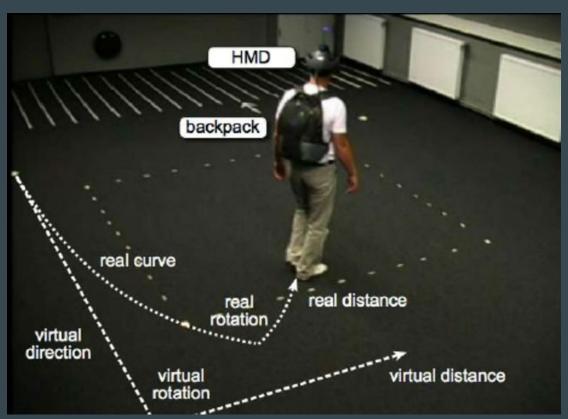
# Redirected Walking (RDW)

- Introduce subtle, unnoticeable discrepancies between the user's physical and virtual motions.
- Discrepancies build up over time physical and virtual trajectories diverge.
- Strategically steer users away from the boundaries of the physical tracked space to enable exploration of large virtual environments.

# **Example - Infinite corridor**



# **Example - RDW**



## **Existing Algorithms for RDW**

- Steer-To-Center
- Steer-To-Orbit
- MPCRed
- FORCE

Why the need for automation?

#### **Need for automation**

- The adoption of such algorithms requires annotation of virtual environments with graphs describing possible user trajectories.
- When done manually such annotations can be both tedious to generate and insufficiently flexible at run-time.
- Significant deviation from expected path while exploring open areas affects performance.

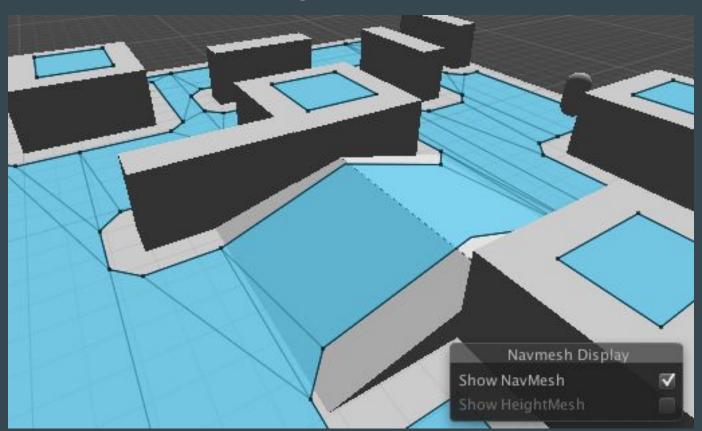
# **Proposed Solution**

- Automatically predict user's short term trajectories using Navigation Meshes.
- No need to manually annotate the environment to a graph.
- Dynamic adjustments to path predictions based on current user position.
- Generate a short term graph at user's position and use existing algorithms on it.

#### **Details**

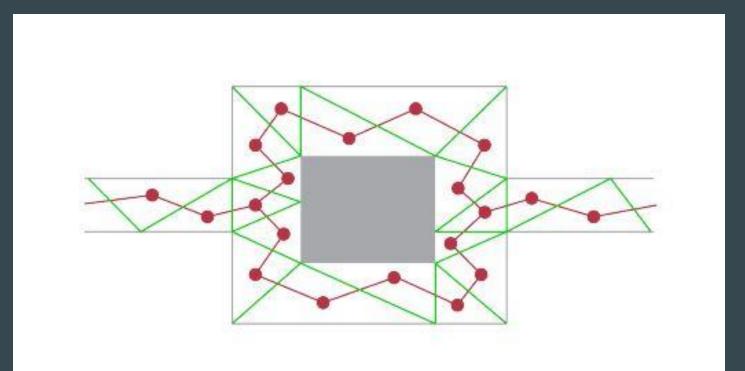
- Model the environment as navmeshes.
- These can be generated automatically well known algorithms exist.
- Breaks the environment down into convex polygons
- Readily available in commercial game authoring platforms such as Unity3D and Unreal.

# Navigation Mesh



## The Algorithm

Step 1: Model the navmesh as a navgraph - each polygon is a node.



# The Algorithm - continued

Step 2: Find the node *S* in the graph corresponding to the user's current location.

Step 3: Use this graph to find all possible paths originating from *S* and not exceeding path length *d*.

Step 4: Obtain a set of *branching nodes B* and set of *terminal nodes T* and the *connectivity function prevPG[]* between the nodes in *B* and *T*.

# The Algorithm - Last Step

Step 5: Construct the prediction graph. Define V as the union of starting node S, branch nodes B, and terminal nodes T.

Using the information encoded in *prevPG[]*, we add appropriate edges between the vertices. We also add edges lost between neighbours in the original navgraph.

Step 6: Perform navmesh funnelling which yields shortest path from the polygons.

Step 7: Add the shortest path between each vertex *v* and its predecessor *prevPG[v]*.

#### Algorithm 1 Generate path prediction graph

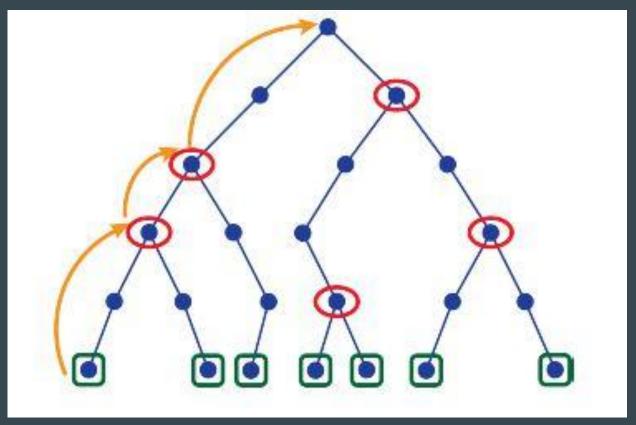
```
function PathPredictionGraph(Pos, NavGraph, d):
Find polygon node S in NavGraph containing Pos
S.position \leftarrow Pos
B, T, prevPG[] \leftarrow DepthLimitedDijkstra(NavGraph, S)
Define V \leftarrow B \cup T \cup S
for all vertices u and v in V do
   if \{u,v\} \in NavGraph.edges then
            add {u,v} to E
for all vertices v in V do
   V \leftarrow V \cup path(v, prevPG[v]).vertices
   E \leftarrow E \cup path(v, prevPG[v]).edges
return V, E
```

```
function DepthLimitedDijkstra(Graph, source, d):
Define vertex sets Q, B, and T
for all vertex v in Graph do
   dist[v] \leftarrow INFINITY
   prev[v] \leftarrow NULL
   add v to Q
dist[source] \leftarrow 0
while Q is not empty do
   \mathbf{u} \leftarrow \text{vertex in } Q \text{ with min dist}[\mathbf{u}]
   remove u from Q
   for all neighbor v of u do
             alt \leftarrow dist[u] + length(u, v)
             if alt < dist[v] then
                      dist[v] \leftarrow alt
                      prev[u] \leftarrow u
   if deg(u) > 2 then
             add u to B
   if T contains prev[u] then
             remove prev[u] from T
   add u to T
   if B contains prevPG[u] then
             prevPG[u] \leftarrow prev[u]
   else
             prevPG[u] \leftarrow prevPG[prev[u]]
   if path(source, u) is longer than d then
             break {path() return shortest navigable path}
return B, T, \text{prevPG}
```

# Modifications in Dijkstra's algorithm

- The depth of the tree is limited by the maximum length of the path d.
- The algorithm constructs a set of branching nodes *B* and terminal nodes *T* and keeps the track of the connectivity between these nodes within the search tree using function *prevPG[]*.
- If deg(u) > 2, we add this vertex to a set of branching nodes B

# Output of modified Dijkstra's algorithm



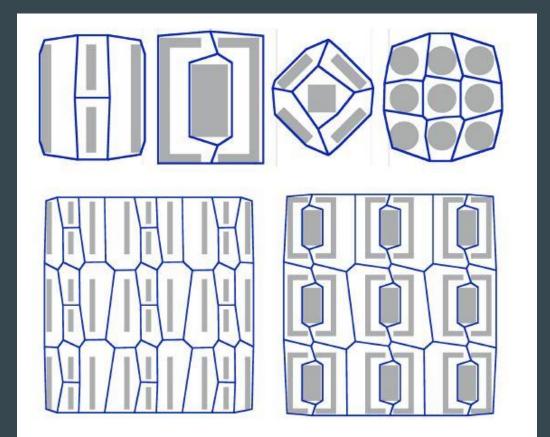
- Green nodes are terminal nodes.
- Red nodes are branch nodes.
- Each node has a pointer to its parent branch/source.
- Path length is restricted = <u>d</u>.

# **Implementation**

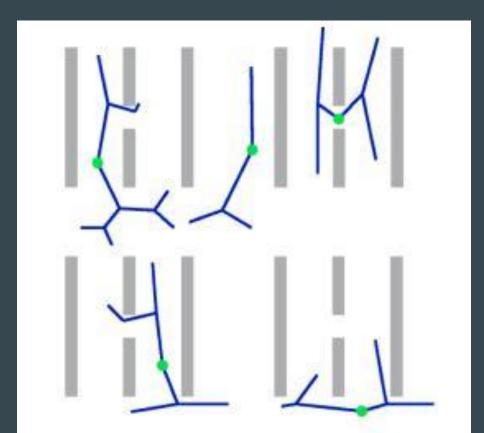
- Implemented in Unity3D
- Instead of using in built shortest path finding algorithms, we used an addon package from the Unity Asset Store.
- The A\* Pathfinding API exposes the navigation graph data structure, making implementation of our algorithm much more straightforward.

# Results

# Using the algorithm on full environments (very large d)

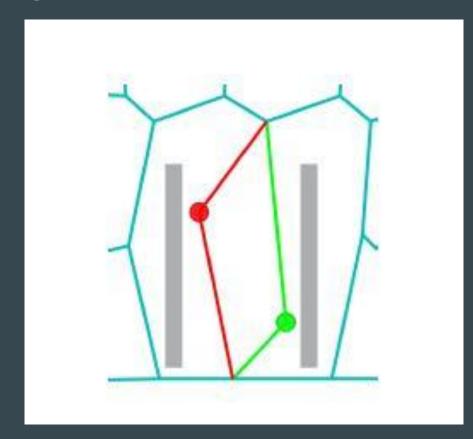


# The algorithm in a practical situation (small d)



# Dynamic graph generation

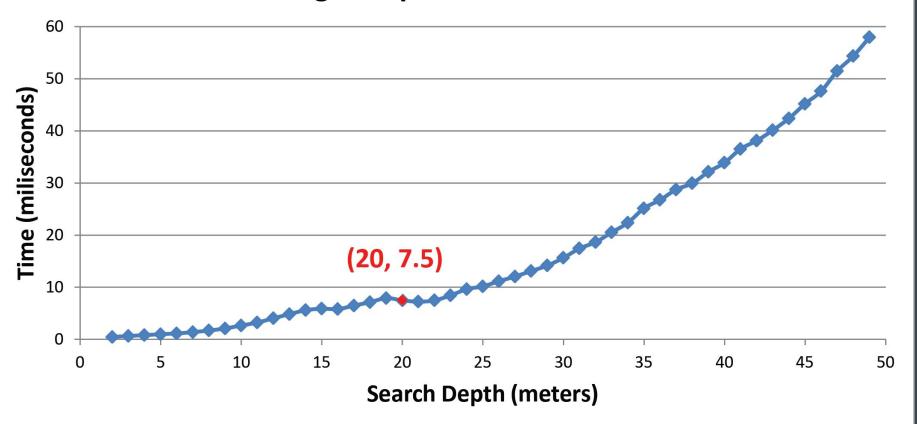
- When a manual annotation is used, path prediction is based on approximating user position by the nearest point on the graph.
- Our algorithm periodically generates short-term path prediction graph relative to current location of the user.



# Graph generation time

- Consider time complexity relative to maximum path length.
- Each point has been averaged over 25 random starting points in the environment.
- On average, our algorithm generated path prediction graphs with search horizon up to 20 meters in 7.5 milliseconds.
- This compares to 82.5 milliseconds for the average planning phase execution of the MPCRed algorithm.
- Thus we can provide updates to the RDW algorithms on every computation cycle.

#### **Average Graph Generation Time**



#### Conclusion

- We have proposed an algorithm to automate path prediction for planning RDW algorithms.
- Tedious manual annotation of an entire environment can be replaced with automatically generated prediction graphs.
- These graphs are local to the user's current position and change dynamically.
- Allows advanced prediction techniques such as forecasting user behavior in non-static environments.

## Image credits

- 1. Matsumoto, Keigo et al. "Unlimited corridor: redirected walking techniques using visuo haptic interaction." *SIGGRAPH Emerging Technologies* (2016).
- 2. Steinicke, Frank & Bruder, Gerd & Hinrichs, Klaus & Jerald, Jason & Frenz, Harald & Lappe, Markus. (2011). Real Walking through . . . . . . . . JVRB Journal of Virtual Reality and Broadcasting; 6(2009), 2.
- 3. https://forum.unity.com/threads/converting-unity-navmesh-to-regular-mesh-via-script-leads-to-imperfect-result.276893/

# Thank You