# Crowd Simulation

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#### **Crowds**



#### **Crowd Simulations**



Herding behaviour

Urban Planning



**Evacuation simulation** 

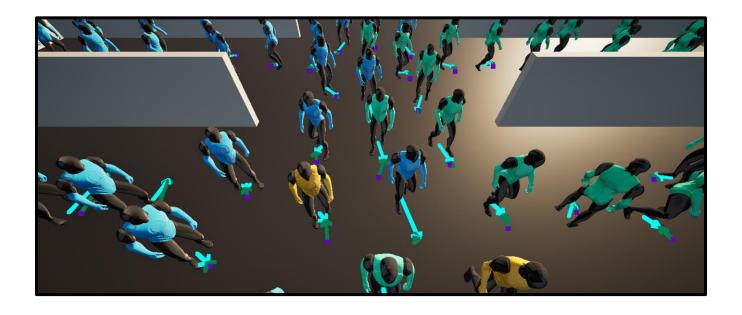


Animation and movies

Games



#### Microscopic paradigm



#### Crowd Simulations

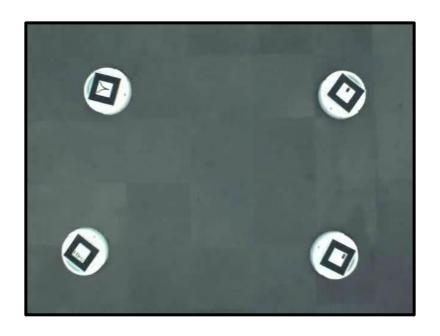
### **Local navigation**



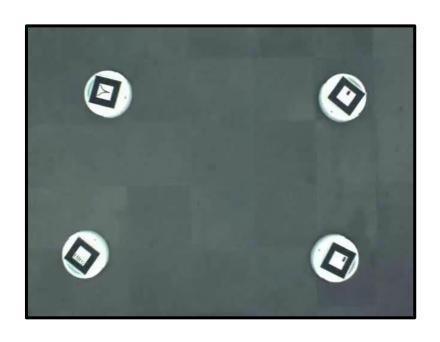
#### Optimal Reciprocal Collision Avoidance (ORCA)



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#### Required data:

- 1. Radius of circular collider
- 2. Velocity
- 3. Position

#### **Steps**

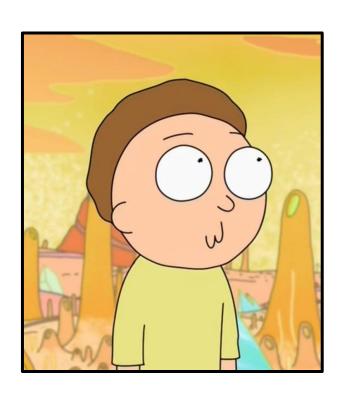


#### Three-step process:

- 1. Calculate the set of velocities that would result in a collision (VO).
- 2. Select the optimal velocity outside all velocity obstacles and is closest to preferred velocity.
- 3. Update the agent's velocity to this new, safe value.



#### How do we do this?



#### Three-step process:

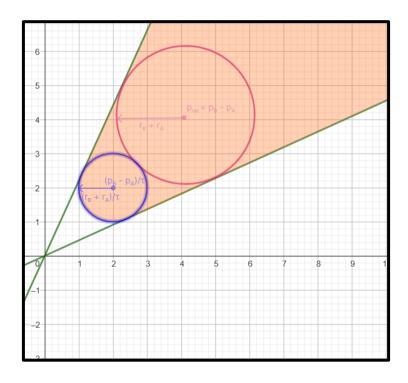
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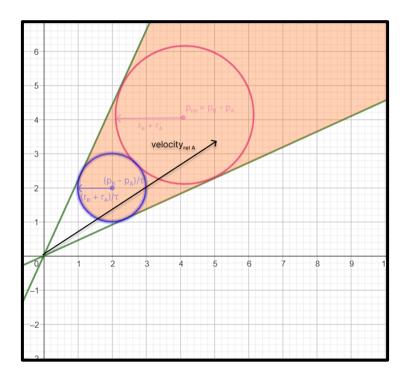
### **Velocity obstacles**

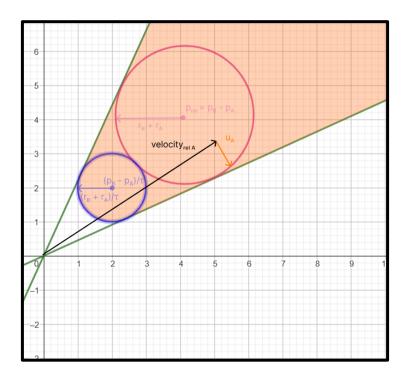


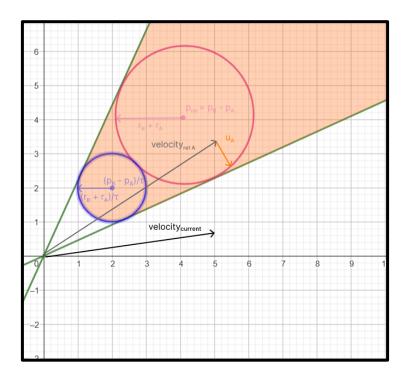
\*Do not look at the picture if you are younger than 18.

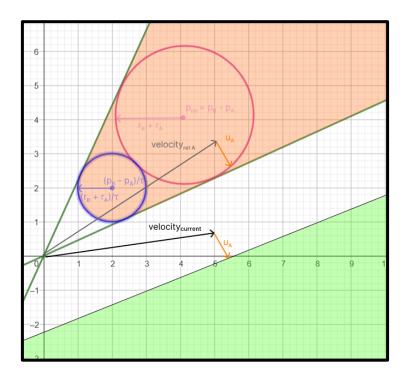
#### **Velocity obstacles**



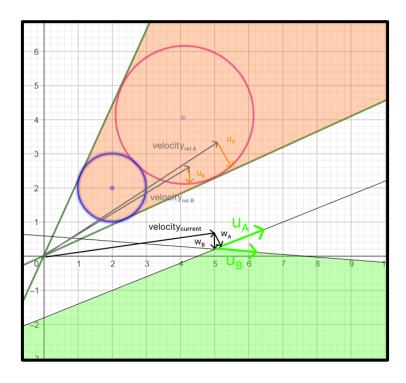




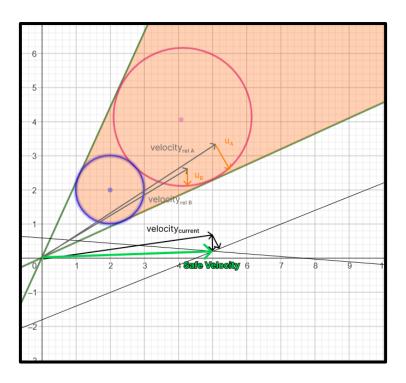




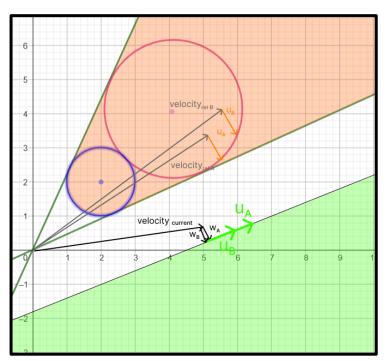


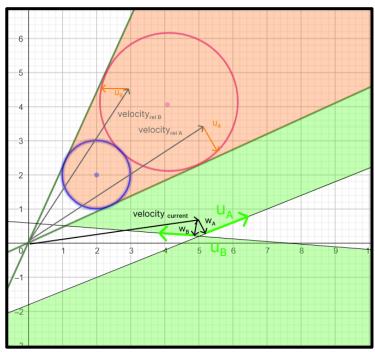


### **Update velocity**



#### **Edge cases**





Parallel or the same lines

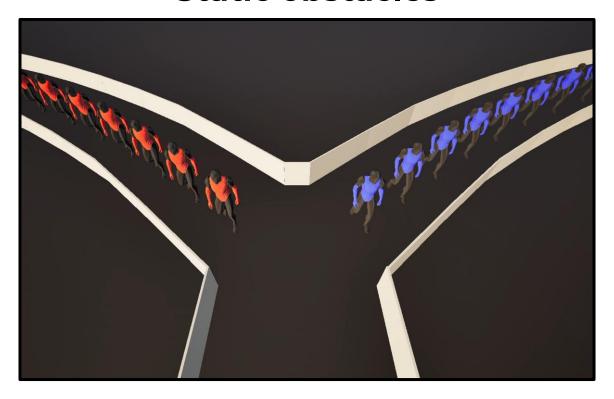
Opposing lines



### **Example**

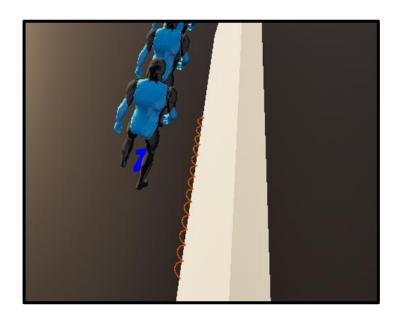


#### **Static obstacles**



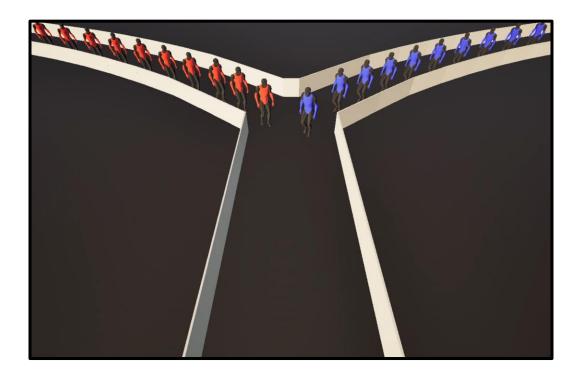
#### **Static obstacles**

#### **Split into circles**



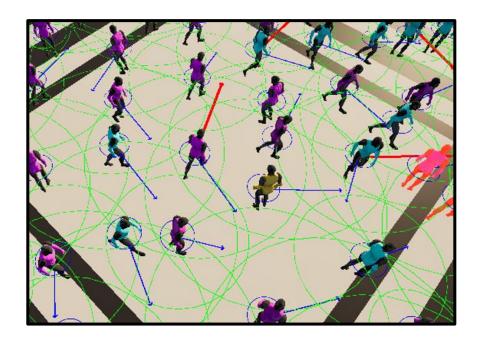


#### **Static obstacles**

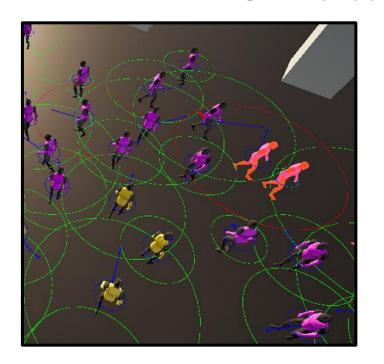


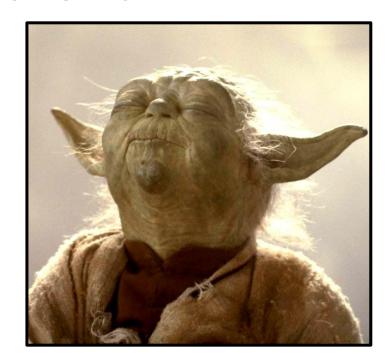
## **Universal Power Law**

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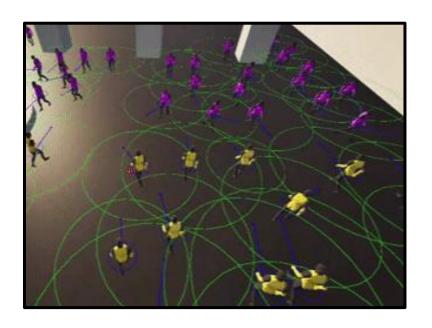


#### **Universal Power Law**





#### Steps



#### Main steps:

- 1. Calculate  $\tau$  (time-to-collision)
- 2. Check Collision
- 3. Calculate Interaction Energy
- 4. Calculate Avoidance Force
- 5. Pray to evade

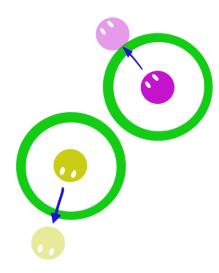
#### Time-to-collision

Tau(T) = time-to-collision

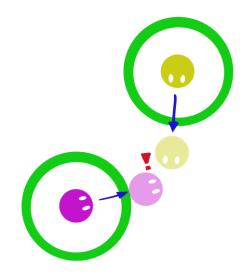
$$au = rac{\left(-dp\cdot dv
ight.
ight)}{\left|dv
ight|^2}$$

#### Time-to-collision

Tau(T) = time-to-collision



T is more than 3s or negative ==> No collision



T is less than 3s ==> Collision!



#### **Interaction Energy**

$$E( au) = rac{k}{ au^2} \cdot e^{- au/ au_0}$$

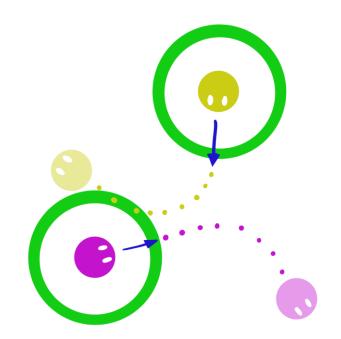
When E increases ==> T decreases



#### **Avoidance Force**

Gradient of Energy function

$$F_{ij} = -
abla_{p_{ij}} E( au)$$



#### **Gradient respect to the position**

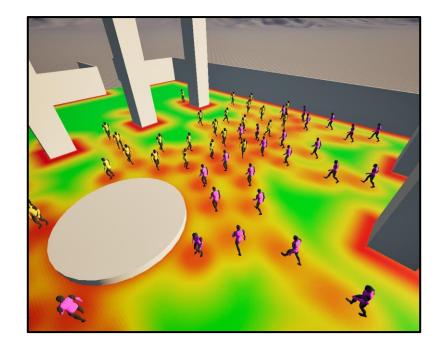
$$F_{ij} = - \Bigg[ rac{k e^{- au/ au_0}}{\left|v_{ij}
ight|^2 \, au^2} igg( rac{2}{ au} + rac{1}{r_0} igg) \Bigg] \Bigg[ v_{ij} - rac{\left|v_{ij}
ight|^2 \, r_{ij} - \left(p_{ij} \cdot v_{ij}
ight) \, v_{ij}}{\sqrt{\left(p_{ij} \cdot v_{ij}
ight)^2 - \left|v_{ij}
ight|^2 \left(\left|p_{ij}
ight|^2 - \left(R_i + R_j
ight)^2
ight)}} \Bigg]$$



Credits to Karamouzas

# WarpDriver

### **Collision probability fields**

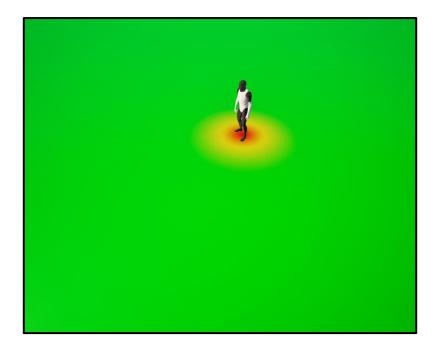


#### **Probability function**

$$P(d) = e^{\left(-\frac{d^2}{2\sigma^2}\right)}$$

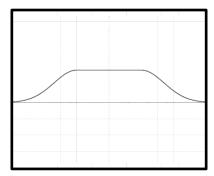


#### **Position**

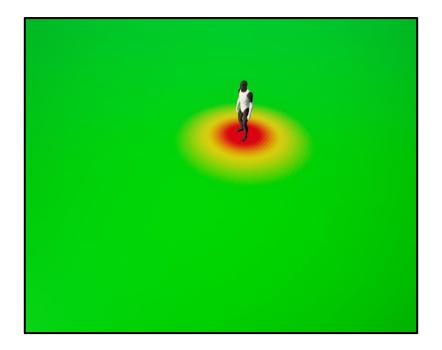


### **Probability function**

$$P(d) = e^{\left(-\frac{(d-R)^2}{2\sigma^2}\right)}$$

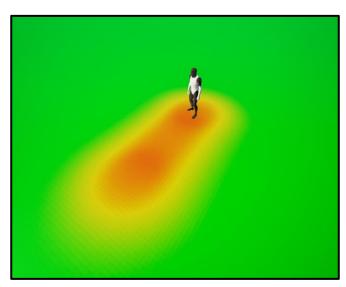


#### Size



# **Velocity and Time horizon**

$$\Delta t = \frac{T}{N}$$

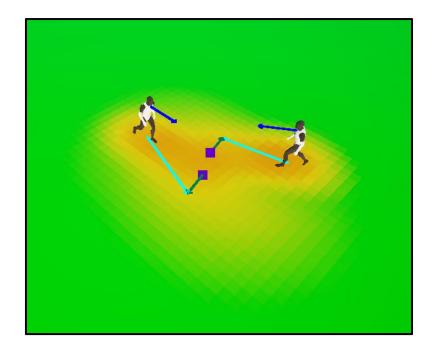


### Time uncertainty

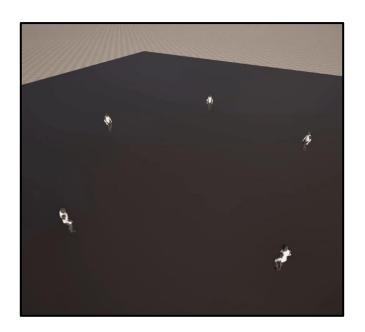
- Reduced Confidence Near the Agent:  $\alpha(t) = \frac{1}{1 + \lambda t}$   $P' = \alpha(t) \cdot P$
- Increased Spread:  $\sigma(t) = \sigma + \gamma \cdot t$

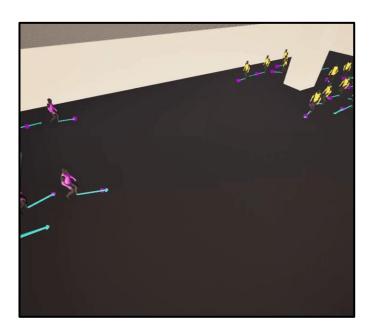


#### **Collision avoidance**

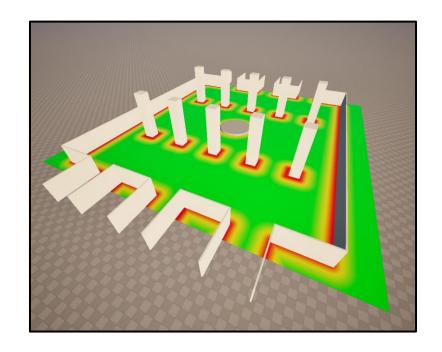


# **Examples**



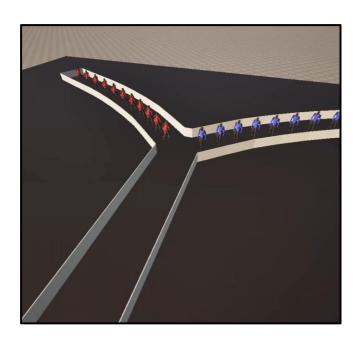


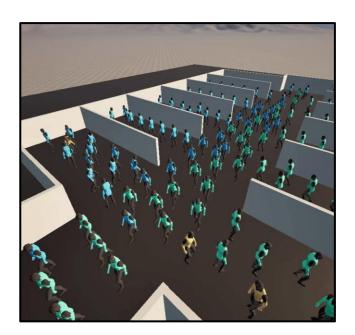
#### Static obstacles with non-cylindrical shapes



# Following behavior

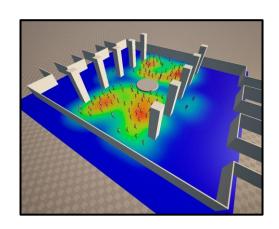
# **Examples**

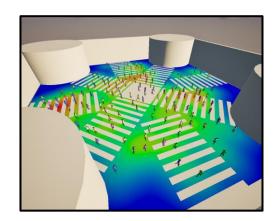




# **DenseSense**

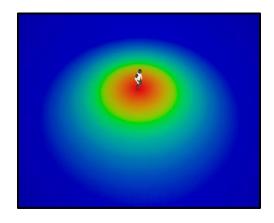
# **Density awareness**





# **Crowd density function**

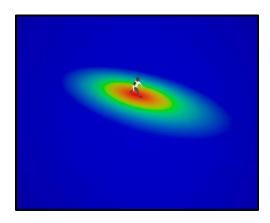
$$w(d) = \frac{1}{\sqrt{2\pi\sigma}} e^{\left(-\frac{d^2}{2\sigma^2}\right)}$$



### Elliptical personal space

$$d' = 2.5(d - D)$$

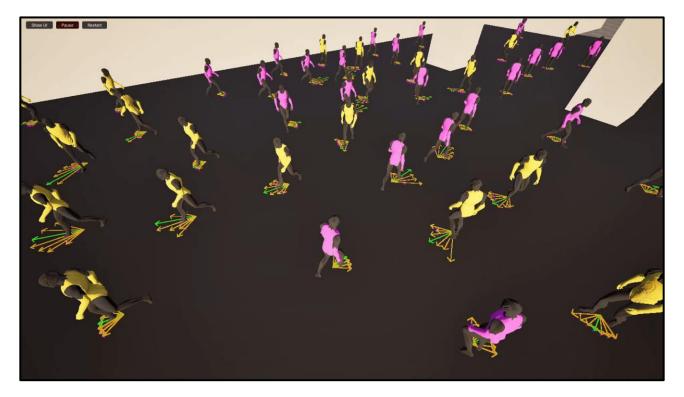
$$D = (d \cdot v_{\theta}) \cdot v_{\theta}$$



#### Selection of preferred velocity

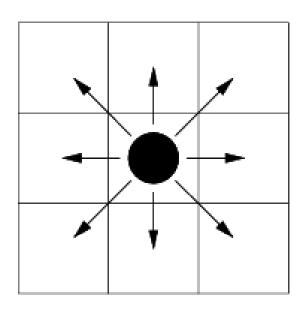


# **Example: Hall**



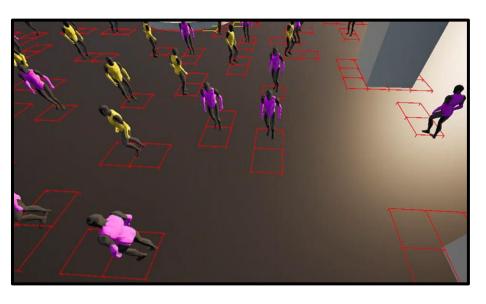
# **Cellular Automata**

#### **Steps**



- 1. Check the state of the current cell 8 neighbors.
- 2. Cell is occupied, then skip it.
- 3. Cell is not occupied, then calculate distance to the goal.
- 4. If the distance is shorter than the previous neighbor cell, then keep it as the best result.

#### **Occupied State**

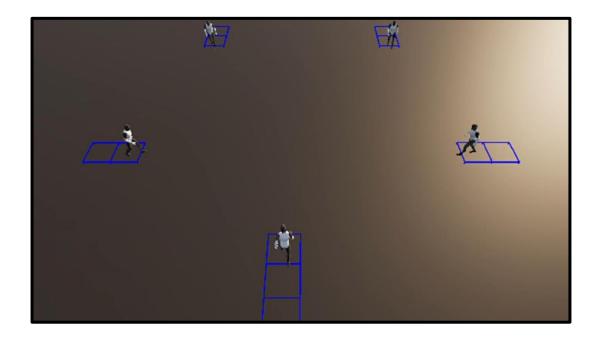


- Static Obstacles or current Agent cell (Red).
- The next cell an Agent will move to (Red).
- Neighbor cell has at least 4 occupied neighbors (Yellow).

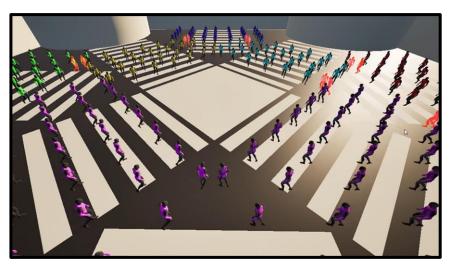
#### **Static Floor Field**

500	500	500	500	500	500	500	500	500	500	500	500	500	500	500	500	500	500	500	500
	40.7	47	53.8	60.5	67.7	75.5	88.5	102	117	132	149	166	184	203	223	243	260	273	
500	28.9	34.4	40.2	47.2	54.6	67.7	81.1	94.6	109	124	140	157	175	194	214	234	253	268	
	19.8	23.9	28.8	34.8	47.2	60.5	74.2	87.5	102	117	133	149	167	186	205	225	246	263	
	12.5	15.8	19.9	28.8	40.2	53.8	67.2	80.9	94.8	110	125	142	159	178	197	217	238	257	
	7.27	9.87	15.8	23.9	34.4	47	60.7	74.8	88.5	103	118	135	152	170	189	209	230	251	
500	3.83	7.27	12.5	19.8	28.9	40.7	54.6	68.4	82.6	96.9	112	128	145	163	182	209	222	244	
1	2.43	5.32	9.94	16.1	24.4	35.3	48.4	62.5	77.1	91.2	106	122	139	157	175	195	215	236	
1	2.43	5.32	9.94	16.1	24.4	35.3	48.4	62.5	77.1	91.2	106	122	139	157	175	195	215	236	
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		500												500					

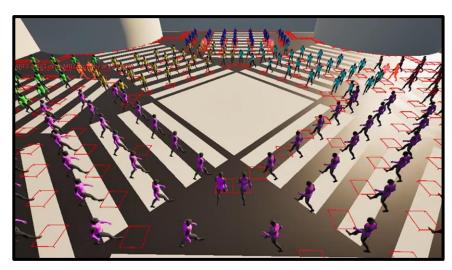
# **Dynamic Floor Field**



# Comparision



Without Floor Field



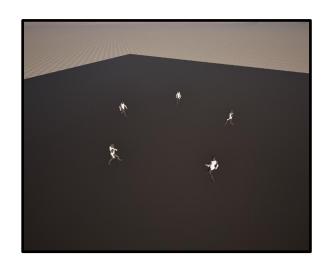
With Floor Field

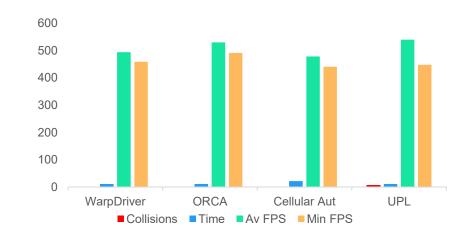
# Algorithm evaluation

#### **Evaluation Metrics**

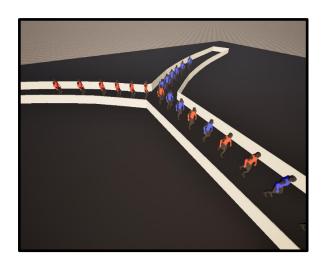
- Collision Count
- Simulation Completion Time
- Computational Cost

#### Circle



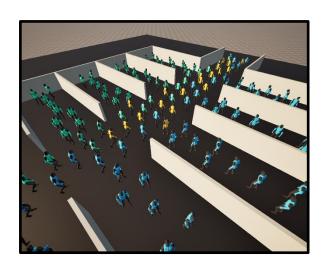


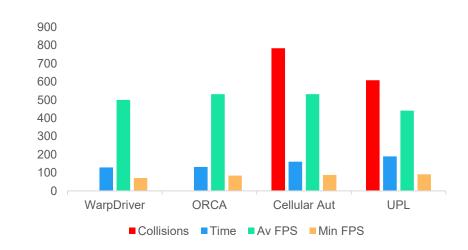
#### **Fork Path**



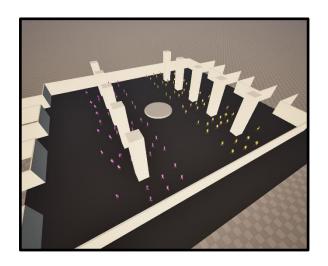


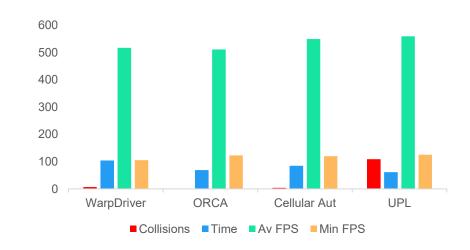
#### Queue



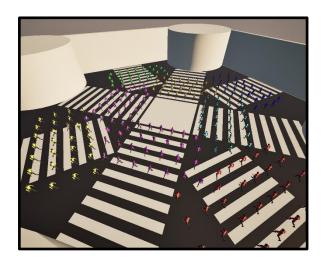


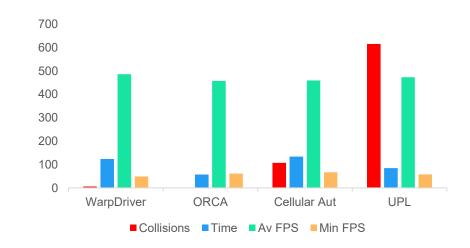
#### Hall



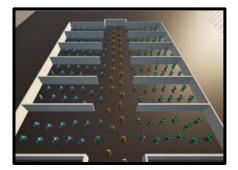


#### Shibuya crossing

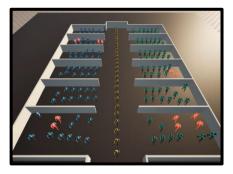


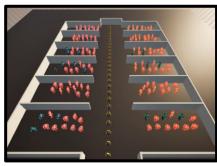


# Conclusions



Orca





Warpdriver

- Natural movement
- Few collisions

- ONo collisions
- Agents arrive fast at destination

**Universal Power Law** 

- Cheap to compute
- Many collisions in dense areas

**Cellular Automata** 

- Cheap to compute
- Many collisions in small areas



# Thank you!



