

## **Changing the Game: Measuring and Influencing Player Emotions Through Meta Al**

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### Meta Al example

### Meta AI (AI Director) controls the whole game...





### Meta Al example

### Meta AI (AI Director) controls the whole game... e.g. weather, enemies, difficulty, story generation...

Left 4 Dead – "From COUNTER-STRIKE to LEFT 4 DEAD: Creating Replayable Cooperative Experiences" (Booth, GDC2009) **TOTAL WAR** - "Battle AI in TOTAL WAR: SHOGUN 2 and Lessons Learned" (Gudmundsson, PGAI 2011) **WARFRAME** - "Space Ninjas with Machineguns!" (Brewer, GDC2013) **Far Cry 4** - "Far Cry's AI: A manifesto for systemic and emergent game-play and open world " (Varnier, GAIC2014) **Assassin's Creed Origins** - "Virtual Insanity: Meta AI on 'Assassin's Creed: Origins'" (Lefebvre, GDC2018) **Final Fantasy XV** - "Eos is Alive: The AI Systems of 'Final Fantasy XV'" (Miyake, GDC2018)

### -> Meta AI is becoming more necessary



## Why?

### Let's start by asking "Why?"

### Why do you make games?



## Why?

Why do we need to try?

### Why do you try to make your games the best?



## Why?

Why do we need to make the game best?

## For me, the reason why: Games are NOT necessary



What will happen if games are not necessary?

GAME = NOT necessary

### Not needed for living... food/sleep/reproduction



What will happen if games are not necessary?

GAME = NOT necessary

### Not needed for living... food/sleep/reproduction Easy to avoid to buy



What will happen if games are not necessary?

GAME = NOT necessary

### Not needed for living... food/sleep/reproduction Easy to avoid to buy Easy to quit



What will happen if games are not necessary?

GAME = NOT necessary

## Not needed for living... food/sleep/reproduction Easy to avoid to buy Easy to quit Why are we working so hard?



What will happen if games are not necessary?

GAME = NOT necessary

### Not needed for living... food/sleep/reproduction Easy to avoid to buy Easy to quit But it makes me excited!



### What should we do?

If it's not necessary, people judge very severely.

# Games are NOT necessary So, we must compel people to play





### What is needed?

If it's not necessary, people judge very severely.

# Games are NOT necessary Good game is NOT enough Better game is still NOT enough BEST game is the only one way



### The way to make the best game is...







The way to make the best game is...





The way to make the best game is...





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# Adapt to different play-styles

The way to make the best game is...





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## Adapt to different play-styles play-skills



The way to make the best game is...





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## Adapt to different play-styles play-skills Make games with Meta Al

### Introduction

- Yuta Mizuno
  - AI technical Game Designer
  - Meta AI research, Advocating and Consulting Meta AI to Products
  - The Meta Al General design
- Daiki Satoi, Ph.D.
  - Al researcher
  - R&D on Meta AI, Game Play Analysis, Character AI
  - The 2D Emotion-based Meta Al



### Meta Al overview

- Why Meta Al
- What is Meta Al



- Meta Al overview
  - Why Meta Al
  - What is Meta Al
- Meta Al General Design
  - How to make Meta Al
  - What can Game Designer do for Meta Al



### Meta Al overview

- Why Meta Al
- What is Meta Al
- Meta Al General Design
  - How to make Meta Al
  - What can Game Designer do for Meta Al
- Meta Al Practical Model
  - Emotion-based Meta AI
  - Visualization for Meta Al





## Takeaways

- Usefulness of Meta Al General Design  $\bullet$
- Using Ru-I-Di-ism with fellow game designers  $\bullet$
- Measuring and influencing player's emotion ۲
- **Benefits of 2D Emotion-based Meta Al**  $\bullet$
- **Importance of Visualizing** gameplay and emotion  $\bullet$



### Meta Al overview

– Why Meta Al?



## Why Meta Al?

The way to make the best game is...







## Why Meta AI?

The way to make the best game is...





## Why Meta Al?

The way to make the best game is...







## Why Meta AI?

The way to make the best game is...







## Why Meta Al?

The way to make the best game is...







## Why Meta Al?

The way to make the best game is...







### Meta Al overview

– Why Meta Al

– What is Meta Al



### What is Meta AI?

### Meta Al is one type of Game Als





### What is Meta AI?

Meta Al is ...

- Senses the whole Game World
- Dynamically controls the whole game



Melee: Ranged:

### What is Meta AI?

- Senses the whole Game World
- Dynamically controls the whole game





### $\rightarrow$ How to implement Meta Al?

### Meta Al overview

- Why Meta Al
- What is Meta Al

### Meta Al General Design



- Meta Al overview
  - Why Meta Al
  - What is Meta Al
- Meta Al General Design
  - How to make Meta AI


## This is a general design of Meta AI.





At the beginning, consider an agent architecture, well known in the robotics field.





At the beginning, consider an agent architecture, well known in the robotics field.





At the beginning, consider an agent architecture, well known in the robotics field.





At the beginning, consider an agent architecture, well known in the robotics field.





At the beginning, consider an agent architecture, well known in the robotics field.





At the beginning, consider an agent architecture, well known in the robotics field.





Then, compare the general design of Meta AI to the agent architecture.





Then, compare the general design of Meta AI to the agent architecture.





Then, compare the general design of Meta AI to the agent architecture.





Then, compare the general design of Meta AI to the agent architecture.





Then, compare the general design of Meta AI to the agent architecture.





Then, compare the general design of Meta AI to the agent architecture.





We can see that Meta AI is similar to character AI.





We can see that Meta AI is similar to character AI.













## Main Part Of Meta Al

The explanation of the Meta AI main part is finished. Let's move to the game world part.





## Game World For Meta Al

### What information is usable by the Meta AI in the game world?





## **Game World For Meta Al**

### What information is usable by the Meta AI in the game world?





## Game World For Meta Al

### What information is usable by the Meta AI in the game world?





## **Sensor of Meta Al**

### Sensors gather information and send it to the world analyzer.







## **Sensor of Meta Al**

### Sensors gather information and send it to the world analyzer.





## World Analyzer

### What does world analyzer do?





# World Analyzer

The world analyzer makes usable information for the game maker.







# World Analyzer

The world analyzer makes usable information for the game maker.





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Attack? Defense? Escape?

## **Constraints of** Actions









### What does the game maker do?







## Game Maker

### Makes plans and selects the best one







## Game Maker

















# **Operation Generator**

## What does the operation generator do?





# **Operation Generator**

The operation generator breaks down the plans into operations







The operation generator sends parameters through effectors.





The operation generator sends parameters through effectors.





### **Effectors send them to the interaction space.**




### General Design Of Meta Al

The interaction space controls the game with the operations.





### **Operation Generator**

The operation generator sends operations to the enemy manager.









### Main Part Of Meta Al

#### This is the main part of Meta AI.





#### This is a general design of Meta AI.





## Summary

- Meta Al overview
  - Why Meta Al
  - What is Meta Al
- Meta Al General Design  $\bullet$ 
  - How to make Meta Al
  - How can game designers improve Meta AI?



### Game Designer for Meta Al

Elements controlled by Meta AI are deeply related to game design.





### Shake Player's Emotion With Meta Al

When emotions are shaken, we are moved.



- Game Designer emotions?"
- For Meta Al



# - Good at thinking "How to shake

# ->Can pick up elements

How to identify which element is the best to be controlled by Meta AI?

### Meta Al: Too Flexible Games: Too Complex



How to identify which element is the best to be controlled by Meta AI?

### Meta Al: Too Flexible Games: Too Complex

## Break down into smaller elements



How to identify which element is the best to be controlled by Meta AI?

### Meta Al: Too Flexible Games: Too Complex

# Break down into smaller elements with fellow game designers





#### Break down your game into 3 elements "Ru-I-Di"





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### Fun game should have

### "Ru-l-Di-ism"

[Yonemitsu, 2006] (Similar to *Luigi*?)

Rule defines and controls Interaction and Dilemma of your game



e.g.) Key input -> What will happen







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The rule defines what should be Interaction and Dilemma, controls the difficulty and frequency of Interaction and Dilemma.

#### Interaction makes the game loop.



# Interaction = (1)





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### Interaction = the reaction loop

Player's Action

#### Interaction makes the game loop.



(2)







#### Interaction makes the game loop.









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#### **Rule for Interaction and Dilemma**





reaction.

### For example ...

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### Interaction is the loop of action and

### - Player's action and reaction - Game system's action and reaction

#### Interaction makes the game loop.



# (1)







#### Interaction makes the game loop.













Shooting

#### Interaction makes the game loop.









#### **Dilemma to make interaction continuously**



Causes the player to make interactions continuously

dilemma

failure



### Players are forced to select by

#### Makes the player believe to be able to control the success or

## Ru-I-Di -ism (e.g. Dilemma)

Meta AI sets two treasures to different places





and normal shots

with the bomb

-> Do you use the bomb now? Or keep it for the rare enemy?

-> Meta AI controls spawning of rare enemy

- There is energy shared between the bomb attack
- Many enemies = seems a good time to bomb There is a rare enemy that can only be defeated

## Games Are Too Complex To Adjust

#### Break down the game into three ingredients



### Ru-I-Di -ism helps game designers figure out which elements are the best for Meta AI



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#### Fun game should have

### "Ru-I-Di-ism"



### Use Ru-I-Di -ism with fellow Game Designers to make your own Meta Al



## Summary

#### Meta Al overview

- Why Meta Al
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### Meta Al Practical Model

- Emotion-based Meta Al
- Visualization for Meta Al



### In usual combat scenes...





### Effectors of Meta Al

#### How should the Meta AI control the elements to make the game more fun?





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Enemy NPC should dodge more?

Enemy NPC should get out of cover?

Enemy NPC should use power attack more?

### Our goal





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We want to know the player's emotion

And try to move it toward a specific direction

## Our goal

#### How should the Meta AI control the elements to make the game more fun?





## Our goal

#### How should the Meta AI control the elements to make the game more fun?





### Related works: intensity-based Meta Al

#### E.g., Left 4 Dead and Warframe

- Controlling the game by introducing periodic variation on the player's emotional intensity. • (i.e. relaxed/stressed emotion)
- In general, Meta AI controls the intensity by spawning enemy NPC and adjusting spawning position. ۲



#### Meta AI (AI Director) on Left 4 Dead [Booth 2009]

[Booth 2009] Booth, M.: Replayable Cooperative Game Design: Left 4 Dead, GDC 2009 (2009)



### **Problems of intensity-based Meta Al**

#### 1. In many cases, impossible to control the number of NPCs

- Games with fixed number of characters or objects are common even now.
- Even when non-fixed, game design or level may prevent the Meta AI from spawning NPC ulletat specific times or desired positions.



Shooter game



Fighting game



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Card game

### **Problems of intensity-based Meta Al**

#### 2. Difficult to deal with the player's various types of emotions





## Key idea: 2D Emotion Map

- Represent the player's emotion with a combination of "Hope of Winning" and "Fear of Losing."
- Inspired by the psychological emotion model. [Watson and Tellegen 1985] •



[Watson and Tellegen 1985] Watson, D. and Tellegen, A.: Toward a consensual structure of mood, Psychological Bulletin, Vol.98, pp.219-235 (1985)



## Why 2D Emotion Map?

#### Various emotions/situations can be expressed by combination of Hope/Fear values





## Why 2D Emotion Map?

#### Various emotions/situations can be expressed by combination of Hope/Fear values





## Why 2D Emotion Map?

#### Various emotions/situations can be expressed by combination of Hope/Fear values




#### Various emotions/situations can be expressed by combination of Hope/Fear values





#### Various emotions/situations can be expressed by combination of Hope/Fear values





Various emotions/situations can be expressed by combination of Hope/Fear values





# Our goal

#### How should the Meta AI control the elements to make the game more fun?





#### It can map the Meta AI's operations to the player's emotions clearly





















# Estimate Current EP in a fighting game





	Hit rate: 50%	)
	HP	)
r Character	Enemy NPC	

# Estimate Current EP in a fighting game









## Plan Goal EP

#### Highly depends on the game design

- In one game project, every 5 seconds the Goal EP is put on the opposite side of the Current EP.
- In other words, Meta AI always tries to shake the player's emotion.





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#### opposite side of the Current EP. on.



## Plan Goal EP

#### **Bias the Goal EP**

- In one game project, we restricted movable area of the Goal EP by the battle progression. ۲
- This bias the player's emotion to be more excited or happy at the end of battle.  $\bullet$



![](_page_121_Picture_5.jpeg)

![](_page_122_Figure_1.jpeg)

![](_page_122_Picture_2.jpeg)

# Control a fighting game using Next EP

![](_page_123_Figure_1.jpeg)

![](_page_123_Picture_2.jpeg)

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How easily does the **player** attack the **enemy**? Frequency of alert movements Selection rate of slow actions Reaction speed Player Character Enemy NPC

# Control a fighting game using Next EP

![](_page_124_Figure_1.jpeg)

![](_page_124_Picture_2.jpeg)

Your game's genre	Element examples of the game world			
	Affect to Current EP		Controlled by Next EP	
	Норе	Fear	Норе	Fear
Fighting game	<ul> <li>Hit rate of the player's attack</li> <li>HP of the enemy</li> </ul>	<ul> <li>Hit rate of the enemy's attack</li> <li>HP of the player</li> </ul>	<ul> <li>Frequency of alert movements</li> <li>Selection rate of actions with large gap</li> <li>Reaction speed</li> </ul>	<ul> <li>Frequency of dangerous attacks</li> <li>Distance to start attack</li> </ul>

![](_page_125_Picture_2.jpeg)

Your game's genre	Element examples of the game world			
	Affect to Current EP		Controlled by Next EP	
	Норе	Fear	Норе	Fear
Fighting game	<ul> <li>Hit rate of the player's attack</li> <li>HP of the enemy</li> </ul>	<ul> <li>Hit rate of the enemy's attack</li> <li>HP of the player</li> </ul>	<ul> <li>Frequency of alert movements</li> <li>Selection rate of actions with large gap</li> <li>Reaction speed</li> </ul>	<ul> <li>Frequency of dangerous attacks</li> <li>Distance to start attack</li> </ul>
		A		

![](_page_126_Picture_2.jpeg)

F

![](_page_127_Figure_1.jpeg)

![](_page_127_Picture_2.jpeg)

ne world			
Controlled by Next EP			
Норе	Fear		
cy of alert movements n rate of actions with o speed	<ul> <li>Frequency of dangerous attacks</li> <li>Distance to start attack</li> </ul>		

	Element examples of the game world			
Your game's genre	Affect to Current EP		Controlled by Next EP	
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Shooter game	<ul> <li>Same as fighting game</li> <li>How many actions the player have to attack the enemy (e.g., attack type, possessed item, moving route)</li> </ul>	<ul> <li>Same as fighting game</li> <li>How many actions the enemy have to attack the player (e.g., attack type, possessed item, moving route)</li> </ul>	<ul> <li>Same as fighting game</li> <li>Spawning frequency of recovery item, weapon or ammo</li> </ul>	<ul> <li>Same as fighting game</li> <li>Spawning frequency of trap or mob enemy</li> </ul>
Card game	<ul> <li>Evaluated score of the player</li> <li>Player's decision is quick and precise</li> </ul>	<ul> <li>Evaluated score of the enemy</li> <li>Player's decision is slow and uncertain</li> </ul>	<ul> <li>Drawing probability of cards that provide chance to player</li> </ul>	<ul> <li>Drawing probability of cards that provide chance to enemy</li> <li>Search depth of enemy</li> </ul>

![](_page_128_Picture_2.jpeg)

## Simple 1 on 1 combat example

![](_page_129_Figure_1.jpeg)

![](_page_129_Picture_2.jpeg)

## Case 1: Next Fear is high – Enemy uses rapid attack

![](_page_130_Figure_1.jpeg)

![](_page_130_Picture_2.jpeg)

![](_page_130_Picture_4.jpeg)

### Case 2: Next Fear is low – Enemy uses slow attack

![](_page_131_Picture_1.jpeg)

![](_page_131_Picture_2.jpeg)

![](_page_131_Picture_4.jpeg)

![](_page_132_Figure_0.jpeg)

# **Emotion strength (similarity)**

![](_page_133_Figure_1.jpeg)

![](_page_133_Picture_2.jpeg)

# Emotion strength (similarity)

![](_page_134_Figure_1.jpeg)

![](_page_134_Picture_2.jpeg)

# Charts of emotion strength

![](_page_135_Figure_1.jpeg)

![](_page_135_Picture_2.jpeg)

![](_page_135_Figure_4.jpeg)

![](_page_135_Picture_5.jpeg)

## **Trajectories of EP on 2D Emotion Map**

![](_page_136_Figure_1.jpeg)

![](_page_136_Picture_2.jpeg)

### Charts of character status / battle events

We can see the line charts of character status such as HP or MP and discrete game events such as "Hit Attack by Player" through the icons on the bottom of timeline.

![](_page_137_Figure_2.jpeg)

![](_page_137_Picture_3.jpeg)

### Feedbacks from a real game

#### **Testers (10 people)**

- Beginners and experts felt the battles overall a bit difficult but fun.
- Almost all of them finally clear the battles in 1~3 tries.

#### Game designer

- After the parameter tuning of Meta AI, lacksquareEP and his emotion (voice recorded) became mostly consistent.
- Gameplay analysis tool:  $\bullet$ 
  - Good to find reasons behind strong variations of the player's emotion.
  - Still difficult to understand accumulative effect of game events on the player's emotion.

![](_page_138_Picture_9.jpeg)

![](_page_138_Picture_11.jpeg)

The tool made his work 100 times better! :)

## Two-dimensional future works

Within the 2D Emotion Map,

we will be able to deal with the player's and NPC's emotion more effectively using well-known Game AI techniques.

![](_page_139_Figure_3.jpeg)

![](_page_139_Picture_4.jpeg)

- Meta Al General Design helps changing your game dynamically
- Use Ru-I-Di-ism with fellow game designers to make your own Meta AI
- Measure and influence the player's emotion
- 2D Emotion-based Meta AI is beneficial for various games
- Visualize emotions with gameplay data to polish the Meta Al

![](_page_140_Picture_6.jpeg)

#### y n Meta A

- Meta Al General Design helps changing your game dynamically
- Use Ru-I-Di-ism with fellow game designers to make your own Meta Al lacksquare
- Measure and influence the player's emotion  $\bullet$
- **2D Emotion-based Meta AI** is beneficial for various games  $\bullet$
- Visualize emotions with gameplay data to polish the Meta AI  $\bullet$

![](_page_141_Figure_6.jpeg)

![](_page_141_Picture_7.jpeg)

- Meta Al General Design helps changing your game dynamically
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- 2D Emotion-based Meta AI is beneficial for various games
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![](_page_142_Figure_6.jpeg)

![](_page_142_Picture_7.jpeg)

![](_page_142_Figure_9.jpeg)

- Meta Al General Design helps changing your game dynamically •
- Use Ru-I-Di-ism with fellow game designers to make your own Meta Al  $\bullet$
- Measure and influence the player's emotion
- **2D Emotion-based Meta AI** is beneficial for various games  $\bullet$
- Visualize emotions with gameplay data to polish the Meta AI  $\bullet$

![](_page_143_Figure_6.jpeg)

![](_page_143_Picture_7.jpeg)
## Takeaways

- Meta Al General Design helps changing your game dynamically
- Use Ru-I-Di-ism with fellow game designers to make your own Meta Al •
- Measure and influence the player's emotion  $\bullet$

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- **2D Emotion-based Meta AI** is beneficial for various games
- Visualize emotions with gameplay data to polish the Meta AI •



## Takeaways

- Meta Al General Design helps changing your game dynamically
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- Measure and influence the player's emotion
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# Thank you for listening!

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