

Capturing Game Telemetry with Provenance



Game Telemetry

- Telemetry
 - Data gathered over distance
- Data gathering
 - Important aspect in the industry
 - Game development, research and production

```
[22:48:17.7] Tetty << Zurhidon Negotiator Attack dodge
[22:48:17.0] Tetty >> Zurhidon Negotiator Autoshot critical 6640 Life
[22:48:17.3] Tetty - Spirit Herb heal 48 Life
[22:48:18.7] Tetty >> Negotiator Sapping Arrow debuff
[22:48:19.3] Tetty - Spirit Herb heal 48 Life
[22:48:19.5] Tetty - Infinite Herb heal 1750 Life
[22:48:19.5] Tetty - Infinite Herb buff
[22:48:20.7] Tetty << Zurhidon Negotiator Attack dodge
[22:48:23.7] Tetty << Zurhidon Negotiator Attack dodge
[22:48:25.7] Tetty >> Zurhidon Negotiator Autoshot critical 6598 Life
[22:48:25.0] Tetty >> Zurhidon Negotiator Autoshot critical 6604 Life
[22:48:26.7] Tetty << Zurhidon Negotiator Attack 328 Life
[22:48:26.1] Tetty >> Zurhidon Negotiator Deadly Poison Bite 10414 Life
[22:48:26.1] Tetty >> Zurhidon Negotiator Deadly Poison Bite miss
[22:48:26.2] Tetty >> Zurhidon Negotiator Autoshot 3436 Life
[22:48:27.6] Tetty >> Zurhidon Negotiator Combo Shot critical 16453 Life
[22:48:27.6] Tetty >> Negotiator Combo Shot debuff
[22:48:27.6] Tetty >> Zurhidon Negotiator Poisonous Spit 706 Life
[22:48:27.1] Tetty >> Zurhidon Negotiator Combo Shot 8558 Life
[22:48:27.1] Tetty >> Zurhidon Negotiator Combo Shot no effect
[22:48:28.3] Tetty >> Zurhidon Negotiator Poisonous Spit 706 Life
```

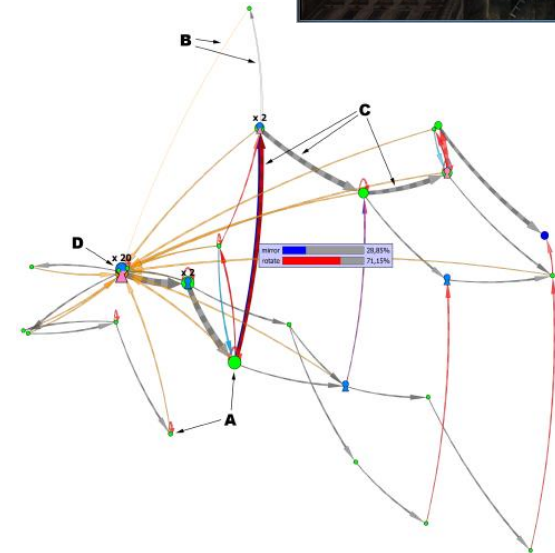
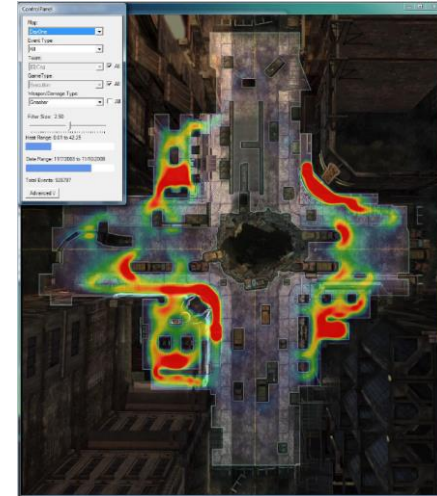
- Advantages
 - Stability
 - Dynamic balancing
 - Behavior analysis
 - Monetization
 - Detect problems

Squadron Tower Defense (Tower Defense 4v4) | 32 minutes

| Team | Race/Player | Resources | Units | Structures | Overview |
|------|--------------|-----------|-------|------------|----------|
| 2 | CLSHossinaut | 13,104 | 0 | 0 | 13,104 |
| 1 | Random | 5,331 | 0 | 0 | 5,331 |
| 2 | preecher | 4,986 | 0 | 0 | 4,986 |
| 2 | noobpuncher | 3,577 | 0 | 0 | 3,577 |
| 2 | heydorky | 2,657 | 0 | 0 | 2,657 |
| 1 | CLARK | 2,465 | 0 | 0 | 2,465 |
| 1 | RcSS | 168 | 0 | 0 | 168 |
| 1 | Keelael | 130 | 0 | 0 | 130 |

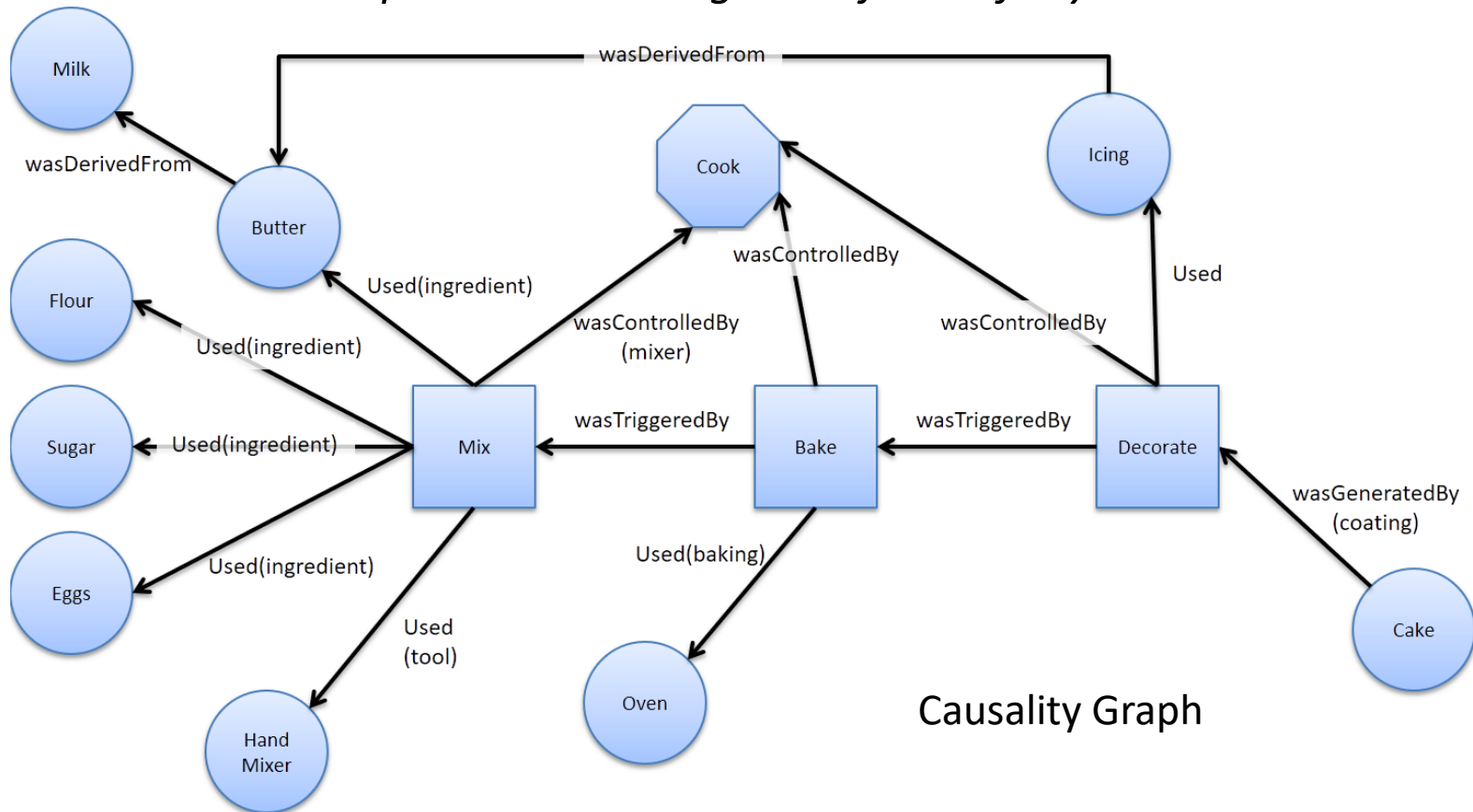
Game Telemetry Gathering

- Challenging
 - Game complexity
 - Information size
- What do we track?
 - State changes *(Y.-E. Liu et al., 2011), (G. Wallner, 2013), (M. S. El-Nasr and T.-H. Nguyen, 2015)*
 - Coarse grain
 - Events *(S. Joslin et al., 2007), (J. H. Kim et al., 2008)*
 - Fine grain
- Cause-and-effect relationships
 - A.K.A. influences
 - **Not captured!**



Provenance

- “Refers to the documented history of an art object, or the documentation of processes in a digital object’s life cycle” <http://www.w3.org/TR/prov-primer/>



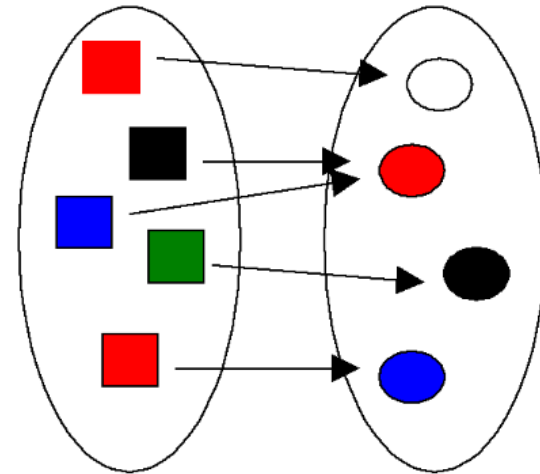
Causality Graph

Provenance in Games (PinG)

Conceptual framework

(Kohwalter et al., 2012)

- First work in the field
- Domain mapping
 - Brings provenance to games
- Tracking and gathering
 - Provenance data
 - Causal relationships



PinG

(Kohwalter et al., 2012)

- Entity
 - Objects
- Activity
 - Actions
 - Events
- Agent
 - NPCs
 - Player



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Goals

- Capture causal relationships telemetry
 - Based on PinG's conceptual framework
- Easy integration
 - PinG had no actual implementation
 - Minimum coding
 - Automatic information management

Car Tutorial

<https://www.assetstore.unity3d.com/en/#!/content/10>

- Capture provenance telemetry from game session
- Generate provenance graph



Grafo gerado no *Prov Viewer*
(Kohwalter et al., 2016)

<http://gems-uff.github.io/prov-viewer/>



Angry Bots

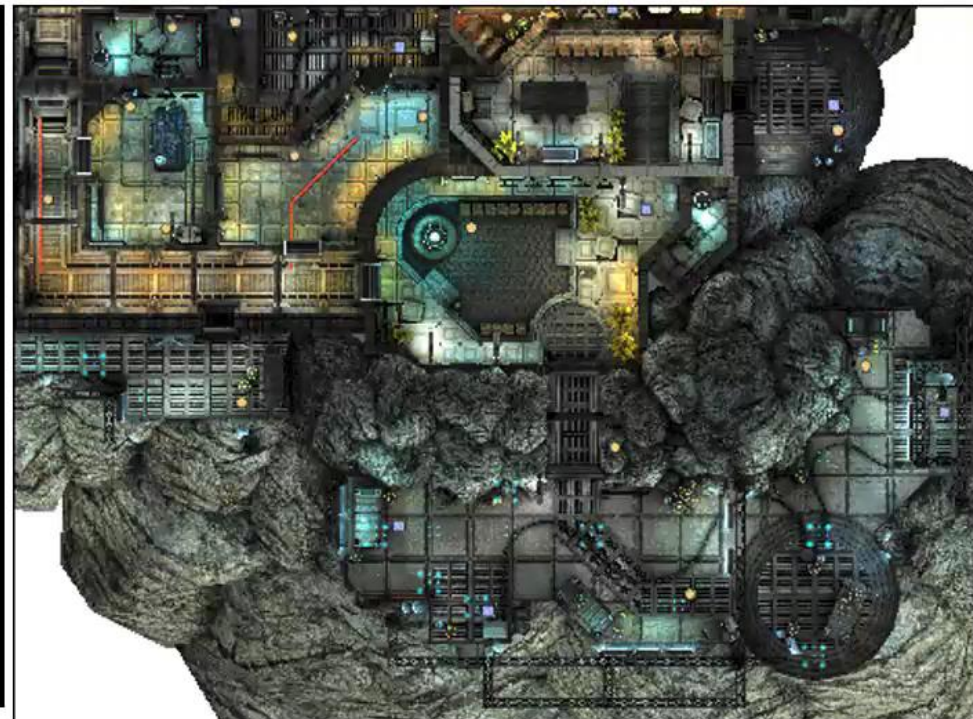
<https://www.assetstore.unity3d.com/en/#!/content/12175>

- Capture provenance telemetry from game session
- Generate provenance graph



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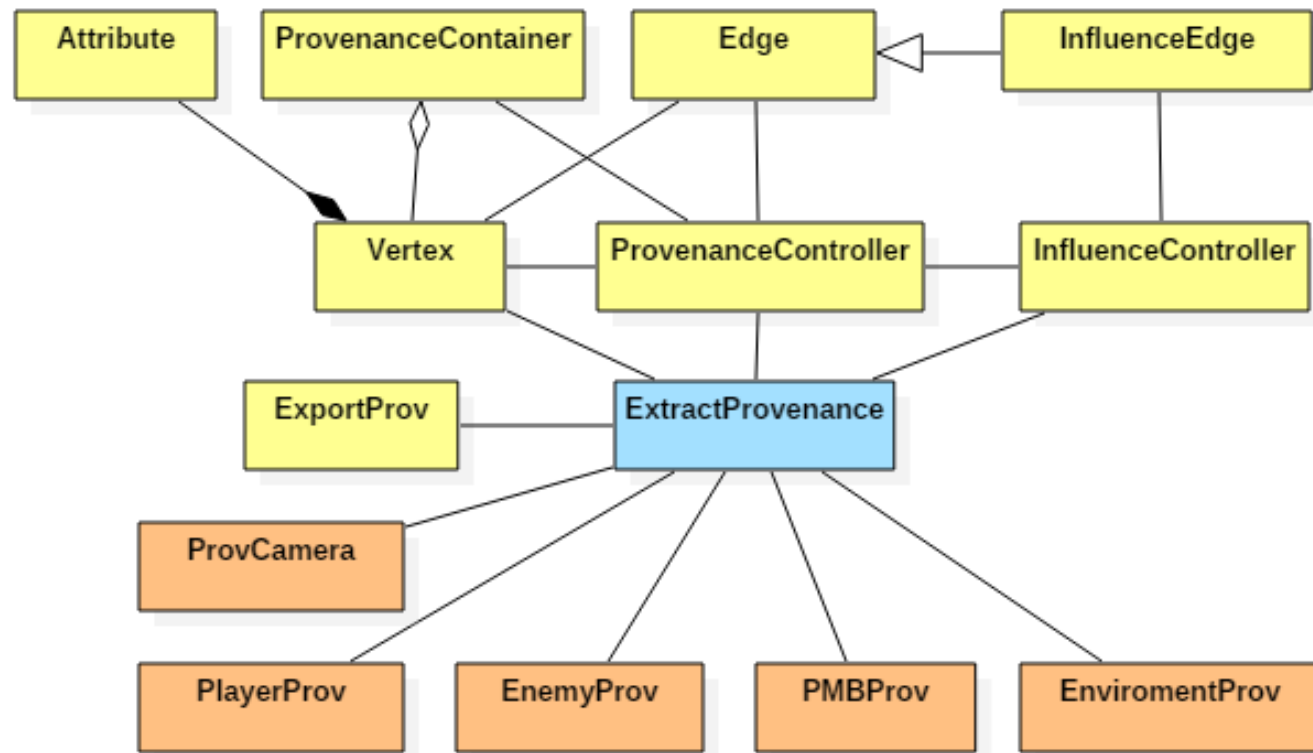
HOW?

Provenance in Games for Unity - PinGU

- Yellow classes
 - Management

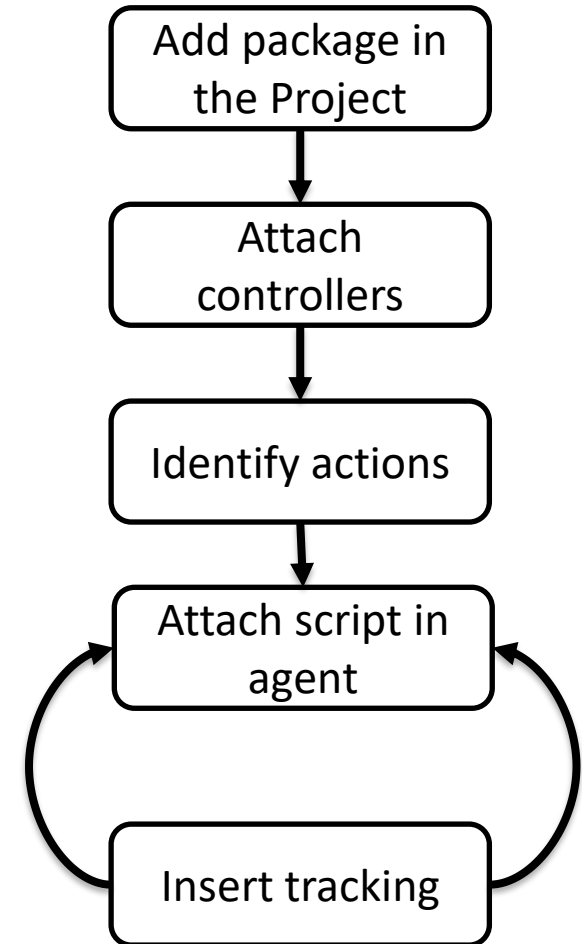
- Blue class
 - Gatherer

- Orange classes
 - Domain-Specific



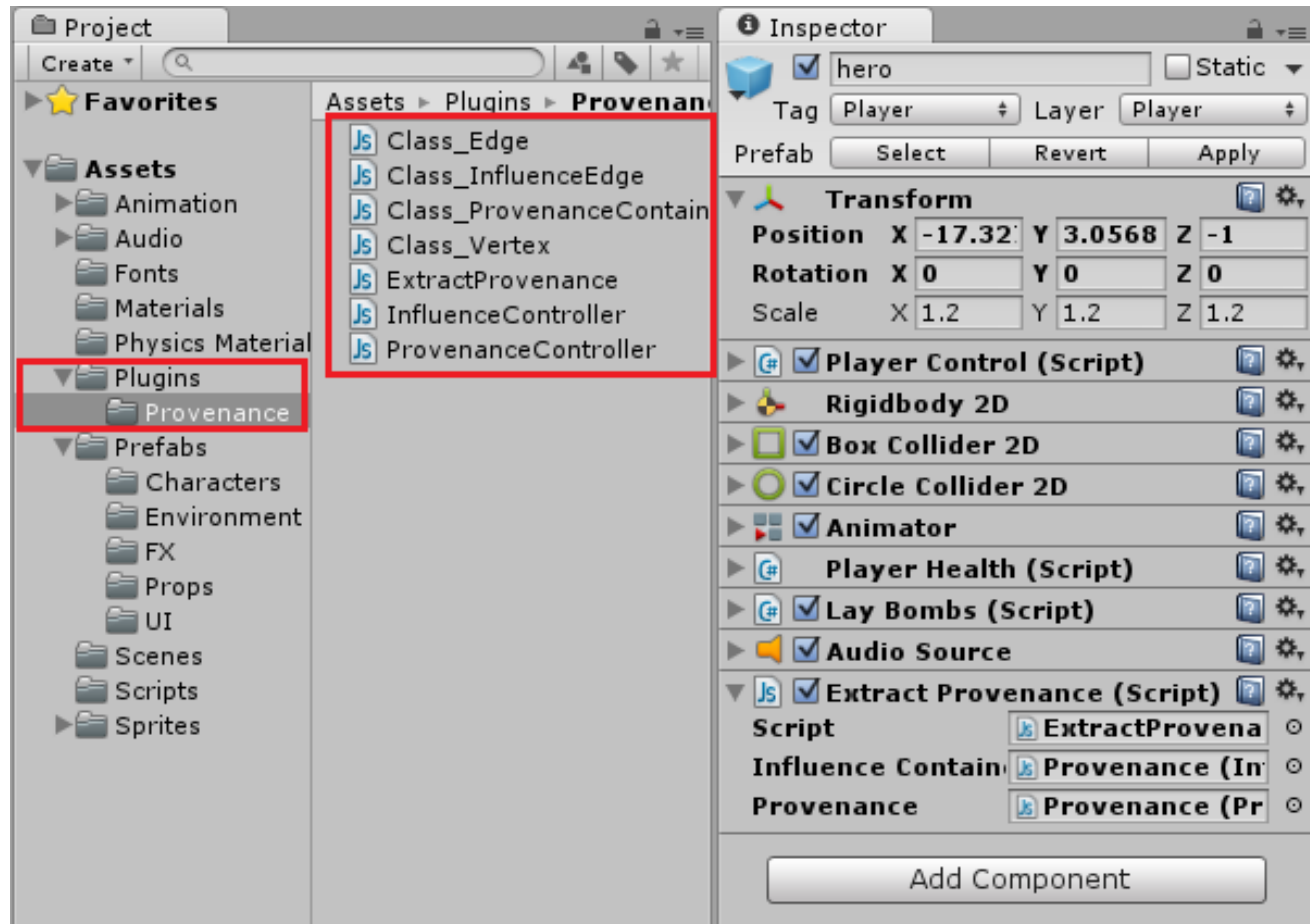
Integration

1. Import PinGU
2. Provenance controllers
 1. *Provenance Controller*
 2. *Influence Controller*
3. Game Design
 1. Identify actions
 2. Identify scripts
4. Provenance extractor
 1. *Extract Provenance*
5. Provenance tracking functions
 1. Domain specific
 2. Insert in existing scripts



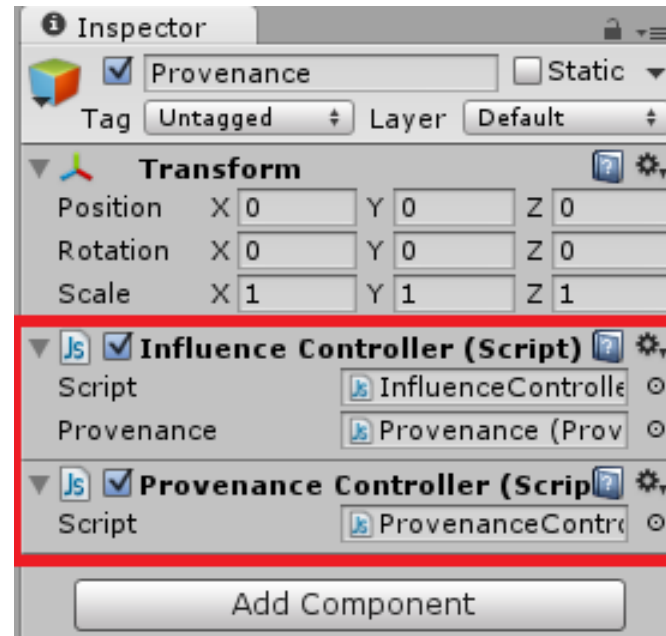
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Game design summary (example)

•Enemy

- Health (Attribute)
- Enemy Attack (Action)
 - Player take Damage (Influence)

•Player

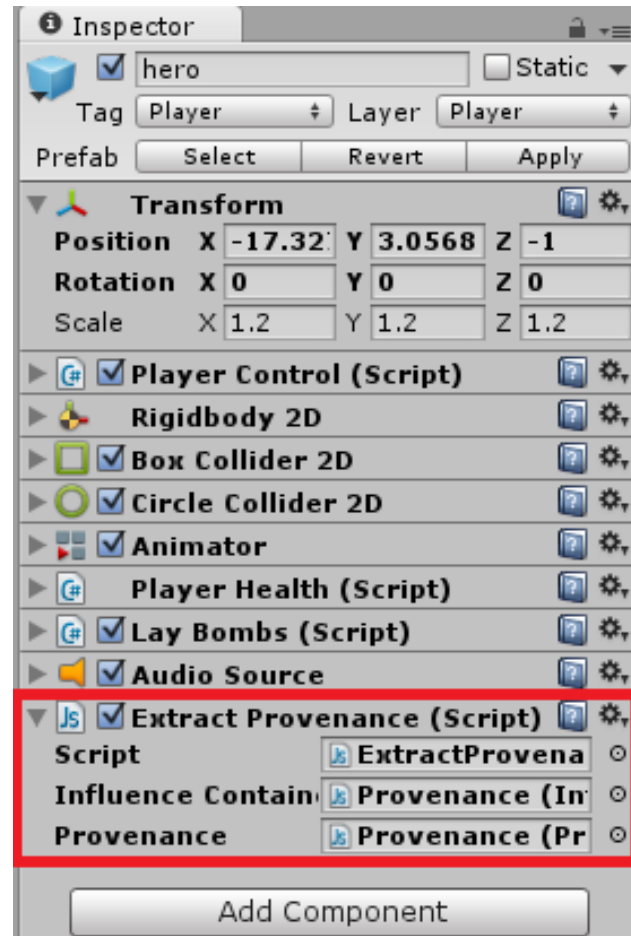
- Health (Attribute)
- Throw Bomb
 - Secondary Attack (Action)
 - Damage Enemy, Area of Effect (Influence)
- Fire Gun
 - Primary Attack (Action)
 - Spawn projectile
- Projectile
 - Enemy Damage (Influence)
- Player Death (Action)

•Item Spawner

- Create Health Item (Action)
 - Health Item (Object)
 - Heal (Influence)
- Create Bomb Item (Action)
 - Bomb container (Object)
 - Increase Bomb ammunition (Influence)

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Tracking Function insertion

```
function Fire () {  
    if (weaponBehaviours[nextWeaponToFire]) {  
        weaponBehaviours[nextWeaponToFire].SendMessage ("Fire");  
        nextWeaponToFire = (nextWeaponToFire + 1) % weaponBehavi  
        lastFireTime = Time.time;  
    }  
}
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        lastFireTime = Time.time;

        // Provenance
        prov.Prov_Attack (damageAmount);
    }
}
```

Domain-specific tracking function

```
public string Prov_Attack(float damageAmount)
{
    Prov_GetEnemyAttributes ();
    prov.NewActivityVertex ("Attacking", "");
    prov.GenerateInfluence ("Player", this.GetInstanceID().ToString(),
    "Damage", (-damageAmount).ToString());
    return this.GetInstanceID().ToString();
}
```

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Domain attributes

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Information Type

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Causal Relationship

Contributions

- Capturing provenance data
 - Data exploration
 - Behavior analysis
 - Other abstract analysis

- Casual relationships
 - Cause-and-Effect

Future work

- Visualization
- More automatization during integration
- Dynamic balancing
- Modeling provenance graph for Deep Learning

Capturing Game Telemetry with Provenance



PinGU

<http://gems-uff.github.io/ping/>



Apresentação
SBGames 2017



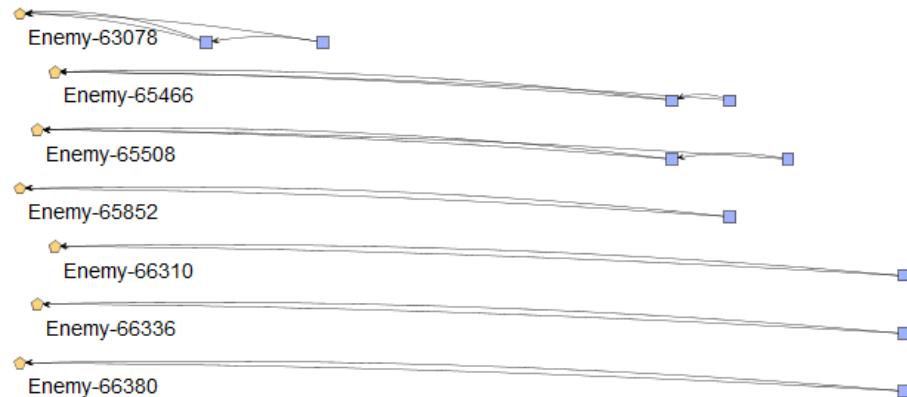
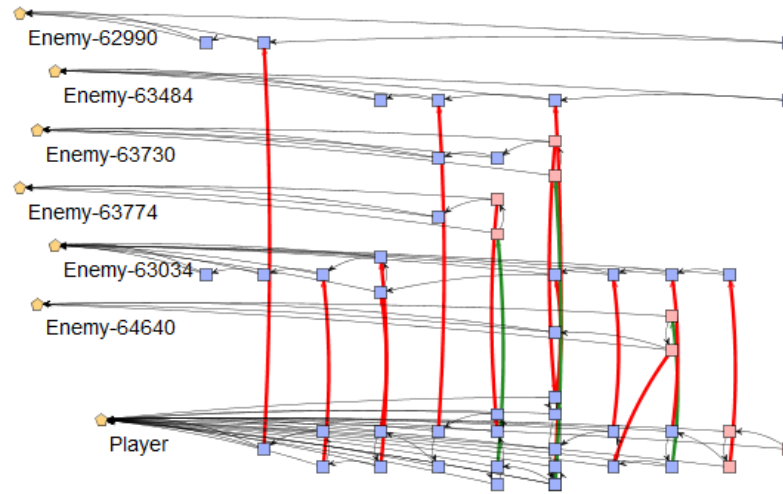
Prov Viewer

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Provenance Graph

- All agents
- Executed actions
 - Who executed
 - Causal-Relationships
(Vertical edges)



Prov Viewer

