

Motion Matching —— 概念与发展

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- 基于状态机的动画
- Motion Matching的引出与基本概念
- Motion Matching的要点与对比
- Motion Matching的发展
- 小结

Motion Matching —— 概念与发展

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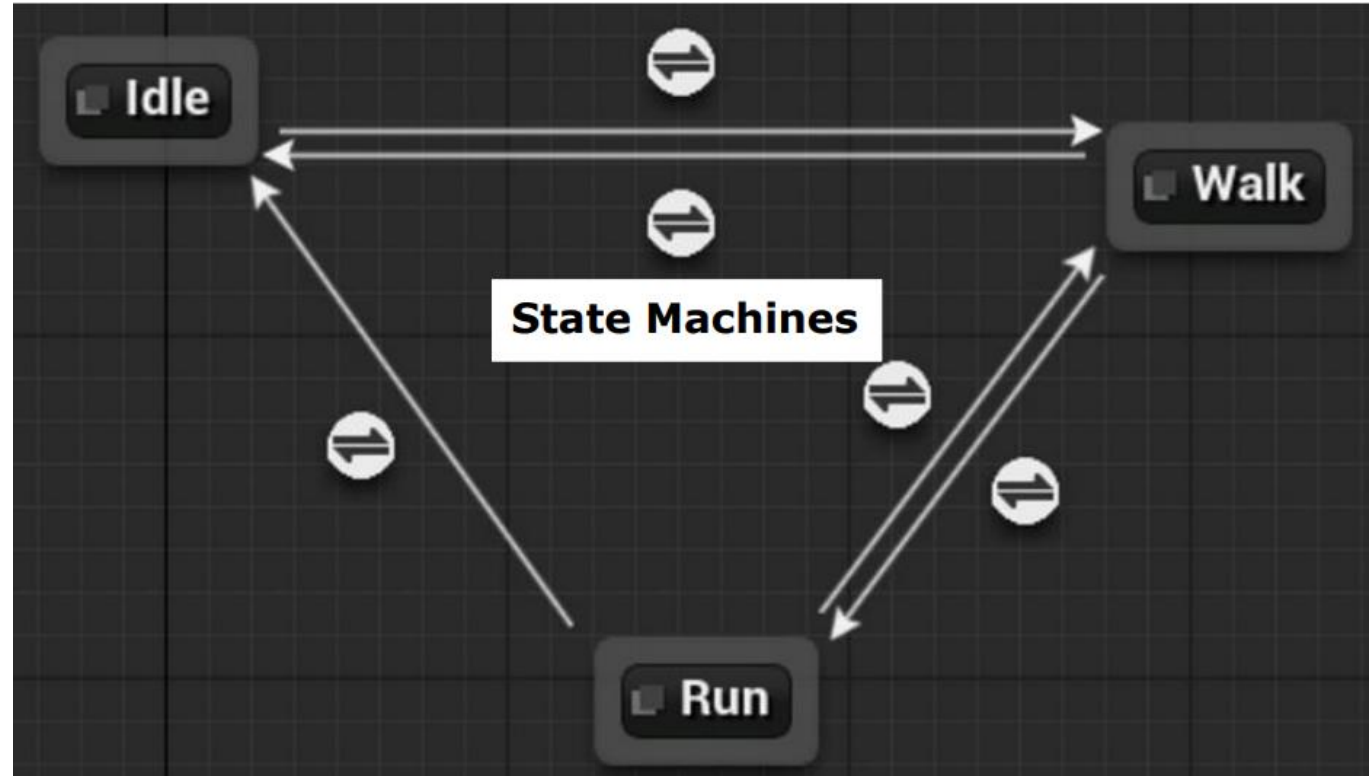
- 基于状态机的动画
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- 小结

State Machine Based Animation

```
// start
if (!walking && wantToWalk)
{
    PlayAnim (StartAnim);
    walking = true;
}

// walk loop
if (IsPlaying(StartAnim) && IsAtEndOfAnim())
{
    PlayAnim (WalkLoopAnim);
}

// stop
if (walking && !wantToWalk)
{
    PlayAnim (StopAnim);
    walking = false;
}
```



State Machine Based Animation

The image displays a state machine based animation system. It consists of three main parts:

- Left Diagram:** A clean state machine diagram with states represented by grey boxes. The 'Stand' state is highlighted in orange. Transitions are shown as white arrows. States include: Stand, Walk, Run, Jump, Fall, Dash, RunJump, ClimbWall, HangOnWall, Skid, HangOnLedge, ClimbLedge, StandToCrawl, CrawlToStand, Crawl, and SlideToCrawl. A green box labeled 'Any State' is at the bottom left.
- Right Diagram:** A dense, complex state machine diagram with many states and transitions. The 'Idle' state is highlighted in orange. States include: Extractor, Lethal Power Aura, Lethal Flame Spoke, Lethal Shield Matrix, Lethal Flak, Lethal Napalm, Lethal Laser, Lethal Laser Sweep, Lethal Shield, Lethal Back, Lethal Dash, Lethal Barrage, Lethal Tremor, Lethal Whirlwind, Lethal Slam, Crafting Gunner, Driller Action Pose, Core Swap Confirmation, Part Confirmed, HardSlide, Spider Fall Traversal, Combat Alert, Sitting, End Sitting, Idle Back, Attract Fan, PreExplorationIdle_01, PreExplorationIdle_02, 400, Switch to Player Control, Chat Down, Fidget, Strafe, Turret Riding, Lethal Power Aura, Lethal Flame Spoke, Lethal Shield Matrix, Lethal Flak, Lethal Napalm, Lethal Laser, Lethal Laser Sweep, Lethal Shield, Lethal Back, Lethal Dash, Lethal Barrage, Lethal Tremor, Lethal Whirlwind, Lethal Slam, Extractor/Install, Tug Of War, Frame Fidget, Core Fidget, Spin, HotWire, Holes 1, Holes 2, Holes 3, Hubster, Unleasher, Fire, Shoulder, Taunt, Promote/Decease, Reveal, Disassemble, Switch Care, Reload, Hool, Victor Incapacitability, Jump Strafe Left, Jump Strafe Right, Evade Back, Evade Left, Evade Right, Jump Reposition Back, Lunge Forward, Super Lunge Forward, Combat Start, Combat Back, Combat End, Sub-INstant Jump, S Point Jump, Shield Jump, Turn Left, Turn Right, Jump Turn, Turret Riding, Strafe, Locomotion, Turret Riding, S Point Jump, Shield Jump, Turn Left, Turn Right, Jump Turn, Turret Riding.
- Bottom Center:** A GDC 2018 presentation slide. It features a speaker at a podium and the following statistics:
 - ~15,000 Animations
 - ~5,000 States
 - ~12 Levels

State Machine Based Animation

- 如何进行动作衔接？

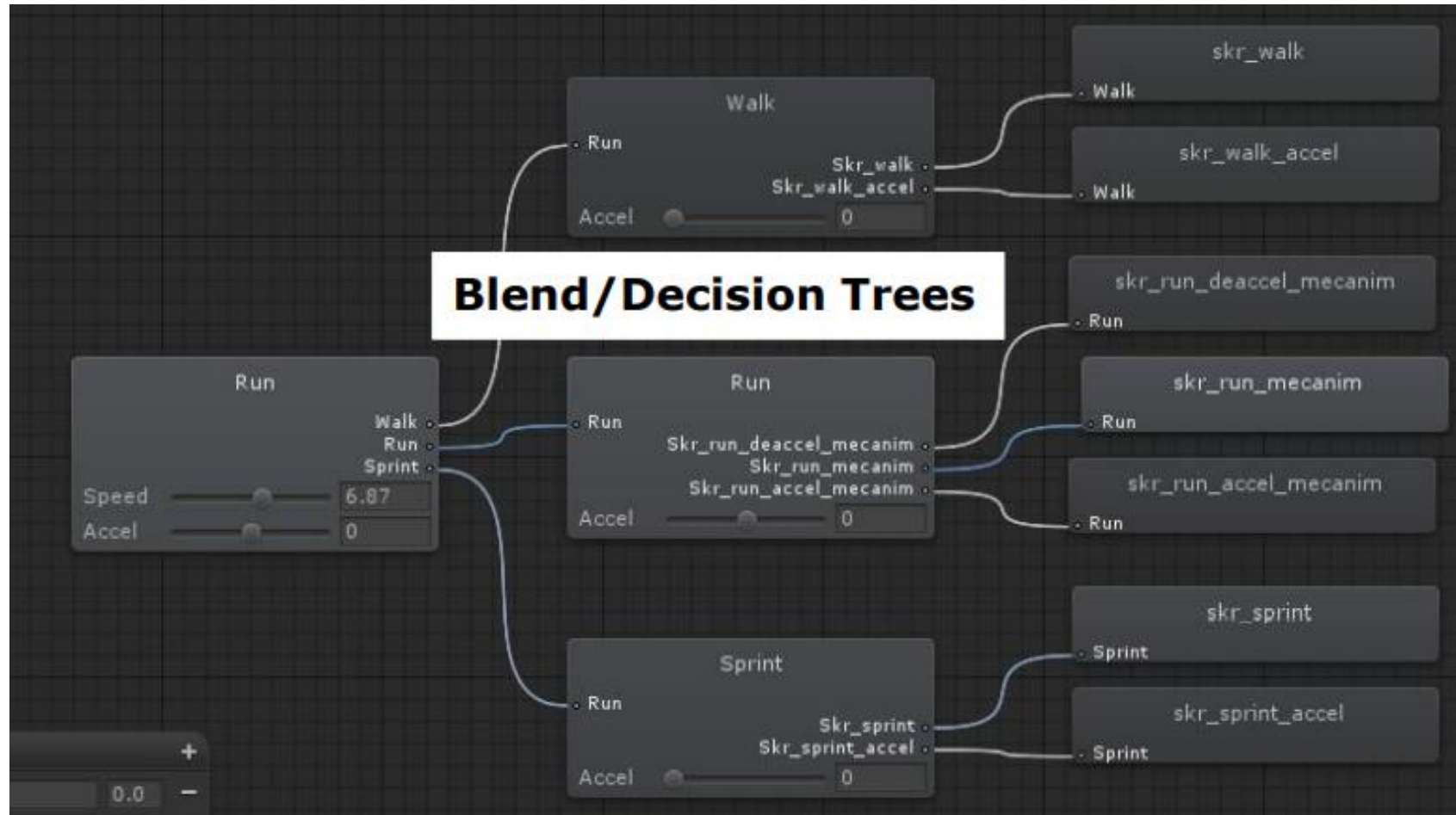


```
if (speed > 3.0f)
{
    PlayAnim (RunAnim);
}

else if (speed > 0.0f)
{
    PlayAnim (WalkAnim);
}

else
{
    PlayAnim (IdleAnim);
}
```

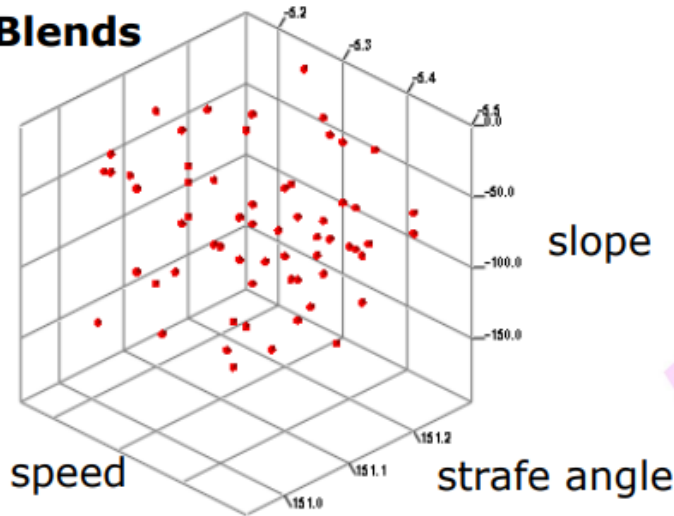
State Machine Based Animation



State Machine Based Animation: Problem

- 当动作量增大时，状态机复杂度平方级增长，极大加大了BUG出现的频率与调试的事件
- 给资源管理带来困难
- Blend tree的参数与插值方式需要非常精细地调整

Parametric Blends



Name	Speed	Sight/VelocityAngle	Slope/VelocityAngle	Banking	AwarenessContext	Stances	Bump
Hero_Nav_RunInField_5Msec	5	0	0	0	Tall Grass	Run	0
Hero_Nav_WalkFwd1Msec_BankRt	1	0	0	1	Default	Walk	0
Hero_Nav_WalkFwd1Msec_BankLt	1	0	0	-1	Default	Walk	0
Hero_Nav_MoCapNarrativeWalkSlow_1Msec	1	0	0	0	Default	Walk	0
Hero_Nav_logSlow_3Msec	3	0	0	0	Default	Run	0
Hero_Nav_logSlow_4Msec	4	0	0	0	Default	Run	0
Hero_Inst_WalkFast_3Msec	3	0	0	0	Default	Walk	0
Hero_Fight_WalkFwd_BankRt	1	0	0	1	Default	Walk	0
Hero_Fight_WalkFwd_BankLt	1	0	0	-1	Default	Walk	0
Hero_Nav_WalkSlope_30DegUp	3	0	30	0	Default	Walk	0
Hero_Nav_TransitionLoop_F	1	0	0	0	Default	Run	0
Hero_Nav_RunBump_LtSide	1	0	0	0	Default	Run	0
Hero_Nav_RunBump_RtSide	1	0	0	0	Default	Run	0
Hero_Nav_RunFwdDirection	1	0	0	0	Default	Run	0
Hero_Nav_RunFwdDirection	1	0	0	0	Default	Run	0
Hero_Agg_SprintFwd_BankRt	1	0	0	1	Default	Run	0
Hero_Inst_walkAggressive_2M	2	0	0	0	Default	Run	0
Hero_Nav_Run_5m_NewSty	5	0	0	0	Default	Run	0
Hero_Agg_SprintFwd_BankLt	1	0	0	-1	Default	Run	0
Hero_Agg_SprintBump8m_L	8	0	0	0	Default	Run	0
Hero_Agg_SprintBump8m_F	8	0	0	0	Default	Run	0
Hero_Agg_SprintBump6m_L	6	0	0	0	Default	Run	0
Hero_Agg_SprintBump6m_F	6	0	0	0	Default	Run	0
Hero_NPC_Walk_Slow	1	0	0	0	Default	Walk	0
Hero_Nav_Run_5m_NewSty	5	0	0	0	Default	Run	0
Hero_Nav_Sprint_stop_5m	5	0	0	0	Default	Sprint	0
Hero_Nav_Sprint_7m_NewSty	7	0	0	0	Default	Run	0
Hero_Inst_walkAggressive_2M	2	0	0	0	Default	Run	0
Hero_Nav_Run_Slope_30DegUp_5m	5	0	30	0	Default	Sprint	0
Hero_Nav_Run_Slope_30DegDown_5m	5	0	-30	0	Default	Sprint	0
Hero_Nav_Sprint_8m	8	0	0	0	Default	Run	0
Hero_sprint_10m	10	0	0	0	Default	Run	0
Hero_Nav_Run_5m_NewStyle_LongStride_20Fps	5	0	0	0	Default	Sprint	0

```
// a parametric-blend query
AnimQuery query;

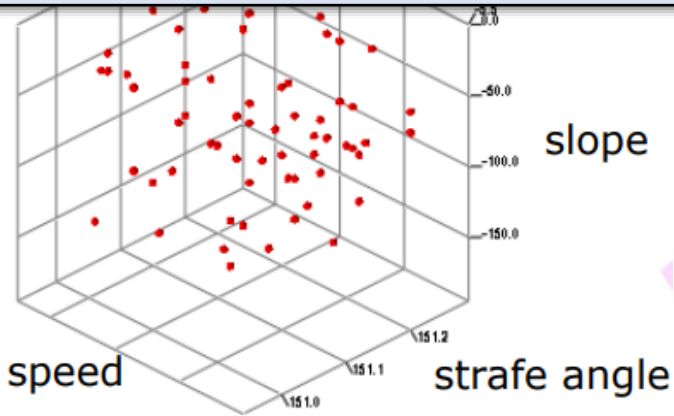
// let's strafe up a slope
query.AddDesiredFeature("speed", 3.0f);
query.AddDesiredFeature("slope", 35.0f);
query.AddDesiredFeature("strafeAngle", 90.0f);

Array<float> blendFactors = ComputeBlendFactors(query);
SetBlendFactors(blendFactors);
```


State Machine Based Animation: Problem

- 当动作量增大时，状态机复杂度平方级增长，极大加大了BUG出现的频率与调试的事件

基于状态机的动画复杂度较大，需要大量人工调试



```
Hero_Nav_JogSlow_4Msec
Hero_1st_WalkFast_3Msec
Hero_Fight_WalkFwd_BankF
Hero_Fight_WalkFwd_BankL
Hero_Nav_WalkSlope_30De
Hero_Nav_TransitionLoop_F
Hero_Nav_RunBump_LtSide
Hero_Nav_RunBump_RtSide
Hero_Nav_RunFwdDirection
Hero_Nav_RunFwdDirection
Hero_Agg_SprintFwd_BankF
Hero_1st_walkAggressive_2M
Hero_Nav_Run_5m_NewSty
Hero_Agg_SprintFwd_BankL
Hero_Agg_SprintBump8m_L
Hero_Agg_SprintBump8m_F
Hero_Agg_SprintBump6m_L
Hero_Agg_SprintBump6m_F
NPC_Walk_Slow
Hero_Nav_Run_5m_NewSty
Hero_Nav_Sprint_stop_5m
Hero_Nav_Sprint_7m_NewSt
Hero_1st_walkAggressive_2M
Hero_Nav_Run_Slope_30DegUp_5m
Hero_Nav_Run_Slope_30DegDown_5m
Hero_Nav_Sprint_8m
Hero_sprint_10m
Hero_Nav_Run_5m_NewStyle_LongStride_20Fps
```

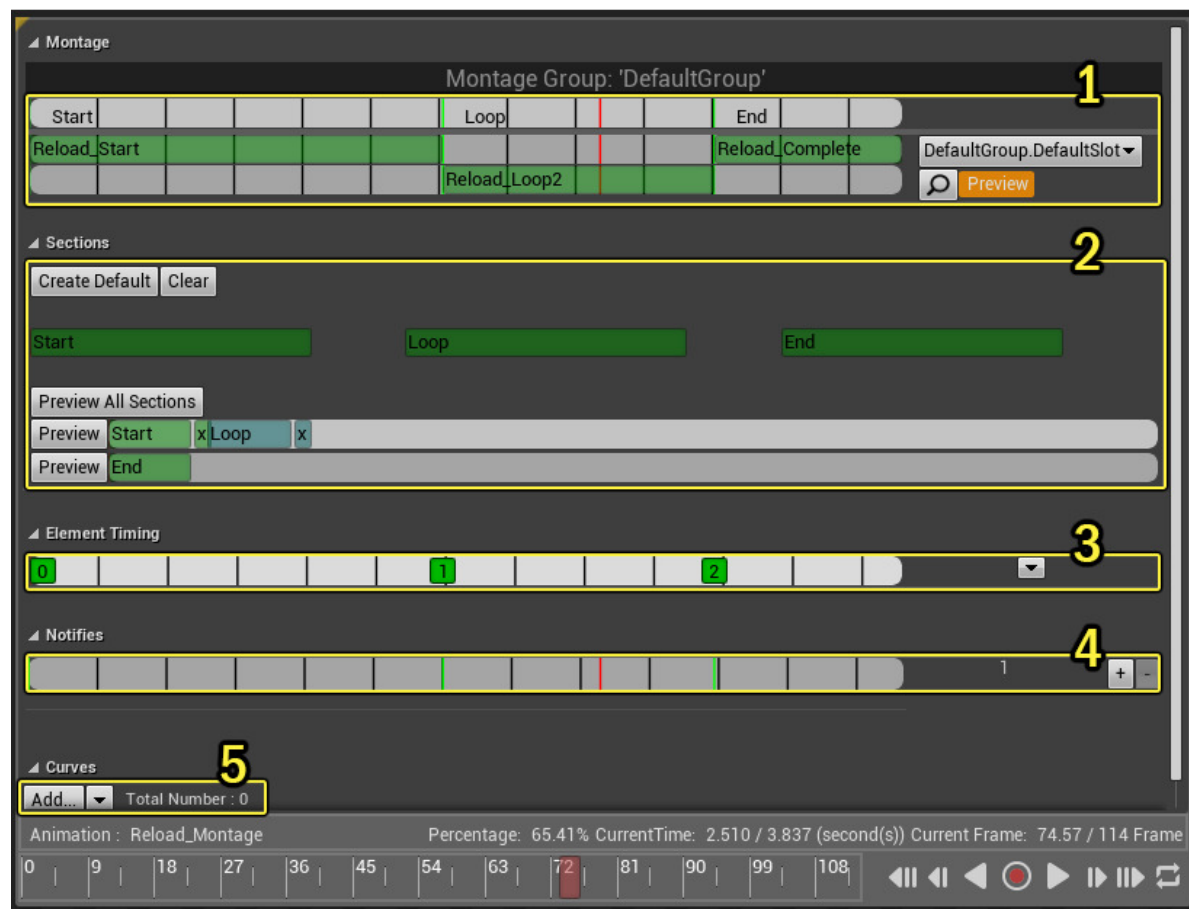
```
// a parametric-blend query
AnimQuery query;

// let's strafe up a slope
query.AddDesiredFeature("speed", 3.0f);
query.AddDesiredFeature("slope", 35.0f);
query.AddDesiredFeature("strafeAngle", 90.0f);

Array<float> blendFactors = ComputeBlendFactors(query);
SetBlendFactors(blendFactors);
```

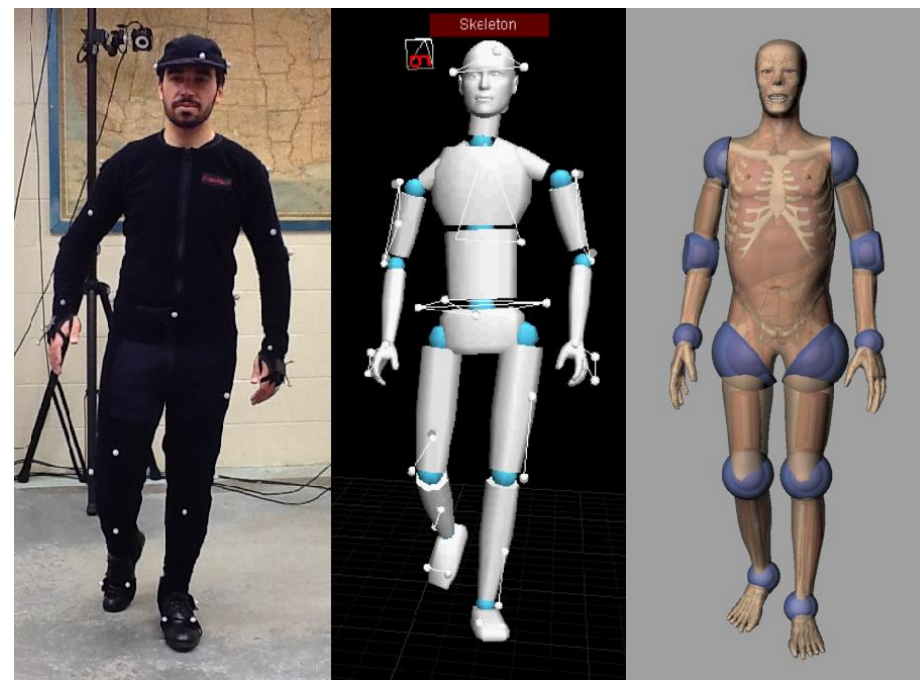
Hero_Nav_Run_Slope_30DegUp_5m	5	0	-30	0	Default	Sprint	0
Hero_Nav_Run_Slope_30DegDown_5m	5	0	30	0	Default	Sprint	0
Hero_Nav_Sprint_8m	8	0	0	0	Default	Run	0
Hero_sprint_10m	10	0	0	0	Default	Run	0
Hero_Nav_Run_5m_NewStyle_LongStride_20Fps	5	0	0	0	Default	Sprint	0

Montage in UE



1. 蒙太奇区域，包含了Section、Slot
 - 片段Section: 表示一个动画片段
 - 插槽Slot: 一条轨道，可以创建多个Slot实现不同的动画版本
2. Section区域
3. Element Timing区域，从蒙太奇和Notify区域提取信息，以帮助设定不同片段的时间
4. Notify区域: 将事件设置在动画的特定事件发生
5. Curve区域

Motion Capture



Motion Capture: Pros & Cons

- 自由度高
- 质量好
- 在某些情况下复杂度更低

- 较为昂贵
- 仍然需要后处理
- 只能应用到类人体模型中

Motion Matching —— 概念与发展

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Motion Matching: Motivation

- 能不能找到一种统一的方式处理状态机中的转移、循环、融合等复杂操作？
- 如果能，那要怎么找到下一个要播放什么**动画**？

Motion Matching: Motivation

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- 如果能，那要怎么找到下一个要播放什么**动画**？

Motion Matching Deals With It!

Motion Matching: Motivation

当动画、状态很多的时候，想要避免无序混乱的状态图

⇒ 状态机的本质是“接受输入，根据**预定规则**从**当前动画**转移到下一个动画”

⇒ 期望能够根据**当前的动画**和**玩家输入****自动**判断下一个动画是什么

⇒ 根据当前动画信息与玩家输入信息自动抽取最合适的**下一帧**动画

⇒ 输入：当前帧的动画信息&玩家输入

输出：下一帧动画

Motion Matching: Motivation

当动画、状态很多的时候，想要避免无序混乱的状态图

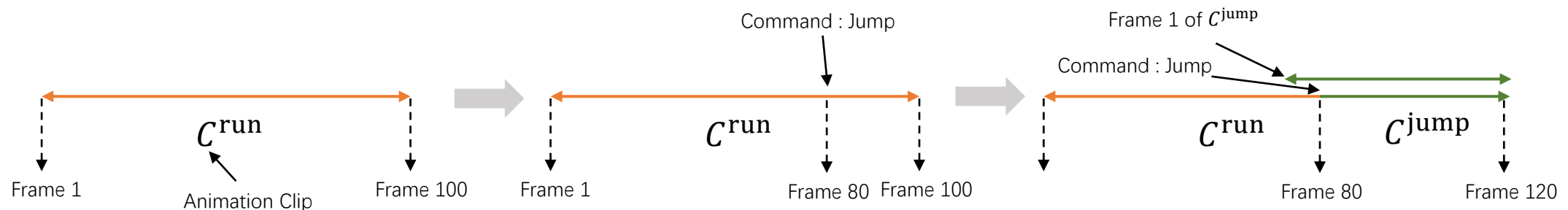
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Motion Matching: Motivation

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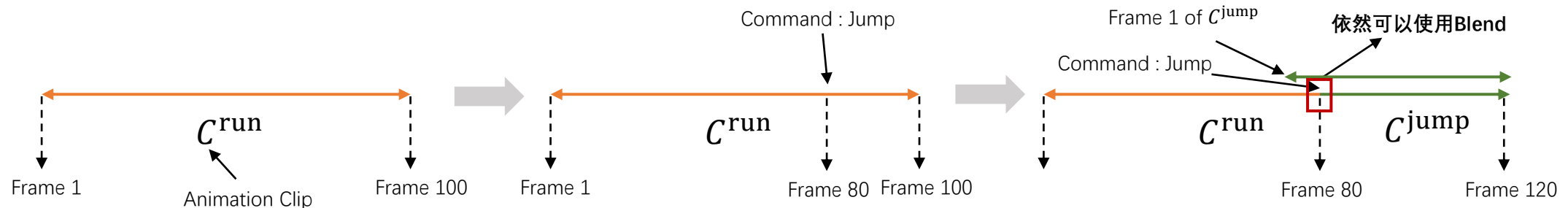
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⇒ 期望能够根据**当前的动画**和**玩家输入****自动**判断下一个动画是什么

⇒ 根据当前动画信息与玩家输入信息自动抽取最合适的下一帧动画

⇒ 输入：当前帧的动画信息&玩家输入

输出：下一帧动画



Motion Matching: Motivation



EA出品的UFC3 (2018) 全部使用了MM



A Demo showed by UbiSoft



A Demo showed by UbiSoft

Motion Matching: Steps

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

2. 从动画数据库中检索查找最匹配的一帧动画

- 与“期望未来轨迹”的差距越小越好，但同时也不能偏离当前动画太多
- $C^* = \operatorname{argmin}_{C^{\text{candidate}}} \text{CalculateCost}(C^{\text{current}}, C^{\text{candidate}}, T^{\text{target}})$

3. 从最优帧开始播放动画

Motion Matching: Current Pose

1. 获取当前状态+期望未来轨迹

- **当前状态：当前帧的pose**

- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

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3. 从最优帧开始播放动画

Motion Matching: Current Pose

- Trajectory: root animation



- Pose: defined as the joint transforms **including** a trajectory section
 - A trajectory section is always associated with a pose

Motion Matching: Current Pose



- Root velocity
- Root position
- Feet velocity / Hand velocity
- Feet position / Hand position
- Weapon position
- Etc.
- 每个Pose的信息都可以预先计算并存储起来

Motion Matching: Future Trajectory

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- **期望未来轨迹：位置+速度，来自玩家输入或无玩家输入**

2. 从动画数据库中检索查找最匹配的一帧动画

- 与“期望未来轨迹”的差距越小越好，但同时也不能偏离当前动画太多
- $C^* = \operatorname{argmin}_{C^{\text{candidate}}} \text{CalculateCost}(C^{\text{current}}, C^{\text{candidate}}, T^{\text{target}})$

3. 从最优帧开始播放动画

Motion Matching: Future Trajectory

- 包含位置与速度信息
- 如果没有捕获到玩家输入
 - 则将当前帧之后的一定时间区间内的轨迹视为Future Trajectory
- 如果有玩家输入
 - 使用模拟得到预测未来路径
 - 键盘、鼠标
 - 手柄摇杆
 - AI未来路径

Motion Matching: Calculate Cost

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

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3. 从最优帧开始播放动画

Motion Matching: Calculate Cost

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

2. 从动画数据库中检索查找最匹配的一帧动画

- 与“期望未来轨迹”的差距越小越好，但同时也不能偏离当前动画太多

$$C^* = \operatorname{argmin}_{C^{\text{candidate}}} \text{CalculateCost}(C^{\text{current}}, C^{\text{candidate}}, T^{\text{target}})$$



3. 从最优帧开始播放动画

Motion Matching: Calculate Cost

```
float CalculateCost (currentPose, candidatePose, targetTrajectory)
{
    float cost = 0.0f;

    cost += ComputePoseCost (currentPose, candidatePose);

    float responsiveness = 1.0f;

    cost += responsiveness *
        ComputeFutureCost (candidatePose, targetTrajectory);

    return cost;
}
```

总的Cost由两部分组成

Responsiveness控制了轨迹匹配的精确度，或者响应度

```
float ComputePoseCost (currentPose, candidatePose)
{
    float cost = 0.0f;

    cost += Distance (currentPose.RF.pos - candidatePose.RF.pos);
    cost += Distance (currentPose.RF.vel - candidatePose.RF.vel);
    cost += Distance (currentPose.LF.pos - candidatePose.LF.pos);
    cost += Distance (currentPose.LF.vel - candidatePose.LF.vel);
    cost += Distance (currentPose.RH.pos - candidatePose.RH.pos);
    cost += Distance (currentPose.RH.vel - candidatePose.RH.vel);
    cost += Distance (currentPose.LH.pos - candidatePose.LH.pos);
    cost += Distance (currentPose.LH.vel - candidatePose.LH.vel);

    return cost;
}
```

计算关节位置和速度的差距

```
float ComputeFuture Cost (candidatePose, targetTrajectory)
{
    float cost = 0.0f;

    cost += Distance (candidatePose.R.pos - targetTrajectory.pos);
    cost += Distance (candidatePose.R.vel - targetTrajectory.vel);

    return cost;
}
```

计算Pose与Trajectory的差距

Motion Matching: Play

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

2. 从动画数据库中检索查找最匹配的一帧动画

- 与“期望未来轨迹”的差距越小越好，但同时也不能偏离当前动画太多
- $C^* = \operatorname{argmin}_{C^{\text{candidate}}} \text{CalculateCost}(C^{\text{current}}, C^{\text{candidate}}, T^{\text{target}})$

3. 从最优帧开始播放动画

Motion Matching: Play

1. 获取当前状态+期望未来轨迹

- 当前状态：当前帧的pose
- 期望未来轨迹：位置+速度，来自玩家输入或无玩家输入

2. 从动画数据库中检索查找最匹配的一帧动画

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3. 从最优帧开始播放动画



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Motion Matching: Pros & Cons

Pros:

- 自动化处理，提升开发效率（尤其是增量开发）
- 产生高质量结果
- 实现相对简单
- 可嵌入到State Machine中

Cons:

- 依赖高质量数据
- 需要设计Cost函数
- 当前难以处理复杂行为（如攀爬、射击和复合动作）

State Machine vs. Motion Matching

	State Machine	Motion Matching
动画来源	制作/动捕	动捕
动画转移	手工设计	自动匹配
数据要求	任意动画数量	对规模和质量有一定要求
复杂度	随动画数量平方级增长	随动画数量线性增长
适用性	复杂动作下需要大量调优	理论上能适用任何动作
伸缩性	复杂情况下难以变动	可通过数据和算法随意扩展
多样性	可用于任意模型	当前只能用于人类模型

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Optimizations of Motion Matching

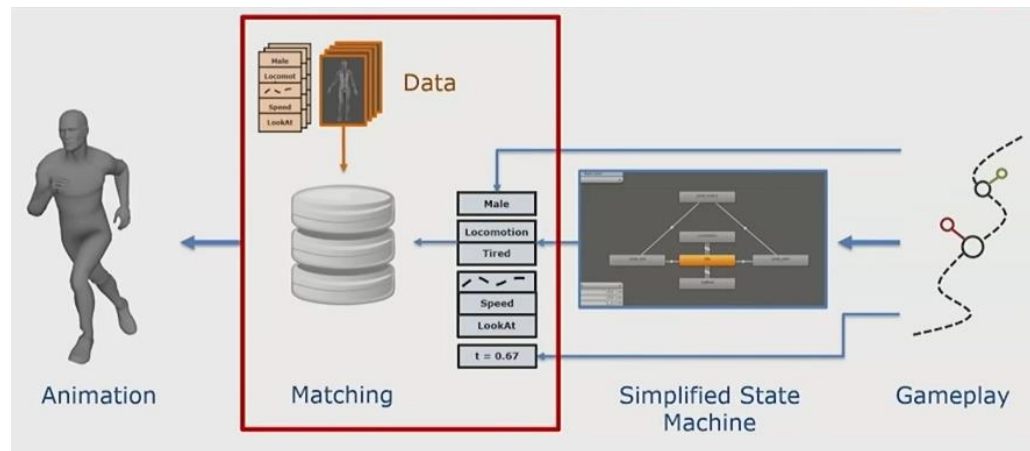
问题：Naïve Motion Matching 计算量过大

目标：减小计算量

- 增大更新间隔 (Update Interval)
- 增大容忍度 (tolerance)
- 标记不参与搜索的Pose
- 对pose进行分类，在搜索时只在某些类别中搜索
- 提高搜索效率：KD-Tree / PCA / Candidate Set / KNN search / Neural Network

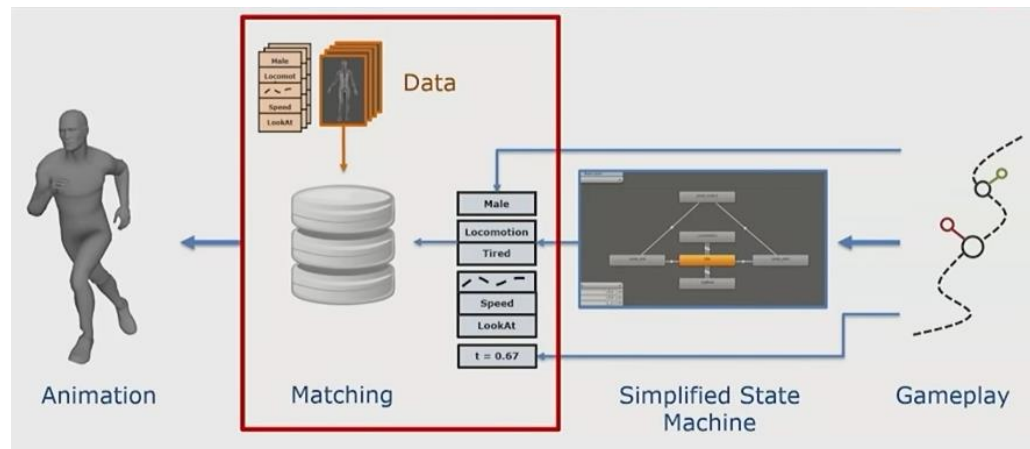
Integrating MM into State Machine

- 将状态机分为Gameplay与Animation两个部分
 - States -> Variables
 - Querying -> Matching



Integrating MM into State Machine

- 将状态机分为Gameplay与Animation两个部分
 - States -> Variables
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- 可以使用KNN找到最优Pose



Input x

- **Joint Positions** in the previous frame.
- **Joint Velocities** in the previous frame.
- **Target Position** of the root in 1 second.
- **Target Velocity** of the root in 1 second.
- **Target Direction** of the root in 1 second.

Function f

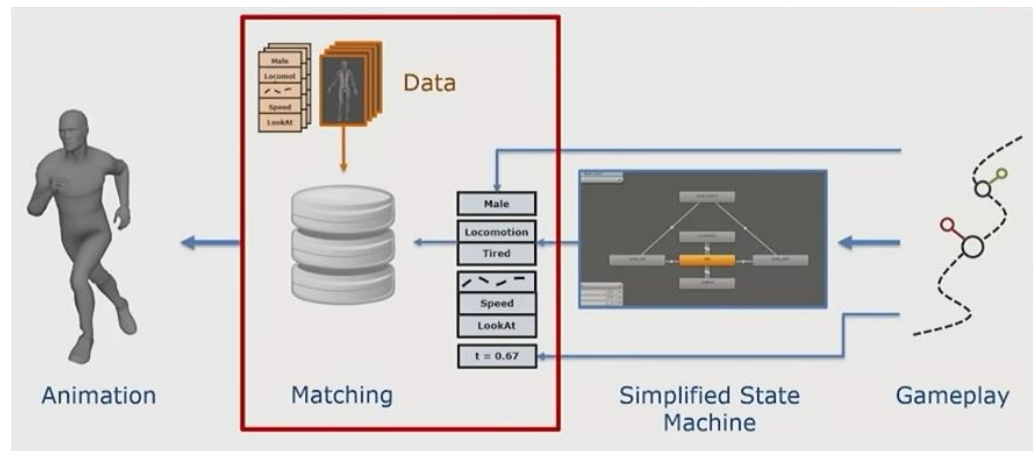
- **Call** every 1 second or...
- **Call** if the user input changes.

Output y

- **Joint Positions** for the next 1 second.
- **Joint Rotations** for the next 1 second.

Integrating MM into State Machine

- 将状态机分为Gameplay与Animation两个部分
 - States -> Variables
 - Querying -> Matching
- 可以使用KNN找到最优Pose
- 或者可以使用Neural Network!



$$y = W_2 \sigma(W_1 \sigma(W_0 x + b_0) + b_1) + b_2$$

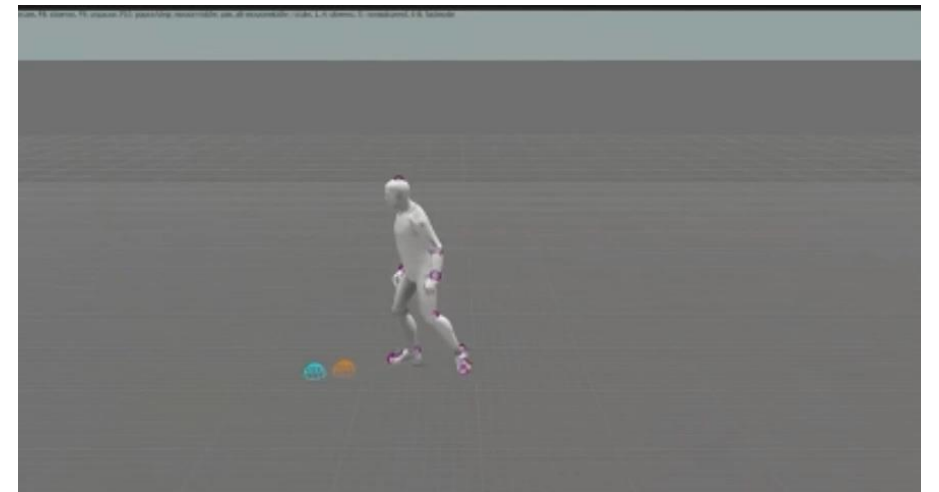
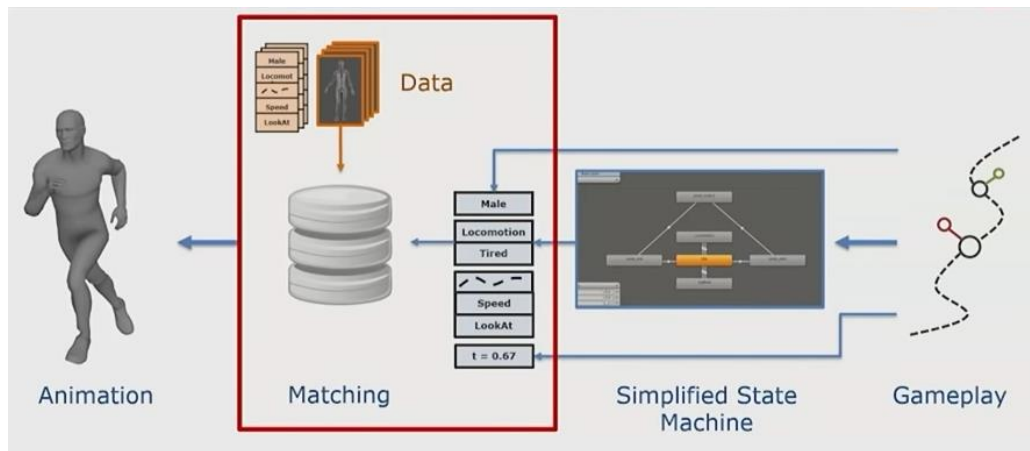
$y = f(x)$

y	x
5.12	1.33
2.12	7.21
⋮	⋮
0.31	9.03
2.54	1.28

Integrating MM into State Machine

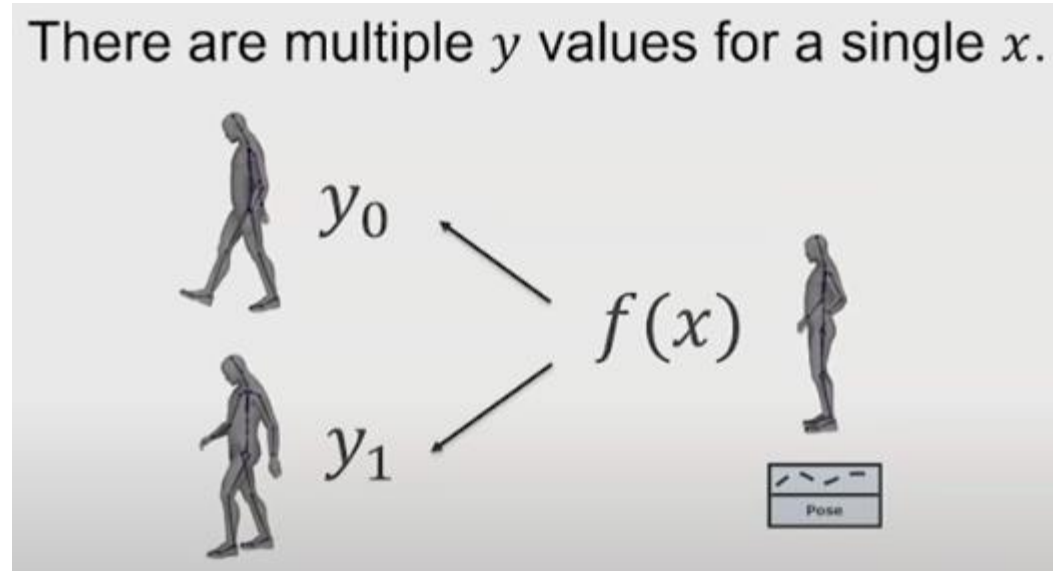
- 将状态机分为Gameplay与Animation两个部分
 - States -> Variables
 - Querying -> Matching
- 可以使用KNN找到最优Pose
- 或者可以使用Neural Network!

但是效果……



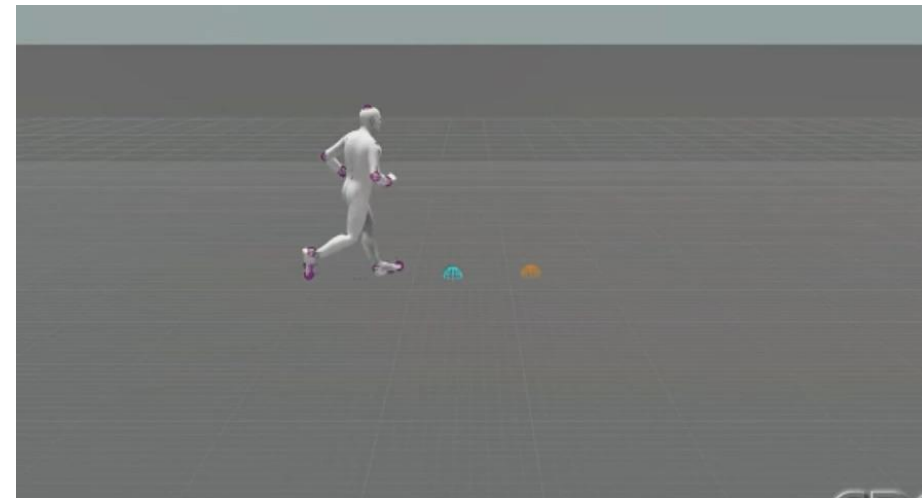
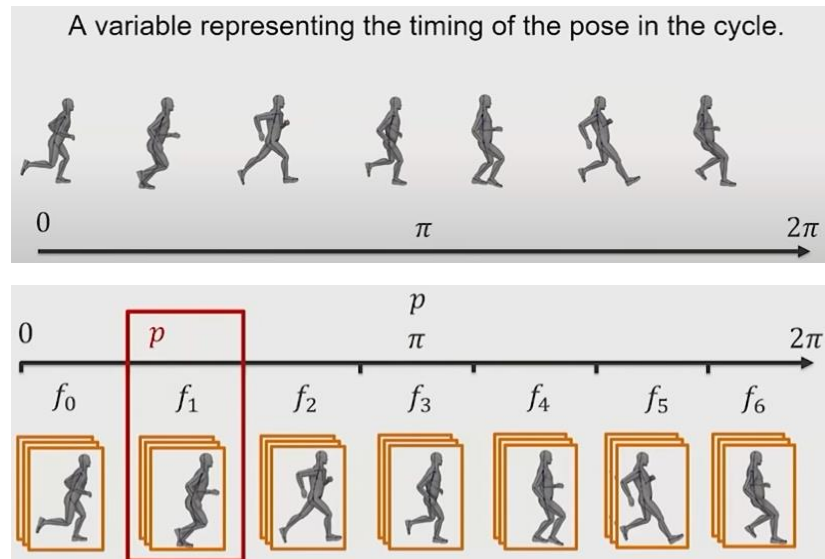
Why NN does not work

- 一个输入 (X) 可能对应多个可行的输出 (Y)
- 模型将多个可行的输出进行了平均
- 如何解决?



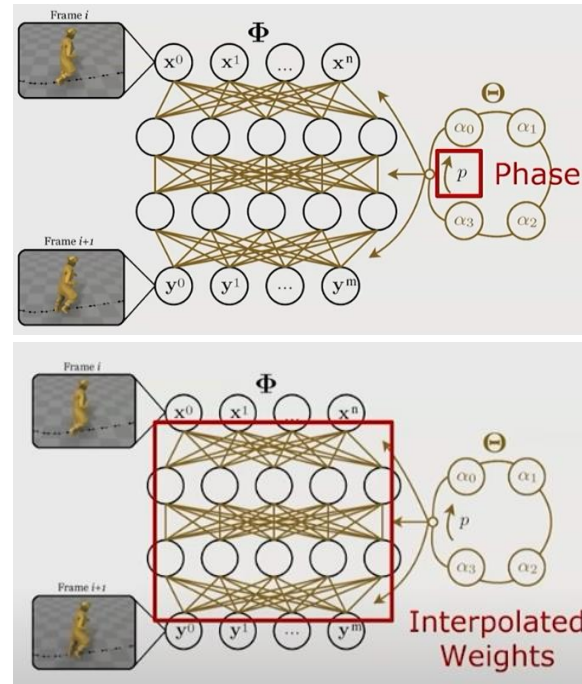
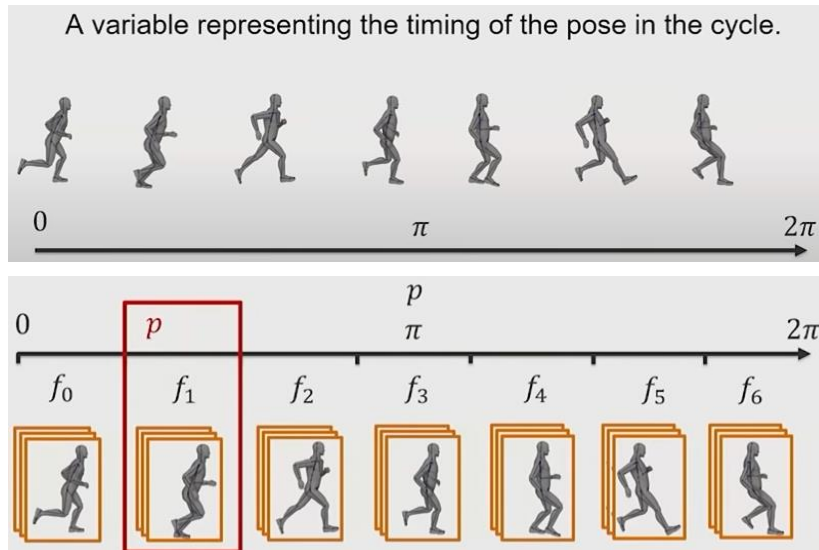
PFNN: Introducing Animation Phases

- 引入Phase: 代表了当前Pose处于所在Animation Clip的哪个阶段
- 不同的Phase有不同的模型去处理
- Phase $p \in [0, 2\pi)$



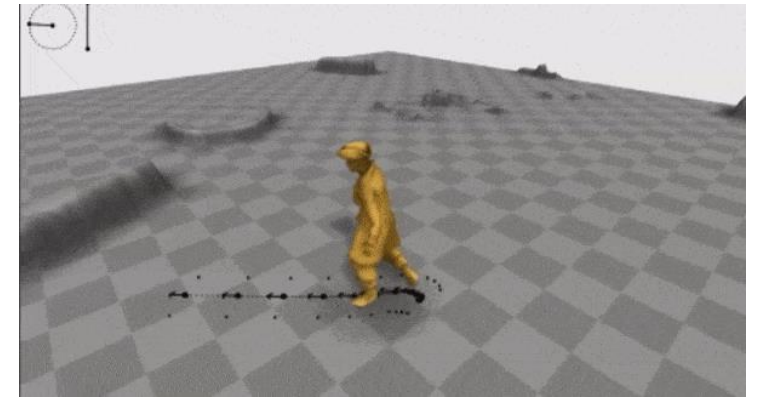
PFNN: Introducing Animation Phases

- Blend不同phase model的参数



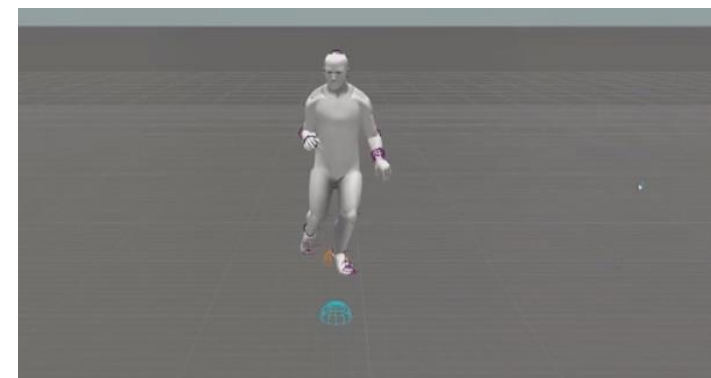
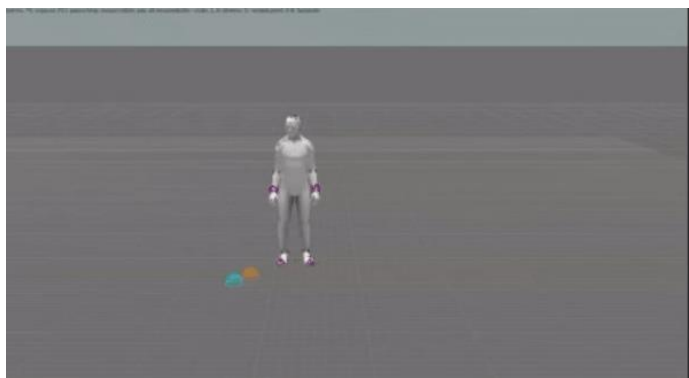
PFNN: Introducing Animation Phases

- 给不同的动作加上Tag, 提高scalability



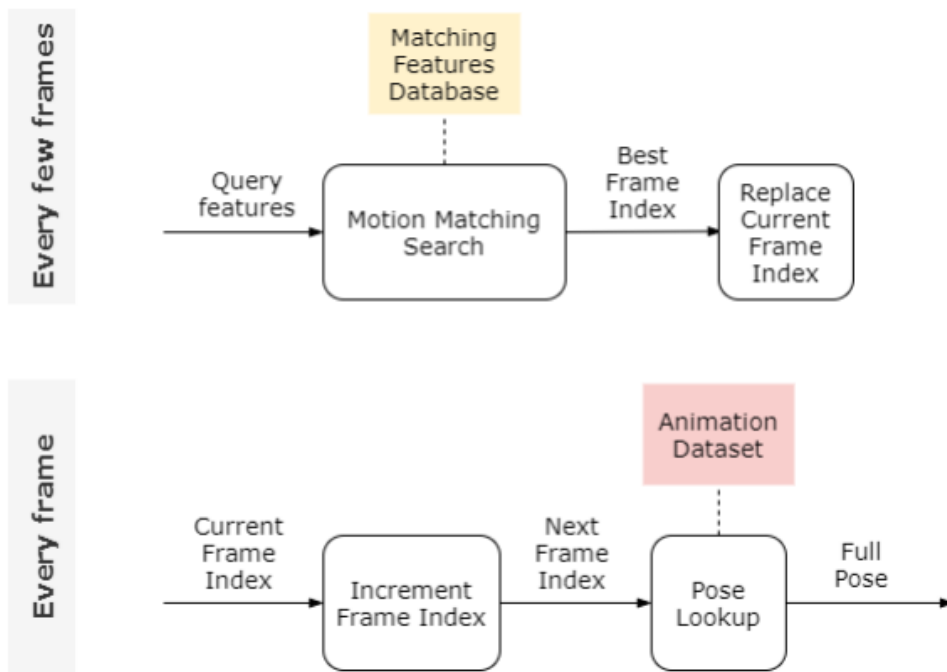
PFNN: Introducing Animation Phases

- 但是如果调不好模型……



Learned Motion Matching

- 既然要追求机器学习，那就贯彻到底咯……
 - 目标：减少资源消耗



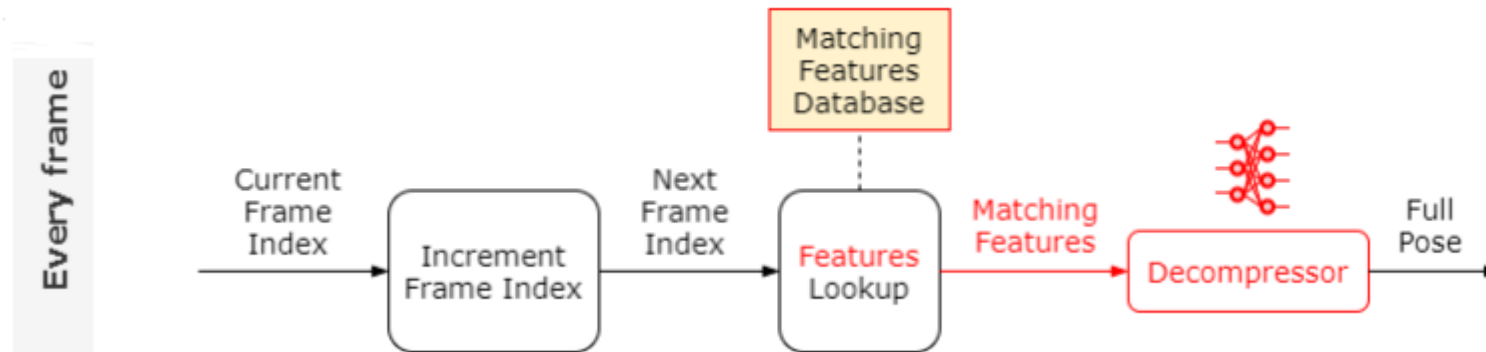
- Matching Features Database: 由feature vector组成，每个feature vector都是动画库中每个pose的位置、速度数据
- Animation Dataset: 原始动画数据库
- Matching Features Database与Animation Dataset都必须在运行时加载进内存
- Every few frames: 每过几帧进行一次MM
- Every frame: 每一帧都要从动画数据库中抽取下一帧动画进行播放

Learned Motion Matching

- 第一步：从内存中移除Animation Dataset

- Motivation: Feature vector已经包含了原始动画的许多重要信息，可以通过feature vector还原

训练一个Decompressor网络，输入是feature vector，输出是pose信息（每个joint的pos/vel）



Learned Motion Matching

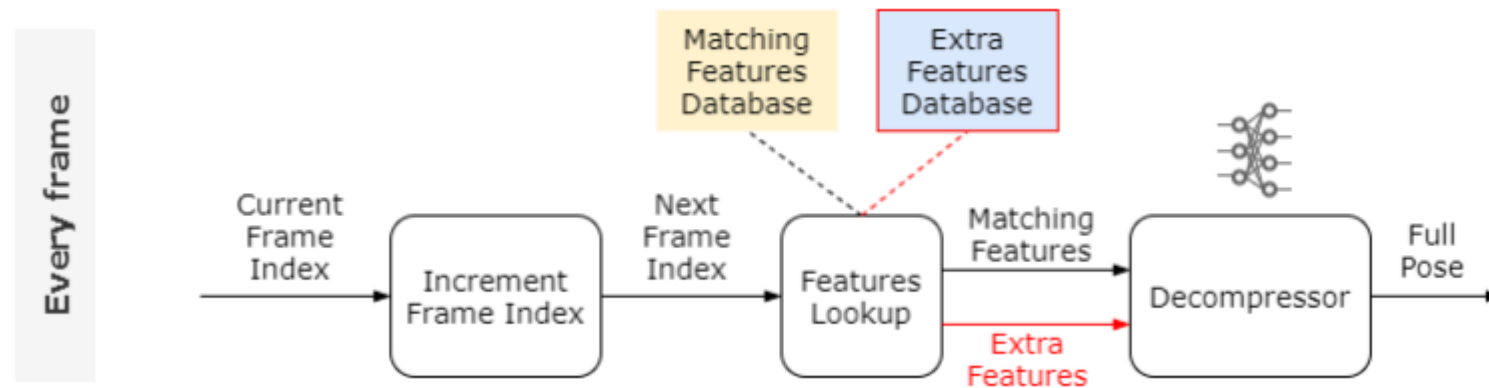
- 第一步：从内存中移除Animation Dataset
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- 但是这是从低维映射到高维，难免会有信息损失
- 解决方法：输入时加入额外信息（类似phase的思路）

Learned Motion Matching

- **第一步：从内存中移除Animation Dataset**

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训练一个自编码器，自动提取每个feature vector的额外信息，然后把该extra feature一起输入到Decompressor中形成一个Extra Features Database

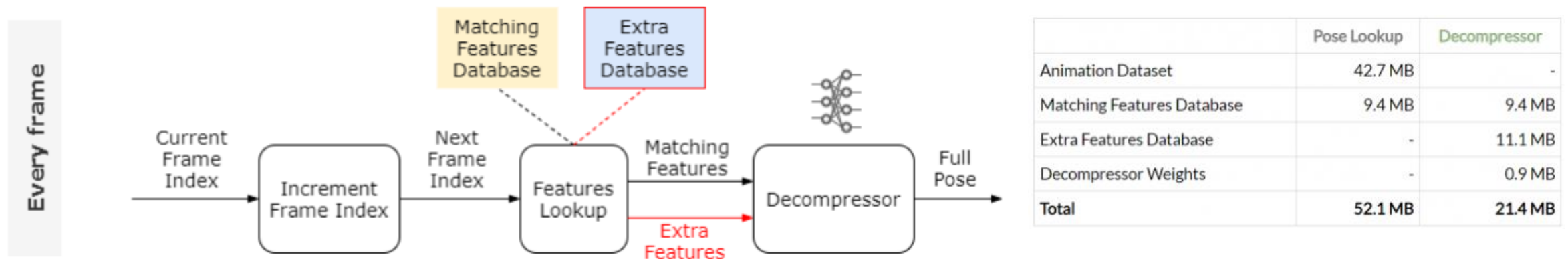


Learned Motion Matching

- **第一步：从内存中移除Animation Dataset**

- Motivation: Feature vector已经包含了原始动画的许多重要信息，可以通过feature vector还原
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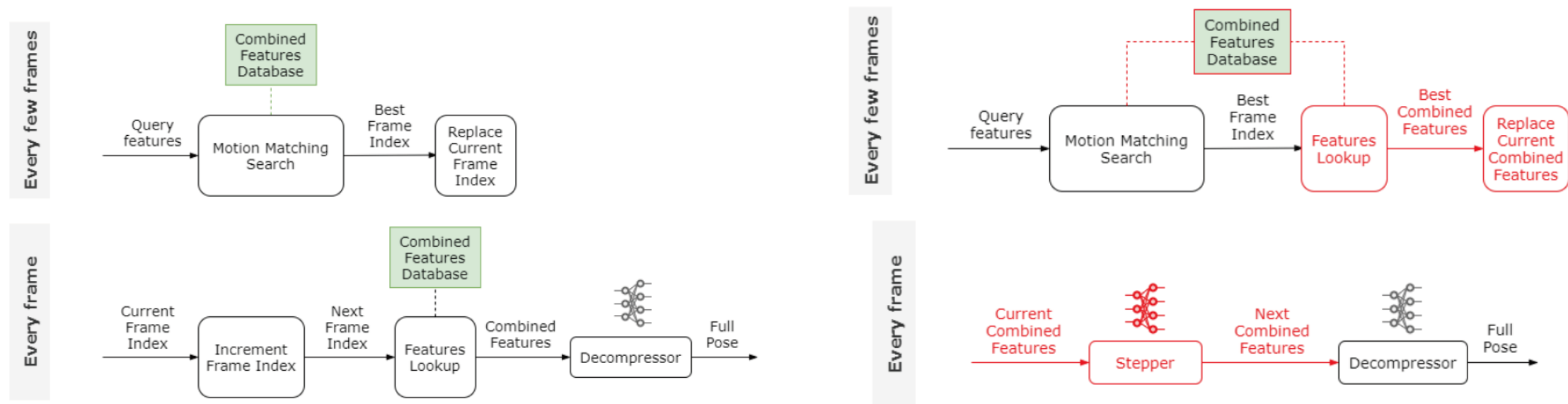
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Learned Motion Matching

- 第二步：从内存中移除Combined Features Database (合并两个database)

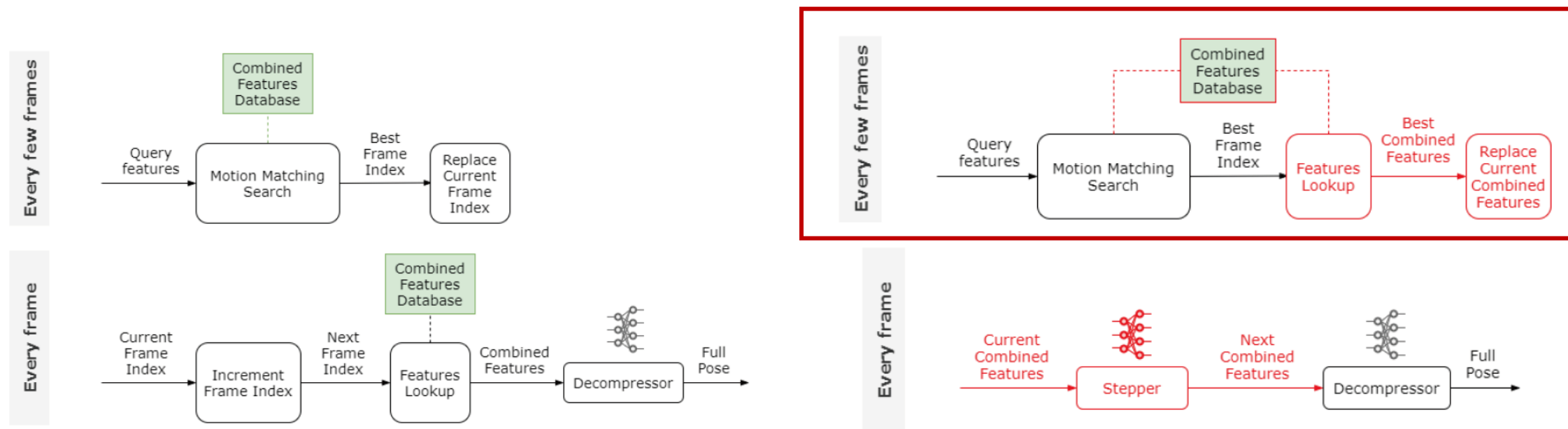
训练一个Stepper网络，在**每帧**执行的时候输入上一帧的Combined feature，输出下一帧的feature



Learned Motion Matching

- 第二步：从内存中移除Combined Features Database (合并两个database)

训练一个Stepper网络，在**每帧**执行的时候输入上一帧的Combined feature，输出下一帧的feature
但是在Every few frames阶段仍然需要访问Combined Features Database

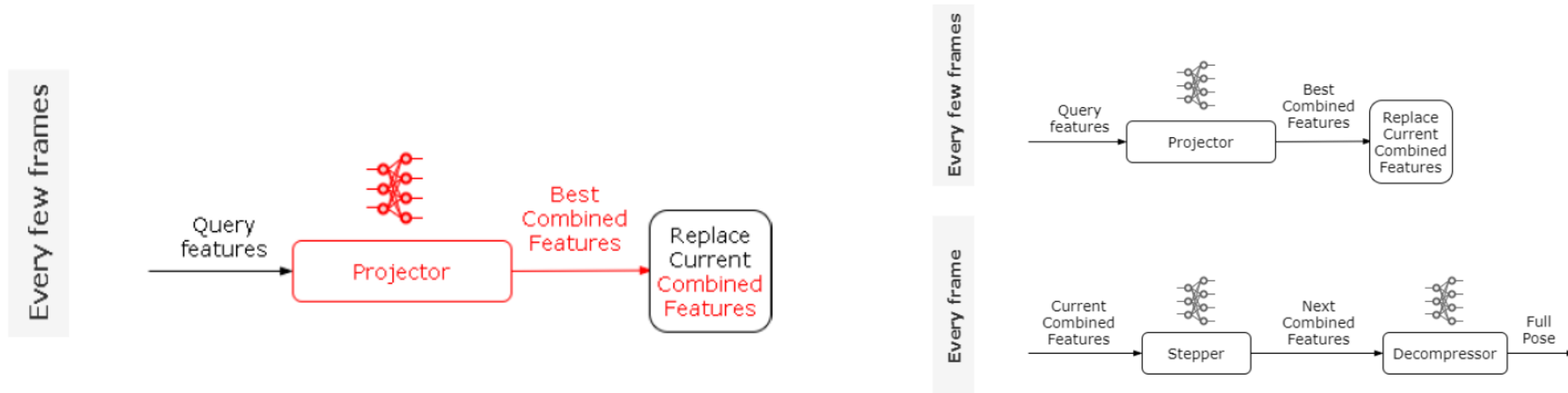


Learned Motion Matching

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训练一个Stepper网络，在**每帧**执行的时候输入上一帧的Combined feature，输出下一帧的feature
但是在Every few frames阶段仍然需要访问Combined Features Database

训练一个Projector网络，输入是query vector，输出是combined feature

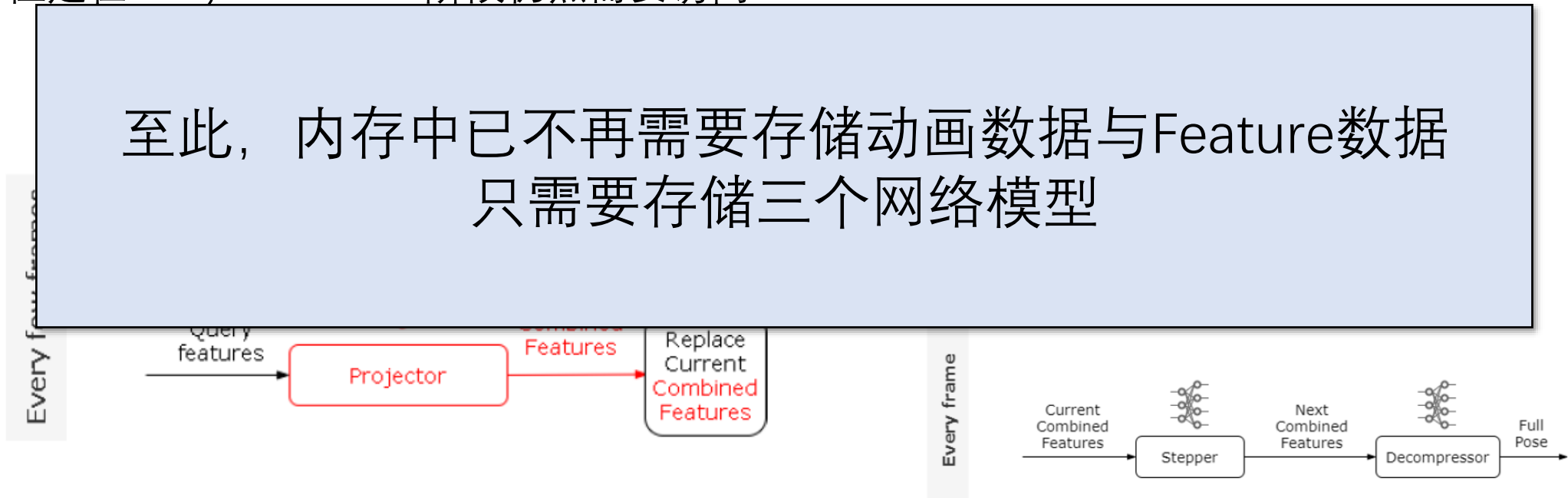


Learned Motion Matching

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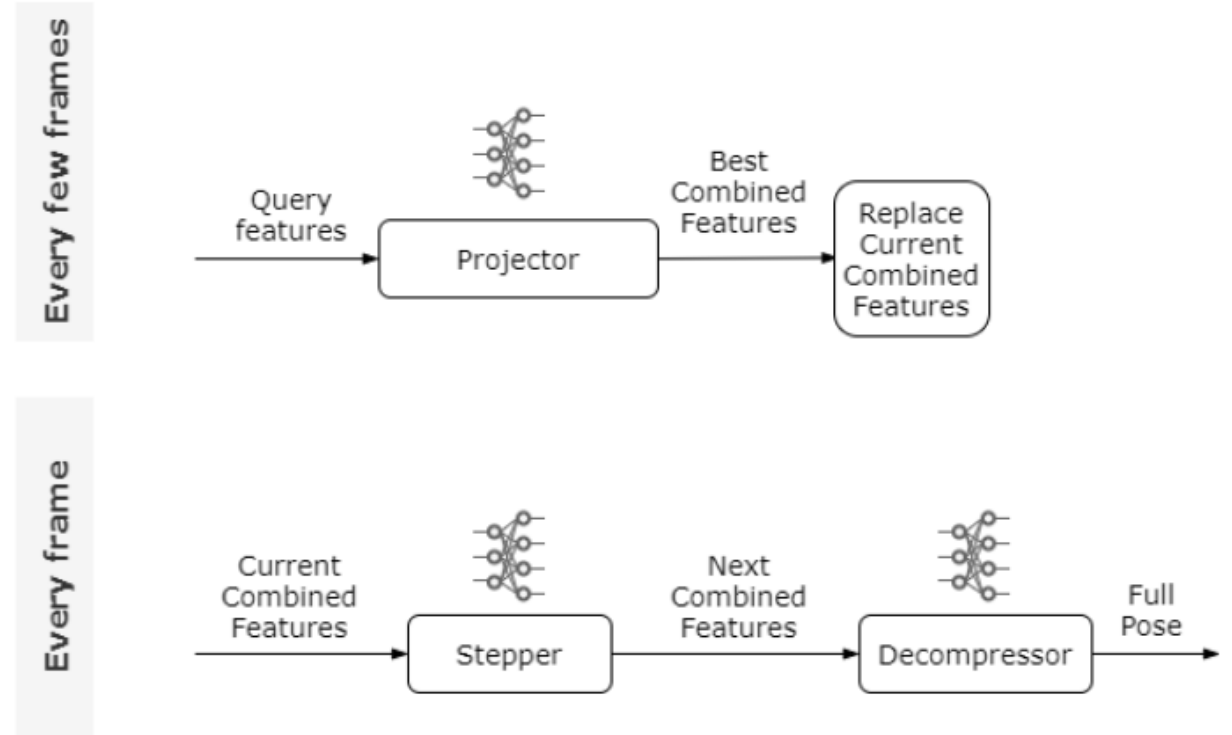
训练一个Stepper网络，在**每帧**执行的时候输入上一帧的Combined feature，输出下一帧的feature
但是在Every few frames阶段仍然需要访问Combined Features Database

至此，内存中已不再需要存储动画数据与Feature数据
只需要存储三个网络模型



Learned Motion Matching

- Decompressor: 给定combined feature预测full pose
- Stepper: 给定当前combined feature预测下一帧combined feature
- Projector: 给定query预测当前combined feature



Learned Motion Matching

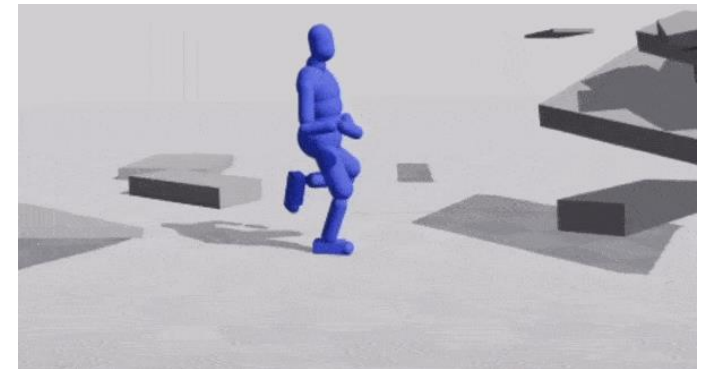
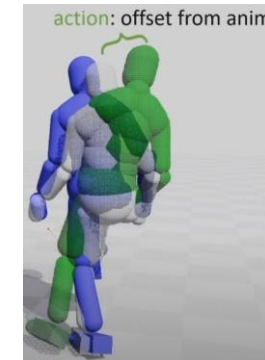
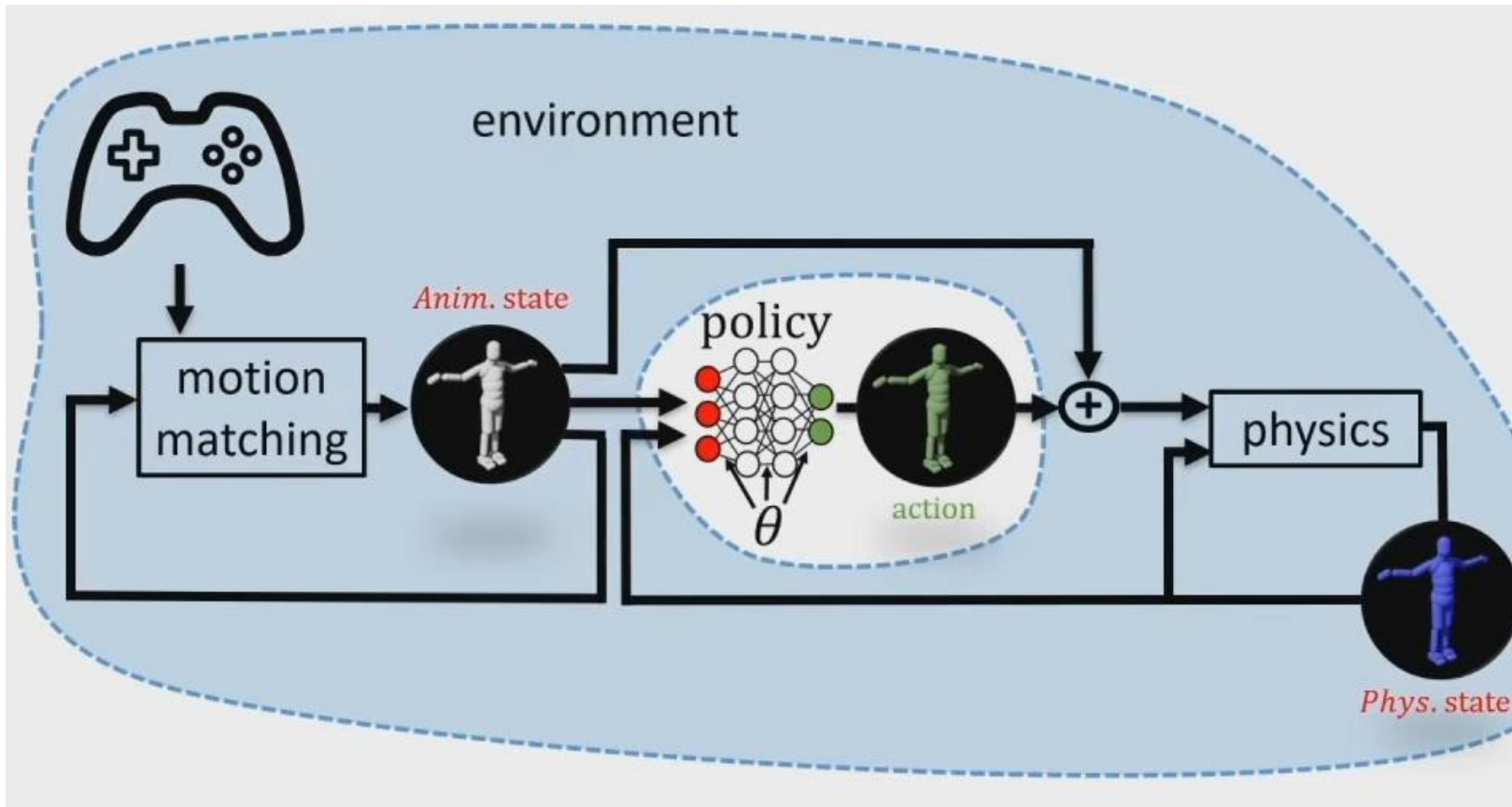
	Pose Lookup	Decompressor	Learned Motion Matching
Animation Dataset	42.7 MB	-	-
Matching Features Database	9.4 MB	9.4 MB	-
Extra Features Database	-	11.1 MB	-
Decompressor Weights	-	0.9 MB	0.9 MB
Stepper Weights	-	-	1.2 MB
Projector Weights	-	-	3.2 MB
Total	52.1 MB	21.4 MB	5.3 MB

	Pose Lookup	Decompressor	Learned Motion Matching
Animation Dataset	461.0 MB	-	-
Matching Features Database	129.8 MB	129.8 MB	-
Extra Features Database	-	47.2 MB	-
Decompressor Weights	-	2.4 MB	2.4 MB
Stepper Weights	-	-	1.4 MB
Projector Weights	-	-	13.0 MB
Total	590.8 MB	179.4 MB	16.8 MB

Learned Motion Matching



Using Reinforcement Learning



Motion Matching —— 概念与发展

Table of Contents

- 基于状态机的动画
- Motion Matching的引出与基本概念
- Motion Matching的要点与对比
- Motion Matching的发展
- 小结

Summary

- Motion Matching是近年来动画系统的一大发展，已经有越来越多的大厂开始使用这项技术，并取得了不错的效果
- Motion Matching的基本思想是根据玩家输入自动查找下一帧最匹配的动画，从而实现连续局部最优
- Motion Matching也存在许多不足，比如对数据要求很高、处理复杂度较大、难以应对复杂动作等等
- Deep Learning + Motion Matching是未来的一大发展方向
- 长期来看，仍然以State Machine为主

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