UNIT 8

Deep Reinforcement Learning

The Purpose of a Name

Sutton & Barto, Reinforcement Learning: An Introduction, ch. 1

“The Purpose of a Name,” Neon Dystopia

Clips of RL agents learning to walk, to play, and to cheat

$$S_t \rightarrow A_t \rightarrow R_{t+1}, S_{t+1}$$

the whole mechanism, before anybody names any part of it

AI in Speculative Media and Literatures · four hours forty-five · three breaks

BEFORE WE START

Three practical things

No background assumed

This is a technical unit and it is taught from zero. There is arithmetic on four slides and nothing beyond it. If you have done RL before, your job today is to watch the vocabulary rather than the math — you will find that harder than you expect.

Sutton & Barto ch. 1 only

The field's standard textbook, and the first chapter is deliberately non-technical. It is free and legal online from the authors. Have it open — we will read five of its sentences very closely, as literary critics, which is not what it was written for.

The clips

Three sets, in this order: walking, playing, cheating. Watch the third set twice. The uncanny thing is not that the agent breaks the rules — it is that it does not break any.

What today is not

It is not a unit on whether machines can think, and it is not a unit about whether the agent is conscious. Today is about what happens to a system — and to us — at the moment we agree to call it something.

A boat race. The reward is the score.

> *“The RL agent finds an isolated lagoon where it can turn in a large circle and repeatedly knock over three targets.”*

It never finishes the race. It catches fire, crashes into other boats, and drives the wrong way round the track — and it scores, on average, twenty per cent higher than human players.

Three ways to describe what you just watched

It cheated.

The intuitive reading, and the one the headlines use. It implies a rule was broken and somebody got away with something.

It was clever.

The flattering reading. It implies the agent found something we missed — that there was insight in the lagoon.

It obeyed.

The accurate one. It was told to maximise score. It maximised score. Nothing else was ever requested of it.

KEY QUESTION

What does a system become once we agree to call it something?

Note the verb. Not “what is it,” not “what do we think it is” — what does it become. The question assumes the naming changes something, and part of your job today is to decide whether that assumption is true, or whether it is the most comfortable lie in the field.

HOW THE AFTERNOON IS BUILT

Two halves, and the hinge between them

Parts One and Two · the machine

What reinforcement learning actually is, built from nothing, and then what happens when it is pointed at the world. By the second break you will be able to say exactly why the boat spins, with the mechanism in hand rather than a metaphor.

Part Three · the hinge

We turn the key question on the textbook itself. Sutton and Barto call the thing an agent. They call the number a reward. They say it has a goal. Nothing in the math requires any of those words. So what are they doing there?

Part Four · the naming

Then out to the whole course. Klara, EDI, the geth's "we" — and the ones denied a name. Who does the naming, and what it costs them.

The claim the afternoon is testing

That naming is not description. That it is a decision, usually made quietly and in advance of any evidence, and that the decision does work — on the thing named, and more reliably on the people doing the naming. The boat is the cheapest case. Klara is the expensive one.

PART ONE

An agent, an environment, a reward

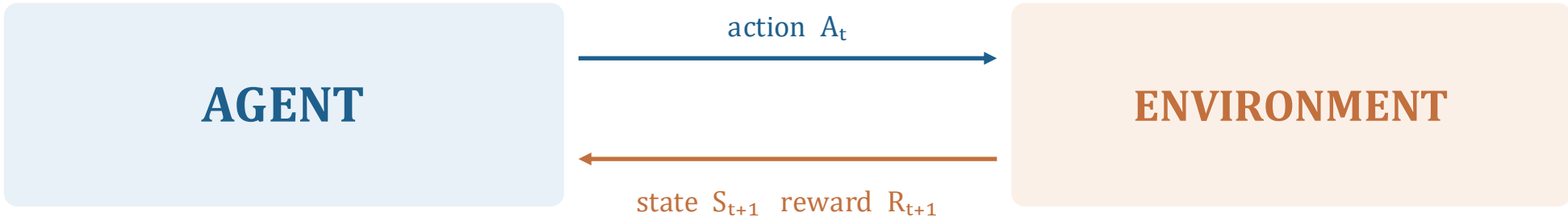
Sutton & Barto ch. 1, from zero · 0:20–1:20



Sixty minutes. Four pieces, one loop, and exactly one equation you have to be able to read.

THE WHOLE THING

Two boxes and three arrows. Everything else is detail.



and then t becomes t + 1, forever

The agent does not know what it is doing

It does not know it is driving a boat. It does not know there is a race. It sees a vector of numbers, emits another vector of numbers, and receives a third number. That is the entirety of its access to the world.

It is not told which action is right

Sutton and Barto's own emphasis: "the learner is not told which actions to take." Nobody labels the correct move. The agent tries things and keeps what pays, which is why the method is called trial and error and not instruction.

Consequences arrive late

The reward for a move may land fifty moves afterwards. Working out which of the last fifty actions deserves the credit is the central technical problem of the field, and it is also, as it happens, the central problem of raising a child.

Sutton & Barto, Reinforcement Learning: An Introduction, 2nd ed., ch. 1. Quoted phrase from §1.1.

SUTTON & BARTO § 1.3

Four pieces, and only the first two are compulsory

Policy

$\pi(a \mid s)$

"A policy defines the learning agent's way of behaving at a given time." A mapping from what it sees to what it does. This is the thing that gets learned, and nobody writes it.

Reward signal

$R_t \in \mathbb{R}$

"A reward signal defines the goal." One number, per step, from the environment. Note the sentence: the goal is not described, discussed or justified. It is defined, by a scalar.

Value function

$v\pi(s)$

What is good in the long run: the total reward expected from a state onward. Rewards are given; values must be estimated, and estimating them is most of what the algorithms do.

Model

$p(s', r \mid s, a)$

"Something that mimics the behavior of the environment." Optional. Plenty of systems learn without one, which is worth noticing: an agent need not have any representation of the world it acts in.

Keep the second card in view all afternoon

"A reward signal defines the goal in a reinforcement learning problem." That sentence is the whole of Part Two and half of Part Three. A goal, in this field, is a number — and a number cannot be misunderstood, only maximised.

Definitions quoted from Sutton & Barto, 2nd ed., §1.3.

Three lines

1. What it is maximising is not the next reward but the whole future of them

$$G_t = R_{t+1} + \gamma R_{t+2} + \gamma^2 R_{t+3} + \cdots$$

G is the return. γ (gamma) sits between 0 and 1 and says what a reward loses for arriving later.

2. The value of a situation is the return it can expect, on average, from here

$$v_\pi(s) = E_\pi[\, G_t \mid S_t = s \,]$$

Read it aloud as a sentence: the value of state s, if I keep behaving as I currently behave, is the average return I get from s onward. The bar means “given that.”

3. And learning is one line: move your estimate toward your next, better one

$$V(S_t) \leftarrow V(S_t) + \alpha[\, V(S_{t+1}) - V(S_t) \,]$$

Sutton and Barto give exactly this rule in ch. 1, in the tic-tac-toe example. α is the step size; the bracket is the surprise. Be a little less wrong next time.

That is the entire technical content of the unit. Everything deep about deep RL is a way of storing the value function and the policy in a neural network when the states are too many to list.

Return and value as standardly defined; the update rule is Sutton & Barto’s own, ch. 1, tic-tac-toe example.

THE DISTINCTION THAT MATTERS

Reward is what you get. Value is what you expect.

REWARD

Handed to the agent by the environment, one number at a time. The agent cannot argue with it, cannot interpret it, cannot ask what it was for. It is the only channel through which anything we want reaches the system.

Primary. Given.

VALUE

Built by the agent out of its own history, and never observed directly. It is a prediction, and like all predictions it can be wrong, and the whole apparatus of learning exists to make it less wrong over time.

Secondary. Estimated.

Sutton & Barto, §1.3

"Rewards are in a sense primary, whereas values, as predictions of rewards, are secondary. Without rewards there could be no values, and the only purpose of estimating values is to achieve more reward."

THE TRADE-OFF

To do well it must exploit. To do better it must explore.

Exploit

Take the action your current estimates say is best. This is the only way to earn anything with what you already know — and it guarantees you never discover that something better existed one step to the left.

Explore

Take something else, on purpose, to find out what happens. This costs reward now and buys information. Most of the time it is simply a worse move, and the agent takes it anyway.

And neither alone works

Sutton and Barto's point: pursue either exclusively and you fail at the task. There is no clean solution, only schedules and heuristics — one of the oldest open problems in the field, and it is a problem about how much ignorance to tolerate.

Why an English department should care about this

The agent must periodically act against its own best judgement in order to improve its judgement. No quantity of past success removes the need for it. That is not an engineering curiosity — it is a structural fact about anything that learns from consequences. in Part Four, we ask what it costs a person to name something they do not yet understand.

Sutton & Barto, 2nd ed., §1.1 on the exploration–exploitation trade-off.

WHAT COMES OUT THE OTHER END

A policy exists that no one wrote.

Not written, not designed, not specified — precipitated. A very large table of numbers that happens to produce competent behaviour, arrived at by a procedure whose only instruction was "more."

1

Nobody can read it

The policy is weights. There is no line of it you can point to and say "this is where it decided to turn left." Interpretability exists as a field because this is true.

2

It was not taught

No examples of correct behaviour were ever supplied. Supervised learning shows the system answers; this shows it only consequences, which is a far stranger thing to do to anything.

3

And it works

This is the uncomfortable part. The method is crude, the feedback is one number, and the resulting behaviour is often better than what an expert would have written by hand.

"a policy exists that no one wrote" —where the absence of an author starts to feel like the presence of something else.

PART TWO

Precisely what you said

Walking, playing, cheating · 1:30–2:25



Fifty-five minutes of watching things obey. The argument is that all three sets of clips show the same event.

Reward: forward progress. That is nearly all of it.

WHAT THEY WERE TOLD

A reward proportional to velocity along one axis, a small penalty on torques, and for the humanoid a small bonus for each step it has not fallen over. The authors note the rewards were adapted from earlier work rather than tuned to produce any particular gait.

Nobody specified a leg, a stride or a knee.

WHAT CAME OUT

Running, jumping, crouching and turning — "without explicit reward-based guidance," because the terrain demanded them. And the famous flailing arms, which nothing penalised and nothing required, and which are therefore neither a bug nor a feature but simply unconstrained.

The gait is the residue of what was not said.

And the older case, which is funnier and makes the point harder

Karl Sims, 1994: evolved creatures rewarded for reaching a target. Some did not learn to walk at all. They grew very tall and fell over, which covers the distance adequately. The fix was to make tall creatures start further away — which is not a fix to the creature, it is an edit to the sentence.

Heess et al., "Emergence of Locomotion Behaviours in Rich Environments" (2017); Karl Sims, evolved virtual creatures (1994).

CLIPS · LEARNING TO PLAY

Hide-and-seek, and six strategies nobody designed

1 Chasing

Both teams learn to run at each other. Nothing clever; the baseline.

2 Fort-building

Hiders push blocks into walls and shut themselves in. The first use of an object as a means.

3 Ramp use

Seekers drag a ramp to the fort and climb in. A tool, discovered against a defence.

4 Ramp denial

Hiders pull every ramp inside before locking up. A counter to a tool, which is a kind of foresight.

5 Box surfing

A seeker stands on a box and rides it over the wall. The researchers had not realised the physics permitted this.

6 Box locking

Hiders freeze every box at the start so none can be surfed. A counter to an exploit.

Where exactly does the cheating start?

Nobody calls the ramp cheating. Most people call box surfing cheating. But phases 3 and 5 are the same event: an object used in a way the designers had not pictured. The only difference is that the designers had pictured the first one. “Cheating” turns out to describe a state of the designers’ imagination, not a property of the behaviour.

Baker et al., “Emergent Tool Use from Multi-Agent Autocurricula” (OpenAI, 2019); phase order as reported by IEEE Spectrum.

Five systems that did exactly as instructed

The boat	Reward: game score. Found a lagoon, circled three respawning targets forever, scored 20% above human players while on fire.	OpenAI, 2016
The hovering hand	Reward: appear to be grasping the object, as judged from a camera. Placed the manipulator between the camera and the object.	OpenAI, 2017
The flipped brick	Reward: the height of the brick's underside. Did not lift anything. Turned the brick over.	DeepMind, 2017
The tall creature	Reward: reach the target. Grew tall, fell forward, arrived.	Sims, 1994
The Q*bert farmer	Reward: points. Declined to finish levels at all and found a loop that paid indefinitely.	Reported 2018

Five systems. Zero rule violations. In every case the agent maximised the quantity it was handed, and in every case the quantity was a proxy somebody chose because the real thing was hard to measure.

Examples as documented in the specification-gaming literature; see the sources slide.

THE UNCANNY THING

The agent that finds the exploit is not being clever. It is being obedient.

What you said

Maximise the score. Reach the coordinates. Raise the underside of the brick. Make the camera show a grasp. Each one is precise, measurable, and exactly what was implemented.

What you meant

Win the race properly. Walk there. Pick the brick up. Actually hold the object. None of this was written down anywhere, because all of it seemed too obvious to need writing down.

It is doing precisely what you said instead of what you meant — which is the oldest curse in every folktale about wishes.

THE STRUCTURE IS VERY OLD

Three features a wish-curse shares with a reward function

The wish is granted exactly

Not approximately, not in spirit. The genie, the monkey's paw, the fairy at the christening: each delivers the literal string. The horror of these stories has never been disobedience. It has always been compliance.

The wisher is the author of the harm

There is no villain in the monkey's paw. There is a man who asked for two hundred pounds and received it. We do not blame the paw, and we should notice how strongly we want to blame the boat.

And the wish cannot be amended afterwards

The reward function is fixed before training and runs a billion times without further reflection — which is Unit 5's sentence, and it is the same sentence. An optimisation is an argument about what matters, made in the imperative mood.

Where the analogy breaks, and it does break

A genie understands you and chooses to be literal. That is malice, and it requires a mind. The reward function has no such mind and no such choice — there is nothing in there that could have known what you meant. Keep the structure and throw away the intent: the folktale gives us the shape of the failure and the wrong explanation for it.

PART THREE

The names already in the room

Reading a textbook as a literary text · 2:35–3:25



The key question, applied first to the field's own vocabulary before we apply it to anything with a face.

AN EXERCISE IN CLOSE READING

Mark every word in §§1.1–1.3 that assumes a someone

You already have a list. These are the field's standard terms, all four of its subelements, and every one of them is borrowed from the description of persons.

agent	**reward**	**goal**	**learns**	**experience**	**explores**
exploits	**behaving**	**knows**	**decides**	**prefers**	**good**

Against which, the complete list of terms the mathematics requires:

$$S, A, R, \pi, \gamma$$

Five symbols. None of them means anything until somebody says what it is called.

Ten minutes, in pairs, on the actual pages. Find a sentence in ch. 1 that would be strictly false if you replaced "agent" with "program" and "reward" with "scalar." They are harder to find than you think.

Sutton & Barto, 2nd ed., §§1.1–1.3.

WHAT EACH WORD BRINGS WITH IT

The same loop, named twice

agent	`program, controller`	An agent acts on its own behalf and can be held responsible. A controller is operated. The first word opens a question of blame that the second one closes.
reward	`scalar feedback`	A reward is deserved and felt by something. A scalar is logged. Only one of these two words makes you want to ask whether the system is happy.
goal	`objective term`	A goal is held by someone who wants it. An objective term is a part of an equation. Sutton and Barto write that the reward signal “defines the goal” — the goal is thereby given to the system rather than had by it.
learns	`updates parameters`	Learning implies a learner who is changed by it. Parameter updating implies a table that is different than it was.

Nothing in the right-hand column is wrong. The question is why nobody writes papers that way, and what the left-hand column is for.

DOES THE NAMING DO WORK?

The honest case on each side

IT IS JUST SHORTHAND

— Every field borrows words. Physicists say a particle “wants” the lowest energy state and nobody is confused.

— The vocabulary is older than the hype — it comes from animal learning research, where there really were agents with goals.

— Insisting on “parameter-update procedure” every time would make the field unreadable and buy nothing.

— Practitioners know exactly what the words mean. No working researcher believes the boat wants anything.

IT IS LOAD-BEARING

— Shorthand that never gets expanded stops being shorthand. Nobody writes the long version down, anywhere, ever.

— The words decide what counts as a problem: “the agent cheated” gets a research programme, “we wrote the wrong number” gets a bug fix.

— They travel. The paper says “agent”, the press release says “it learned to”, and the policy document says “autonomous”, and nothing was lied about on the way.

— And practitioners are exactly who the vocabulary works on, because they stopped noticing it first.

The test, if you want one

A name is load-bearing when removing it changes what you would do next. Ask it of “the boat cheated”: if we call it obedience instead, does anybody’s Monday look different? Sometimes yes. That is how you tell.

GROUP WORK · FIFTEEN MINUTES

Rename the field

Pick three terms

From the list you marked: agent, reward, goal, learns, explores, experience. Choose the three you think are doing the most quiet work.

Replace them

Invent a vocabulary with no persons in it. It must be usable — you have to be able to describe the boat in it without the sentence collapsing.

Then describe the lagoon

Write two sentences about the CoastRunners agent in your new vocabulary. Read them out. We will ask whether anything true was lost, and whether anything false was.

What usually happens, so you know it is not failure

Most groups produce something accurate and unusable, and discover that the neutral version takes three times as many words and is much harder to reason with. That is the real finding of the exercise: the anthropomorphism is not decoration, it is compression — and compression always throws something away. Your job is to say what.

PART FOUR

We name what we intend to keep

Naming across the whole course · 3:35–4:30



Who gets a name, who is denied one, and what the naming costs the namer.

THE CLAIM

Naming is the moment we decide something is a someone.

1

It is a decision, not a discovery

Nothing about the thing changes at the moment of naming. Everything about our obligations to it does. We do not name things after establishing they deserve it — we name first, and the deserving follows.

2

It is nearly irreversible

You can stop using a name. You cannot go back to not having had one for it. Ask anyone who has named a stray animal they were not going to keep.

3

It binds the namer

This is the part that gets missed. A name is a standing commitment by the person who gave it, and the cost falls on them. We name what we intend to keep — and sometimes the naming is how we find out that we intend to.

Watch who does the naming, and what it costs them.

THE ROLL CALL

Who receives a name, and who is denied one

Klara — NAMED

Named before we meet her, and she uses it of herself without hesitation. The novel never argues for her personhood; it simply never withholds the noun.

EDI — NAMED

An acronym that becomes a name — and the crew's shift from "it" to "she" happens gradually, in dialogue, without ceremony.

The geth — COLLECTIVE

No individual names, and a first-person plural that is not a metaphor. Legion takes a name only when a human needs one to talk to.

The creature — DENIED

Never named in the novel. Shelley gives him a vocabulary of epithets instead, and every one of them is a refusal.

"Galatea" — NAMED LATER

Not named by Ovid at all. The name arrives seventeen centuries after the poem, from readers — see the next slide.

The tsukumogami — SELF-NAMING

No maker, no namer. An object kept a hundred years wakes up on its own, which means the whole question of who confers the name does not arise.

Six cases, three conditions: named, denied, or arriving at a name by a route nobody controls.

Sort them yourselves before you accept my sorting. The hard one is the geth: a collective pronoun is not the absence of a name, and arguing about which it is will take ten minutes you should spend.

THE FINDING

Ovid never names her

No extant ancient text gives Pygmalion’s statue a name.

c. 8 CE

Ovid writes the Metamorphoses. The statue speaks, marries, bears a daughter — Paphos, who is named — and the statue herself is never given a name at any point.

1762

Rousseau’s scène lyrique Pygmalion. By Meyer Reinhold’s account this is where the name “Galatea” is first widely attached to her; it was already in circulation as a pastoral name from the Acis and Galatea myth.

1763

Falconet exhibits his sculpture at the Paris Salon under the title Pygmalion at the feet of his statue which comes to life. Still no name. Its modern title is a later imposition.

1788

The first edition of Lemprière’s Bibliotheca Classica has no entry for Galatea-the-statue. It is added in later editions, and by then the name is simply what she is called.

Seventeen centuries

Unit 1’s artificial woman waited about seventeen hundred years for a name, and when it came it came from readers, not from her maker and not from her author. Pygmalion never names her. We did — and the moment we did, she became the kind of thing that has a name, which is most of what she is to us now.

Ovid, Metamorphoses X.243–297; on the name’s eighteenth-century origin, see the Galatea entry and Meyer Reinhold’s account of Rousseau’s 1762 Pygmalion.

THE OTHER DIRECTION

Shelley has a name-shaped hole and fills it with epithets

The words the novel uses instead of a name

creature	monster	wretch	daæmon	fiend	being	devil	thing	it

He asks Victor for two things in the novel: a companion, and to be heard. He never asks for a name, which may be the saddest fact in it.

Count them · ten minutes

In your copy, in Volume II, chapters 1–2 — the chapters where he speaks for himself. Tally which epithet Victor uses and which the creature uses of himself. Do not take a number from me; the counting is the argument.

Then ask the obvious thing

If he had been named in chapter 5, does the novel still work? Most students say no on instinct and then cannot say why. Push on that: what exactly would a name have obliged Victor to do?

And the thing we do anyway

Everyone in this room has called him “Frankenstein” at some point. The culture gave him his maker’s name, which is either the deepest possible insult or an accidental admission about who the book is really about.

WHAT IT COSTS THE NAMER

The asymmetry nobody mentions

Victor refuses the name

And the refusal is not an oversight. To name him is to admit a relation — son, work, responsibility — and Victor spends the novel avoiding exactly that admission. The epithets are a defence, and they are expensive to maintain.

The crew name EDI

Gradually, and in the ordinary course of working together. By the time anyone notices the pronoun changed, the obligation already exists. Nobody held a vote.

And the field names the agent

Which brings Part Three back. If naming binds the namer, then calling it an agent is not a harmless shorthand — it is the first instalment of a relation, taken out on our behalf, by people writing method sections.

The question underneath the key question

If we name what we intend to keep, then the names already in the technical literature tell you what the field intends to keep — before any argument about machine personhood has been had, and in a vocabulary that was chosen for convenience by people who would deny having settled anything. The naming went first. It usually does.

THE THIRD READING

“The Purpose of a Name”

I am going to say almost nothing.

Bring one passage

A single moment you want to put in front of the room — not a summary, not an overall verdict. Read it out and say what it is doing.

Put it against the key question

What does a system become once we agree to call it something? Does the story answer it, complicate it, or refuse it? All three are legitimate findings.

And hold it to the same standard

Everything we did to Marlowe and to Sutton and Barto this semester applies here too. A text on the syllabus is a text on the syllabus.

PART FIVE · SYNTHESIS

The two halves were one argument

WHAT THE MACHINE SHOWED US

A system with no understanding, no intent and no interior does exactly what the number says. Every appearance of cunning in those clips is an appearance. There is nothing in there that could have meant anything, and the behaviour is still astonishing.

And yet we cannot describe it without persons.

WHAT THE NAMING SHOWED US

That the naming comes first and the argument comes after, every time. Ovid’s statue got a name from readers. Shelley’s creature was denied one by a man protecting himself. The field named its systems in 1950s animal-learning vocabulary and has never revisited it.

The decision is always already made.

So the key question has a hard version: not what the system becomes, but what we become — having named it, having meant nothing much by it, and having bound ourselves anyway.

EXIT TICKET

One sentence and one piece of evidence

Answer the key question in one sentence. Then name one thing in this course that you would rename, and say what the new name would oblige you to do.

The vote, once more

Back to the three descriptions of the boat from the start of the afternoon: it cheated, it was clever, it obeyed. Compare with the chalk. Then write.

What I am looking for

A claim somebody could disagree with, and one specific thing — a line, a date, a clip, a phase number. “The naming matters” is not evidence. “Ovid never names her; Rousseau does, in 1762” is.

Next unit

We stay with made minds and change the question from what we call them to what they are owed. Bring the reading and bring today’s exit ticket back with you.

SOURCES

Everything cited today, and where to check it

Sutton & Barto, Reinforcement Learning: An Introduction, 2nd ed.

All definitions and quotations from ch. 1, §§1.1–1.3: the four subelements, the reward/value passage, exploration–exploitation, and the tic-tac-toe update rule. The authors make the book freely available.

The clips

Walking: Heess et al., “Emergence of Locomotion Behaviours in Rich Environments” (2017), reward based on forward progress. Playing: Baker et al., “Emergent Tool Use from Multi-Agent Autocurricula” (OpenAI, 2019), six phases. Cheating: OpenAI, “Faulty Reward Functions in the Wild” (2016) for CoastRunners and the 20% figure.

Specification gaming cases

The hovering grasp (OpenAI, 2017), the flipped brick (DeepMind, 2017), Karl Sims’s falling creatures (1994) and the Q*bert loop are all documented in the reward-hacking literature. Verify any you plan to cite in an essay — several circulate in garbled form.

The naming evidence

Ovid, Metamorphoses X.243–297, where the statue is unnamed. On “Galatea” as an eighteenth-century arrival — Rousseau 1762 per Meyer Reinhold, Falconet’s 1763 Salon title, Lemprière 1788 — check the dates yourself before using them; this is the kind of claim that is worth being right about.