Q4 Evolutionary Selection Experiment Report

1. Experimental Methodology

1.1 Experimental Setup

Initial Population Configuration:

A mixed population consisting of AllCooperate, AllDefect, TitForTat, GrimTrigger, and PAVLOV was used, with an equal initial distribution:

| Generation | | | | GRIM | |
|------------|-------|-------|-------|-------|-------|
| 0 | 0.200 | 0.200 | 0.200 | 0.200 | 0.200 |

1.2 Evolutionary Mechanism

Replicator Dynamics

```
for (int gen = 0; gen < config_.generations; gen++) {
   history.push_back(populations);

   if (gen == config_.generations - 1) break;

   auto fitness = calculateFitness(populations, config_.rounds, config_.repeats);
   updatePopulations(populations, fitness);
}</pre>
```

```
std::map<std::string, double> SimulatorRunner::calculateFitness(
   const std::map<std::string, double>& populations, int rounds, int repeats) {
   std::map<std::string, double> fitness;
   for (const auto& strat_i : strategies_) {
       std::string name_i = strat_i->getName();
       double pop_i = populations.at(name_i);
       if (pop_i < 1e-6) {
           fitness[name_i] = 0.0;
           continue;
       double total_fitness = 0.0;
       for (const auto& strat_j : strategies_) {
           std::string name_j = strat_j->getName();
           double pop_j = populations.at(name_j);
           if (pop_j < 1e-6) continue;
           double avg_score = playMultipleGames(strat_i, strat_j, rounds, repeats);
           total_fitness += avg_score * pop_j;
       fitness[name_i] = total_fitness;
   return fitness;
```

```
void SimulatorRunner::updatePopulations(
   std::map<std::string, double>& populations,
   const std::map<std::string, double>& fitness) {

   double avg_fitness = 0.0;
   for (const auto& [name, pop] : populations) {
        avg_fitness += fitness.at(name) * pop;
   }

   if (avg_fitness < 1e-9) {
        std::cerr << "Warning: Average fitness is too low, skipping update.\n";
        return;
   }

   std::map<std::string, double> new_populations;
   for (const auto& [name, pop] : populations) {
        new_populations[name] = pop * (fitness.at(name) / avg_fitness);
   }

   populations = new_populations;
```

1.3 Experimental Parameters

1. Noise-free environment: $\varepsilon = 0.0$

2. Noisy environment: $\varepsilon = 0.100000$

3. **Evolutionary generations**: 50 generations

2. Results

2.1 Noise-Free Environment Evolution ($\varepsilon = 0.0$)

| Evolution | History | (Noise-H | Tree, eps | silon=0.(|)) |
|------------|---------|----------|-----------|-----------|--------|
| Generation | ALLC | ALLD | TFT | GRIM | PAVLOV |
| 0 | 0.200 | 0.200 | 0.200 | 0.200 | 0.200 |
| 4 | 0.202 | 0.053 | 0.248 | 0.248 | 0.248 |
| 8 | 0.205 | 0.009 | 0.262 | 0.262 | 0.262 |
| 12 | 0.205 | 0.001 | 0.264 | 0.264 | 0.264 |
| 16 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 20 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 24 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 28 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 32 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 36 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 40 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 44 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 48 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |
| 49 | 0.205 | 0.000 | 0.265 | 0.265 | 0.265 |

Key Observations:

1. Rapid Elimination Phase (Generations 0-16):

- ALLD declined sharply: $20\% \rightarrow 5.3\%$ (Gen 4) $\rightarrow 0.9\%$ (Gen 8) $\rightarrow 0\%$ (Gen 16)
- TFT, GRIM, and PAVLOV grew synchronously to ~26.5%
- ALLC increased slightly to 20.5%

2. Stable Equilibrium Phase (Generations 16-49):

- A stable four-strategy equilibrium formed
- Final distribution: TFT (26.5%), GRIM (26.5%), PAVLOV (26.5%), ALLC (20.5%)
- ALLD completely extinct

2.2 Noisy Environment Evolution ($\varepsilon = 0.10$)

| Evolution | History | (Noisy, | epsilon= | =0.100000 |)) |
|------------|---------|---------|----------|-----------|--------|
| Generation | ALLC | ALLD | TFT | GRIM | PAVLOV |
| 0 | 0.200 | 0.200 | 0.200 | 0.200 | 0.200 |
| 4 | 0.153 | 0.213 | 0.207 | 0.235 | 0.192 |
| 8 | 0.120 | 0.208 | 0.210 | 0.259 | 0.202 |
| 12 | 0.096 | 0.202 | 0.205 | 0.300 | 0.198 |
| 16 | 0.084 | 0.178 | 0.217 | 0.313 | 0.208 |
| 20 | 0.074 | 0.134 | 0.232 | 0.337 | 0.225 |
| 24 | 0.068 | 0.099 | 0.263 | 0.306 | 0.263 |
| 28 | 0.077 | 0.062 | 0.273 | 0.274 | 0.313 |
| 32 | 0.096 | 0.045 | 0.284 | 0.239 | 0.336 |
| 36 | 0.126 | 0.027 | 0.312 | 0.179 | 0.355 |
| 40 | 0.175 | 0.020 | 0.323 | 0.142 | 0.340 |
| 44 | 0.222 | 0.015 | 0.308 | 0.129 | 0.327 |
| 48 | 0.267 | 0.013 | 0.292 | 0.123 | 0.306 |
| 49 + | 0.276 | 0.013 | 0.293 | 0. 123 | 0.295 |

Key Observations:

1. Initial Fluctuation Phase (Generations 0-20):

- GRIM showed abnormal growth: $20\% \rightarrow 33.7\%$ (peak at Gen 20)
- ALLD first increased then decreased: $20\% \rightarrow 21.3\%$ (Gen 4) $\rightarrow 13.4\%$ (Gen 20)
- ALLC continuously declined: 20% → 7.4%
- TFT remained relatively stable
- PAVLOV grew slowly

2. Strategy Reversal Phase (Generations 20-36):

- GRIM declined sharply: $33.7\% \rightarrow 17.9\%$
- PAVLOV surged rapidly: 22.5% → 35.5%
- TFT grew steadily: $23.2\% \rightarrow 31.2\%$
- ALLC began to rebound: $7.4\% \rightarrow 12.6\%$
- ALLD continued to decline: $13.4\% \rightarrow 2.7\%$

3. New Equilibrium Phase (Generations 36-49):

- TFT leading: 29.3%
- PAVLOV second: 29.5%
- ALLC significantly recovered: 27.6%
- GRIM maintained low position: 12.3%

■ ALLD near extinction: 1.3%

4. Key Differences from Noise-Free Environment:

- GRIM transformed from dominant to marginal strategy (26.5% \rightarrow 12.3%)
- ALLC recovered from marginal to mainstream (20.5% \rightarrow 27.6%)
- PAVLOV maintained competitiveness (26.5% → 29.5%)
- TFT performed robustly (26.5% \rightarrow 29.3%)
- Evolution process was more turbulent, experiencing significant strategy transitions

2.3 Comparative Summary

Final Population Distribution Comparison:

| Strategy | Noise-Free (%) | Noisy (%) | Change |
|----------|----------------|-----------|--------|
| ALLC | 20.5 | 27.6 | +34.6% |
| ALLD | 0.0 | 1.3 | +1.3% |
| TFT | 26.5 | 29.3 | +10.6% |
| GRIM | 26.5 | 12.3 | -53.6% |
| PAVLOV | 26.5 | 29.5 | +11.3% |

The noisy environment significantly altered evolutionary dynamics, giving forgiving strategies (ALLC, PAVLOV) an advantage, while severely weakening the strict retaliatory strategy (GRIM).

3. Result Analysis

3.1 Strategy Dynamics in Noise-Free Environment

Theoretical Basis for TFT/GRIM/PAVLOV Coexistence

The experimental results show that three reciprocal strategies achieved perfect equilibrium (each at 26.5%), reflecting the "reciprocal alliance" phenomenon in evolutionary game theory:

These three strategies maintain perfect cooperation when playing against each other, obtaining the same high payoff, and therefore cannot replace one another, forming a **neutrally stable equilibrium**.

Rapid Elimination Mechanism of ALLD

ALLD became completely extinct within 16 generations for the following reasons:

1. Disadvantage Against Reciprocal Strategies:

- ALLD vs TFT: First round T=5, then forever P=1 \rightarrow average payoff \approx 1.2
- ALLD vs GRIM: First round T=5, then forever P=1 \rightarrow average payoff \approx 1.2
- ALLD vs PAVLOV: Alternating T/P or locked at P \rightarrow average payoff \approx 1.5-3

2. Positive Feedback Loop:

■ ALLD proportion decreases → cooperative environment improves → reciprocal strategies' payoffs increase → ALLD further eliminated

The Mystery of ALLC's Continued Survival

Although ALLC has no defensive capability, it stably maintains at 20.5% because:

- After ALLD is eliminated, ALLC only faces cooperators
- ALLC vs TFT/GRIM/PAVLOV: Always cooperate → payoff = R = 3
- Same payoff as dominant strategies, therefore not eliminated

3.2 Strategy Dynamics in Noisy Environment

A 10% noise rate fundamentally changed strategy performance:

Impact on Strict Strategies (GRIM Collapse):

GRIM plummeted from 26.5% to 12.3% (down 53.6%) due to its "never forgive" characteristic:

TFT's Moderate Resilience

TFT increased from 26.5% to 29.3%, performing excellently:

1. Short-Term Memory Advantage:

- Only remembers the most recent round, limiting the impact of misjudgment
- After a misoperation, only triggers one round of retaliation, then can resume cooperation

PAVLOV's Forgiving Mechanism

PAVLOV maintained 29.5%, becoming one of the optimal strategies in noisy environments:

ALLC Proportion Increase

ALLC surged from 20.5% to 27.6% (increase of 34.6%), becoming the third largest strategy:

1. Value of Unconditional Forgiveness:

- Does not retaliate due to misoperations
- Provides "reset" opportunities for all strategies
- Reduces overall conflict level in the population

2. Ecological Niche Expansion:

- Noise-free: Only safe in ALLD-free environment
- Noisy: Reciprocal strategies hurt each other → ALLC's relative payoff increases

ALLD's Persistent Survival

ALLD was not completely extinct (retained 1.3%) for the following reasons:

1. "Smokescreen" Provided by Noise:

- Reciprocal strategies weakened by internal conflicts
- ALLD can profit short-term in the chaos

2. Exploitation of ALLC:

■ ALLC proportion increased to 27.6% → ALLD's food source increased