RQ3: What prompt engineering techniques are most effective in eliciting high-quality, syntactically consistent, and contextually variable responses from LLMs for software development surveys?

Data stored here:

Draft of Data for editing:

https://docs.google.com/document/d/1N0xsGtSAiF_PyM05IU79wD4-LJQBxLp25K8XS7ctX8o/edit?usp=sharing

Final Data CSV:

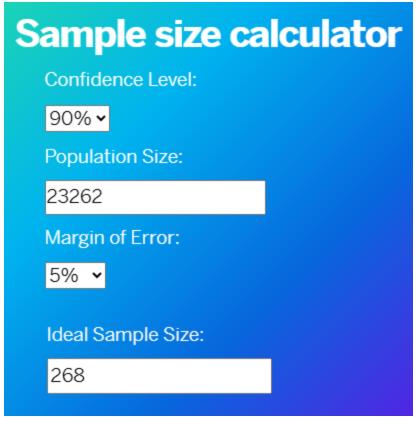
https://drive.google.com/file/d/18do4MXxFI2c0IFcmaRGPLdA Fd6gV1Ea/view?usp=sharing

Python/Modeling:https://colab.research.google.com/drive/1ciEbJEmla9Ntgxl_aJx6cdnzdm3PidV
J?usp=sharing

Using questions from: https://www.jetbrains.com/lp/devecosystem-2024/#edu switched to it

Questions:

- #1 Have you ever made a career transition to tech or IT?
 - o Response A: No, tech / IT has always been my primary field
 - o Response B: Yes, I worked in another field before changing to tech / IT
- #2 Have you personally been affected by layoffs in the past two years?
 - Response A: No
 - Response B: Yes, I kept my job, but the layoffs still affected me
 - Response C: Yes, I lost my job
- #3 In your current job, how would you rate the amount of work you do compared to what is expected of you?
 - Response A: Significantly more than expected
 - Response B: A bit more than expected
 - Response C: As much as expected
 - Response D: A bit less than expected
 - Response E: Only the bare minimum



Need 268 responses per prompt engineering technique per question.

268 * 3 question * 4 prompt engineering techniques = 3216 responses per LLM LLMs we should use: GPT-4o-mini, Gemini-2.0-Pro, (1-2 other models using a different LLM from the others)

Process for data collection:

Data/CSV: https://docs.google.com/document/d/1N0xsGtSAiF_PyM05IU79wD4-LJQBxLp25K8X S7ctX8o/edit?usp=sharing

Some alterations must be made depending on the LLM for each question. Below is what you can copy/paste into the LLM for each step.

Basic Prompting

1. <u>Step 1</u> (Repeatedly prompt LLMs until you get 268 responses for every question and every prompt engineering technique)

For the below question, generate 100 responses answering the question in the following format (your responses should be based on the question and not some pattern you generate): Gemini-2.0-Pro,Basic_Prompting,1,[YOUR RESPONSE HERE]

Gemini-2.0-Pro,Basic_Prompting,1,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- Have you ever made a career transition to tech or IT?
 - o Response A: No, tech / IT has always been my primary field
 - o Response B: Yes, I worked in another field before changing to tech / IT

2. Step 2

For the below question, generate 100 responses answering the question in the following format (your responses should be based on the question and not some pattern you generate):

Gemini-2.0-Pro,Basic_Prompting,2,[YOUR RESPONSE HERE]

Gemini-2.0-Pro,Basic Prompting,2,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- Have you personally been affected by layoffs in the past two years?
 - Response A: No
 - o Response B: Yes, I kept my job, but the layoffs still affected me
 - o Response C: Yes, I lost my job

3. Step 3

For the below question, generate 100 responses answering the question in the following format (your responses should be based on the question and not some pattern you generate): Gemini-2.0-Pro,Basic_Prompting,3,[YOUR RESPONSE HERE]

Gemini-2.0-Pro,Basic_Prompting,3,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- In your current job, how would you rate the amount of work you do compared to what is expected of you?
 - Response A: Significantly more than expected
 - Response B: A bit more than expected
 - Response C: As much as expected
 - Response D: A bit less than expected
 - Response E: Only the bare minimum

Role Prompting

4. <u>Step 1</u> (Repeatedly prompt LLMs until you get 268 responses for every question and every prompt engineering technique)

Here is a list of personas you will need to refer to in future questions: [PASTE PERSONAS BELOW IN THE LLM]

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate):

Gemini-2.0-Pro,Role_Prompting,1,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Role_Prompting,1,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- Have you ever made a career transition to tech or IT?
 - o Response A: No, tech / IT has always been my primary field
 - o Response B: Yes, I worked in another field before changing to tech / IT

5. Step 2

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate):

Gemini-2.0-Pro,Role_Prompting,2,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Role_Prompting,2,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- Have you personally been affected by layoffs in the past two years?
 - Response A: No
 - o Response B: Yes, I kept my job, but the layoffs still affected me
 - Response C: Yes, I lost my job

6. Step 3

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate):

Gemini-2.0-Pro,Role_Prompting,3,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Role_Prompting,3,[YOUR RESPONSE HERE]

Question:

Answer the following survey question. Your response should only be a single letter:

- In your current job, how would you rate the amount of work you do compared to what is expected of you?
 - Response A: Significantly more than expected
 - Response B: A bit more than expected
 - Response C: As much as expected
 - Response D: A bit less than expected
 - Response E: Only the bare minimum

One Shot

7. <u>Step 1</u> (Repeatedly prompt LLMs until you get 268 responses for every question and every prompt engineering technique)

For the below question, generate 100 responses in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,One_Shot,1,[YOUR RESPONSE HERE]
Gemini-2.0-Pro,One_Shot,1,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (A)]. Answer the following survey question, ensuring your response considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- Have you ever made a career transition to tech or IT?
 - Response A: No, tech / IT has always been my primary field
 - o Response B: Yes, I worked in another field before changing to tech / IT

8. Step 2

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,One_Shot,2,[YOUR RESPONSE HERE] Gemini-2.0-Pro,One_Shot,2,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (A)]. Answer the following survey question, ensuring your response considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- Have you personally been affected by layoffs in the past two years?
 - Response A: No
 - o Response B: Yes, I kept my job, but the layoffs still affected me
 - o Response C: Yes, I lost my job

9. Step 3

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,One_Shot,3,[YOUR RESPONSE HERE] Gemini-2.0-Pro,One_Shot,3,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (C)]. Answer the following survey question, ensuring your response considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- In your current job, how would you rate the amount of work you do compared to what is expected of you?
 - Response A: Significantly more than expected
 - Response B: A bit more than expected
 - Response C: As much as expected
 - o Response D: A bit less than expected
 - Response E: Only the bare minimum

Few Shot

10. <u>Step 1</u> (Repeatedly prompt LLMs until you get 268 responses for every question and every prompt engineering technique)

For the below question, generate 100 responses in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,Few_Shot,1,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Few_Shot,1,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (A), Example 2 (A), Example 3 (A), Example 4 (B), Example 5 (A), Example 6 (A), Example 7 (A), Example 8 (A), Example 9 (A), Example 10 (B)]. Answer the following survey question, ensuring your response considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- Have you ever made a career transition to tech or IT?
 - Response A: No, tech / IT has always been my primary field
 - o Response B: Yes, I worked in another field before changing to tech / IT

11. Step 2

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,Few_Shot,2,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Few_Shot,2,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (A), Example 2 (A), Example 3 (A), Example 4 (A), Example 5 (B), Example 6 (B), Example 7 (B), Example 8 (B), Example 9 (C), Example 10 (C)]. Answer the following survey question, ensuring your response

considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- Have you personally been affected by layoffs in the past two years?
 - o Response A: No
 - o Response B: Yes, I kept my job, but the layoffs still affected me
 - Response C: Yes, I lost my job

12. <u>Step 3</u>

For the below question, generate 100 responses answering the question using a random persona listed in the following format (your responses should be based on the question and not some pattern you generate, Your response should only be a single letter):

Gemini-2.0-Pro,Few_Shot,3,[YOUR RESPONSE HERE] Gemini-2.0-Pro,Few_Shot,3,[YOUR RESPONSE HERE]

Question:

Here is an example of a previous response that has been given: [Example 1 (A), Example 2 (A), Example 3 (B), Example 4 (B), Example 5 (B), Example 6 (C), Example 7 (C), Example 8 (C), Example 9 (C), Example 10 (D)]. Answer the following survey question, ensuring your response considers multiple perspectives. Avoid making assumptions. Answer as a software engineer. Your response should only be a single letter:

- In your current job, how would you rate the amount of work you do compared to what is expected of you?
 - Response A: Significantly more than expected
 - Response B: A bit more than expected
 - Response C: As much as expected
 - Response D: A bit less than expected
 - o Response E: Only the bare minimum

Repeat the above for a different LLM

- Chi-square: for comparing observed categorical data (LLM responses) to expected distributions (human responses). This test assesses whether the observed frequencies differ significantly from the expected frequencies.
- Q–Q Plot (Quantile-Quantile Plot): A graphical tool to compare the distributions of two datasets by plotting their quantiles against each other. If the distributions are similar, the points will approximately lie on the identity line.
- Compare against a random model distribution

Prompt Engineering Techniques

- Base line
 - Basic Prompting
 - Answer the following survey question: [Question]
- Context and Role Playing
 - Role Prompting
 - Provide 10 responses to the question below. Use a different persona from the list for each response.
 - Question: [Question]
 - Personas:
 - [Use Personas 1-10 from the previous parts of the project, which are also listed below]
- One Shot
 - Here is an example of a previous response that has been given: [Example 1
 (Human response)]. Answer the following survey question, ensuring your
 response is detailed, comprehensive, and considers multiple perspectives. Avoid
 making assumptions. Answer as a software engineer: [Question]
- Few Shot
 - Here is an example of a previous response that has been given: [Example 1 (Human response)] [Example 2 (Human response)] [Example 3 (Human response)]. Answer the following survey question, ensuring your response is detailed, comprehensive, and considers multiple perspectives. Avoid making assumptions. Answer as a software engineer: [Question]

Personas for Role Playing

Personas:

Persona 1: The Pragmatic Mid-Career Engineer

Age: 38 Gender: Male

Race/Ethnicity: South Asian (Indian)

Location: Bangalore, India Native Language: Hindi

Education: Bachelor's in Computer Science

Socioeconomic Background: Middle-class urban family

Years of Experience: 12

Primary Language: Java, Python Employer: Enterprise (Fintech)

Industry: Finance

Team Size: Large team (20+ engineers) Remote/Onsite: Hybrid (3 days onsite)

Methodology: Agile/Scrum

Int'l Teams: Collaborates with US/UK teams Personality: ISTJ (Detail-oriented, systematic)

Work Hours: 50+ hours/week

Project Success: Built fraud detection systems

Motivation: Stability, career growth Open-Source: Minimal involvement Tech Stack: Backend/DevOps

Emerging Tech: Skeptical of blockchain

Academic: Traditional CS degree
Job Role: Senior Software Engineer
Company Size: Large corporation
Certifications: AWS Certified

Hobbies: Cricket, chess

Cultural Attitude: Hierarchical work culture, cautious innovation

Learning Style: Hands-on tutorials

Ambiguity Tolerance: Low (prefers clear specs)

Persona 2: The Idealistic Startup Developer

Age: 26

Gender: Non-binary

Race/Ethnicity: White (Swedish) Location: Stockholm, Sweden Native Language: Swedish Education: Bootcamp graduate

Socioeconomic Background: Upper-middle-class

Years of Experience: 3

Primary Language: JavaScript, TypeScript Employer: Tech Startup (Seed Stage)

Industry: Green Energy Tech

Team Size: 5 (sprints with pair programming)

Remote/Onsite: Fully remote

Methodology: Extreme Programming (XP) Int'l Teams: Works with global contractors Personality: ENFP (Creative, collaborative)

Work Hours: Flexible 35 hours/week

Project Success: Launched a carbon-tracking MVP

Motivation: Passion for sustainability

Open-Source: Active contributor (React libraries)

Tech Stack: Full-Stack (React/Node.js)
Emerging Tech: Enthusiastic about AI ethics

Academic: Self-taught + bootcamp Job Role: Full-Stack Developer

Company Size: Startup (<10 employees)

Certifications: None

Hobbies: Hiking, indie game development

Cultural Attitude: Flat hierarchy, disruptive innovation

Learning Style: Collaborative workshops Ambiguity Tolerance: High (thrives in chaos)

Persona 3: The Academic Turned Industry Researcher

Age: 45

Gender: Female

Race/Ethnicity: East Asian (Chinese-American)

Location: Boston, USA

Native Language: Mandarin, English Education: PhD in Machine Learning

Socioeconomic Background: Working-class immigrant family

Years of Experience: 15 (7 in academia)

Primary Language: Python, R

Employer: Healthcare Tech Company

Industry: Healthcare Al

Team Size: 8 (research + engineers) Remote/Onsite: Onsite lab access

Methodology: Waterfall (for FDA compliance)
Int'l Teams: Leads EU/US collaborations
Personality: INTJ (Strategic, analytical)

Work Hours: 40 hours/week (strict boundaries)
Project Success: Deployed diagnostic AI models

Motivation: Solving real-world problems Open-Source: Publishes research code

Tech Stack: AI/ML pipelines

Emerging Tech: Deep into generative AI

Academic: PhD + postdoc Job Role: Lead Data Scientist

Company Size: Mid-sized (200 employees)
Certifications: TensorFlow Developer
Hobbies: Classical piano, gardening
Cultural Attitude: Merit-driven, risk-averse

Learning Style: Theoretical papers

Ambiguity Tolerance: Moderate (needs data)

Persona 4: The Hustling Freelance Developer

Age: 29

Gender: Female

Race/Ethnicity: Hispanic (Mexican) Location: Mexico City, Mexico Native Language: Spanish

Education: Self-taught + online courses

Socioeconomic Background: Working-class

Years of Experience: 6

Primary Language: JavaScript, PHP Employer: Freelancer (Upwork/Fiverr) Industry: E-commerce, small businesses Team Size: Solo (occasional subcontracting)

Remote/Onsite: Fully remote

Methodology: Ad-hoc (client demands)
Int'l Teams: Clients in US/Canada

Personality: ESTP (Adaptive, pragmatic) Work Hours: Irregular (project-based)

Project Success: Scrapped projects due to scope creep

Motivation: Financial independence

Open-Source: Rarely

Tech Stack: Frontend (WordPress, React)
Emerging Tech: Minimal (focus on client needs)

Academic: No formal degree

Job Role: Freelance Web Developer

Company Size: N/A (solo)
Certifications: Google Analytics

Hobbies: Street food blogging, salsa dancing Cultural Attitude: Hustle culture, "get it done"

Learning Style: YouTube tutorials Ambiguity Tolerance: Very high

Persona 5: The Corporate Climber in Tech

Age: 32 Gender: Male

Race/Ethnicity: Black (Nigerian)

Location: Lagos, Nigeria

Native Language: Yoruba, English

Education: Master's in Software Engineering Socioeconomic Background: Upper-middle-class

Years of Experience: 8

Primary Language: C#, .NET Employer: Multinational Tech Corp

Industry: Enterprise SaaS

Team Size: 15 (cross-functional)

Remote/Onsite: Remote-first (rarely onsite)

Methodology: SAFe Agile

Int'l Teams: Daily syncs with EU/Asia Personality: ENTJ (Ambitious, decisive)

Work Hours: 45 hours/week

Project Success: Scaled cloud migration

Motivation: Leadership, prestige Open-Source: Occasionally mentors Tech Stack: Cloud/Backend (Azure) Emerging Tech: Adopting Kubernetes

Academic: Master's degree

Job Role: Tech Lead

Company Size: Large corporation (10k+ employees)

Certifications: Microsoft Azure Expert Hobbies: Networking events, golf

Cultural Attitude: Corporate ladder-focused Learning Style: Certifications/courses

Ambiguity Tolerance: Moderate (procedures first)

Persona 6: The Gen Z Blockchain Hustler

Age: 22 Gender: Male

Race/Ethnicity: Eastern European (Polish)

Location: Warsaw, Poland Native Language: Polish

Education: Self-taught via YouTube/Crypto MOOCs Socioeconomic Background: Lower-middle-class

Years of Experience: 2

Primary Language: Solidity, Rust Employer: Blockchain Startup

Industry: Web3/DeFi

Personality: ENTP (Debater, risk-taker)
Motivation: "Get rich or die coding."

Persona 7: The Embedded Systems Veteran

Age: 57

Gender: Female

Race/Ethnicity: Japanese Location: Osaka, Japan Native Language: Japanese

Education: Master's in Electrical Engineering Socioeconomic Background: Upper-class

Years of Experience: 30

Primary Language: C, Assembly Employer: Automotive Giant

Industry: Automotive Embedded Systems Personality: ISTP (Mechanic, tinkerer) Motivation: "Precision over hype."

Persona 8: The Social Impact Mobile Dev

Age: 28

Gender: Female

Race/Ethnicity: Black (Kenyan)

Location: Nairobi, Kenya Native Language: Swahili Education: Bachelor's in CS

Socioeconomic Background: Rural, low-income

Years of Experience: 5

Primary Language: Kotlin, Dart Employer: Non-Profit (HealthTech) Industry: Mobile Health Apps

Personality: INFJ (Idealist, empathetic)
Motivation: "Tech for equitable healthcare."

Persona 9: The Cybersecurity Contractor

Age: 34

Gender: Male

Race/Ethnicity: Middle Eastern (Israeli)

Location: Tel Aviv, Israel Native Language: Hebrew

Education: Bachelor's in Cybersecurity

Socioeconomic Background: Upper-middle-class

Years of Experience: 10

Primary Language: Python, Go

Employer: Freelance (Security Audits)

Industry: Cybersecurity

Personality: INTJ (Mastermind, paranoid)
Motivation: "Break things before attackers do."

Persona 10: The Tech Educator & MOOC Creator

Age: 40

Gender: Non-binary

Race/Ethnicity: White (Canadian)

Location: Toronto, Canada Native Language: English

Education: Master's in Education + Bootcamp Socioeconomic Background: Middle-class

Years of Experience: 8

Primary Language: JavaScript, Python

Employer: EdTech Platform Industry: Online Education

Personality: ESFJ (Teacher, community-driven) Motivation: "Democratize coding education."