

LLMs In the Qt Development Environment

LARGE LANGUAGE MODELS – A PRIMER

- LLMs are trained on a wide dataset, usable models are measured in Billions of parameters (7B, 30B, 100B...)
- Quantizing possible to lower bit precision, but trade off accuracy and reasoning
- Context size matters (and uses a lot of RAM).
 - GPT4 and Llama 3.1 support up to 128k tokens (approx. 96k words, fewer for code)
- Prompting instead of programming
 - Drive the model towards a goal, but don't tell it exactly what it should do, or how to do it.
- Structured responses force better answers (JSON schemas)
- Field rapidly advancing, new models leapfrog old ones

USE CASE 1: API CHANGE IDENTIFICATION

Identify changes which modify public APIs

Provides a first-line alert to catch API issues early

Bot process:

- Monitor changes to .h files (but filter known exclusions)
- Feed the diff into an LLM to generically scan for changes which are “significant to the behavior or usage of the API”
- Summarize changes and post a comment
- Add the “Needs API-Review_[version]” hashtag
 - Also add a “API Change cherry-picked” hashtag when the API changes will be backported.

API REVIEW SAMPLE:

```
14 14 QT_BEGIN_NAMESPACE
15 15
16 16
17 17 #ifndef QT_NO_SSL
18 18
19 19 #ifndef QT_NO_DEBUG_STREAM
20 20 class QDebug;
21 21 #endif
22 22
19 23 class QSslErrorPrivate;
20 24 class Q_NETWORK_EXPORT QSslError
21 25 {
22 26     Q_GADGET
23 27 public:
24 28     enum SslError {
25 29         NoError,
26 30         UnableToGetIssuerCertificate,
27 31         UnableToDecryptCertificateSignature,
28 32         UnableToDecodeIssuerPublicKey,
29 33
30 34     };
31 35
32 36     QSslErrorPrivate *d;
33 37
34 38     QSslErrorPrivate *d_ptr() const;
35 39     QSslErrorPrivate *d_ptr() volatile;
36 40
37 41     QSslErrorPrivate *d_ptr() const volatile;
38 42
39 43     QSslErrorPrivate *d_ptr() volatile;
40 44
41 45     QSslErrorPrivate *d_ptr() const volatile;
42 46
43 47     QSslErrorPrivate *d_ptr() volatile;
44 48
45 49     QSslErrorPrivate *d_ptr() const volatile;
46 50
47 51     QSslErrorPrivate *d_ptr() volatile;
48 52
49 53     QSslErrorPrivate *d_ptr() const volatile;
50 54
51 55     QSslErrorPrivate *d_ptr() volatile;
52 56
53 57     QSslErrorPrivate *d_ptr() const volatile;
54 58
55 59     QSslErrorPrivate *d_ptr() volatile;
56 60
57 61     QSslErrorPrivate *d_ptr() const volatile;
58 62
59 63     QSslErrorPrivate *d_ptr() volatile;
60 64
61 65     QSslErrorPrivate *d_ptr() const volatile;
62 66
63 67     QSslErrorPrivate *d_ptr() volatile;
64 68
65 69     QSslErrorPrivate *d_ptr() const volatile;
66 70
67 71     QSslErrorPrivate *d_ptr() volatile;
68 72
69 73     QSslErrorPrivate *d_ptr() const volatile;
70 74
71 75     QSslErrorPrivate *d_ptr() volatile;
72 76
73 77     QSslErrorPrivate *d_ptr() const volatile;
74 78
75 79     QSslErrorPrivate *d_ptr() volatile;
76 80
77 81     QSslErrorPrivate *d_ptr() const volatile;
78 82
79 83     QSslErrorPrivate *d_ptr() volatile;
80 84
81 85     inline bool operator!=(const QSslError &other) const
82 86     { return !(*this == other); }
83 87
84 88     SslError error() const;
85 89     QString errorString() const;
86 90     QSslCertificate certificate() const;
87 91
88 92 private:
89 93     // ### Qt 7: make QSslError implicitly shared
90 94     std::unique_ptr<QSslErrorPrivate> d;
91 95
92 96 #ifndef QT_NO_DEBUG_STREAM
93 97     Q_NETWORK_EXPORT friend QDebug operator<<(QDebug debug, QSslError::SslError error)
94 98     #endif
95 99 };
96 100
97 101 Q_DECLARE_SHARED(QSslError)
98 102
99 103 Q_NETWORK_EXPORT size_t qHash(const QSslError &key, size_t seed = 0) noexcept;
100 104
101 105 #ifndef QT_NO_DEBUG_STREAM
102 106 class QDebug;
103 107
104 108 Q_NETWORK_EXPORT QDebug operator<<(QDebug debug, const QSslError &error);
105 109 #if QT_NETWORK_REMOVED_SINCE(6, 8)
106 110 Q_NETWORK_EXPORT QDebug operator<<(QDebug debug, const QSslError::SslError &error);
107 111 #endif
108 112 #endif
109 113 #else
110 114 class Q_NETWORK_EXPORT QSslError {}; // dummy class so that moc has a complete type
111 115 #endif // QT_NO_SSL
112 116
113 117 QT_END_NAMESPACE
```

Summary:

This change has been identified as having significant changes to the public API:

- The QDebug operator<< is now a hidden friend of QSslError.
- Changes were made to how the QDebug operator<< matches arguments, affecting its usage in debugging contexts.
- Users are now required to make explicit conversions that were previously implicit, resulting in a source-incompatible change.

USE CASE 2: CI FAILURE ANALYSIS

Identify when a change is responsible for the failure to integrate in CI

Bot process:

- Feed the last 1200 lines of the failure log into an LLM (Llama 3.1 8B)
 - 2 chunks of 600 lines due to local LLM 32k context limit
 - Extract errors with instruction about issues which are not critical errors
 - Extract filenames for failed sources or tests
- Retrieve relevant file sources from branch if not modified
- Retrieve change diff
- Run the error, sources, and diff through an LLM with large context (GPT 4o-mini)
 - Identify if the change is the likely cause of the failure, or not.

PATCHSET 1: Remove noexcept from copy member functions

```
22 22 class Q_GUI_EXPORT QPdfOutputIntent
23 23 {
24 24 public:
25 25     QPdfOutputIntent();
26     QPdfOutputIntent(const QPdfOutputIntent &other) noexcept;
26     QPdfOutputIntent(const QPdfOutputIntent &other);
27 27     QPdfOutputIntent(QPdfOutputIntent &&other) noexcept = default;
28     QPdfOutputIntent &operator=(const QPdfOutputIntent &other) noexcept;
28     QPdfOutputIntent &operator=(const QPdfOutputIntent &other);
29 29     QT_MOVE_ASSIGNMENT_OPERATOR_IMPL_VIA_PURE_SWAP(QPdfOutputIntent)
30 30     ~QPdfOutputIntent();
31 31
32 32     void swap(QPdfOutputIntent &other) noexcept { d.swap(other.d); }
```

Build error:

```
/Users/qt/work/qt/qtbase/src/gui/painting/qpdfoutputintent.cpp:57:19: error: exception specification in declaration does not match previous declaration
QPdfOutputIntent::QPdfOutputIntent(const QPdfOutputIntent &other) noexcept = default;
      ^
/Users/qt/work/qt/qtbase/src/gui/painting/qpdfoutputintent.h:26:5: note: previous declaration is here
    QPdfOutputIntent(const QPdfOutputIntent &other);
    ^
/Users/qt/work/qt/qtbase/src/gui/painting/qpdfoutputintent.cpp:68:37: error: exception specification in declaration does not match previous declaration
QPdfOutputIntent &QPdfOutputIntent::operator=(const QPdfOutputIntent &other) noexcept = default;
      ^
/Users/qt/work/qt/qtbase/src/gui/painting/qpdfoutputintent.h:28:23: note: previous declaration is here
    QPdfOutputIntent &operator=(const QPdfOutputIntent &other);
    ^
2 errors generated.
```

LLM ERROR ANALYSIS

Failure Summary:

High confidence that the change is related to the failure due to the removal of `noexcept` from the copy constructor and assignment operator, which caused inconsistency in exception specifications.

The error summary indicates that the `QPdfOutputIntent` class has inconsistent exception specifications in its copy constructor and assignment operator. The change removed `noexcept` from these functions, leading to a mismatch with their previous declarations.

Relevant files:

Filename: `/Users/qt/work/qt/qtbase/src/gui/painting/qpdfoutputintent.h`

```
class Q_GUI_EXPORT QPdfOutputIntent
{
public:
    QPdfOutputIntent();
    QPdfOutputIntent(const QPdfOutputIntent &other);
    QPdfOutputIntent(QPdfOutputIntent &&other) noexcept = default;
    QPdfOutputIntent &operator=(const QPdfOutputIntent &other);
    QT_MOVE_ASSIGNMENT_OPERATOR_IMPL_VIA_PURE_SWAP(QPdfOutputIntent)
    ~QPdfOutputIntent();
```

Suggested Action:

The change caused the failure. The `noexcept` specifier should be consistently applied or removed from both the declaration and definition of the copy constructor and assignment operator to resolve the inconsistency.

PATCHSET 2

```
M src/gui/painting/qpdfoutputintent.cpp
File File
+46 common lines +10
47 47 /*!
48 48     Constructs a new PDF output intent.
49 49 */
50 50 QPdfOutputIntent::QPdfOutputIntent()
51 51     : d(new QPdfOutputIntentPrivate)
52 52 {}
53 53
54 54 /*!
55 55     Constructs a copy of the output intent \a other.
56 56 */
57 57 QPdfOutputIntent::QPdfOutputIntent(const QPdfOutputIntent &other) noexcept = default;
58 58 QPdfOutputIntent::QPdfOutputIntent(const QPdfOutputIntent &other) = default;
59 59
60 60     \fn QPdfOutputIntent::QPdfOutputIntent(QPdfOutputIntent &&other) noexcept
61 61
62 62     Constructs a QPdfOutputIntent object by moving from \a other.
63 63 */
64 64
65 65 /*!
66 66     Assigns the output intent \a other over this intent.
67 67 */
68 68 QPdfOutputIntent &QPdfOutputIntent::operator=(const QPdfOutputIntent &other) noexcept = default;
69 69 QPdfOutputIntent &QPdfOutputIntent::operator=(const QPdfOutputIntent &other) = default;
70 70 /*!
```


LLM ERROR ANALYSIS – CHANGE NOT THE CAUSE

Failure Summary:

The failure is due to a known flaky test, `tst_QAudioSink::pullResumeFromUnderrun`.

Suggested Action:

The change is likely not the cause of the failure. Restaging the change may resolve the issue.

Failure Summary:

The change is not related to the failure. The test `tst_qstringapisymmetry` failed, but the change modifies `qplaintextedit.cpp`, which is unrelated to the `tst_qstringapisymmetry` test.

Suggested Action:

The change likely did not cause the failure. Restaging the change may resolve the issue.

Failure Summary:

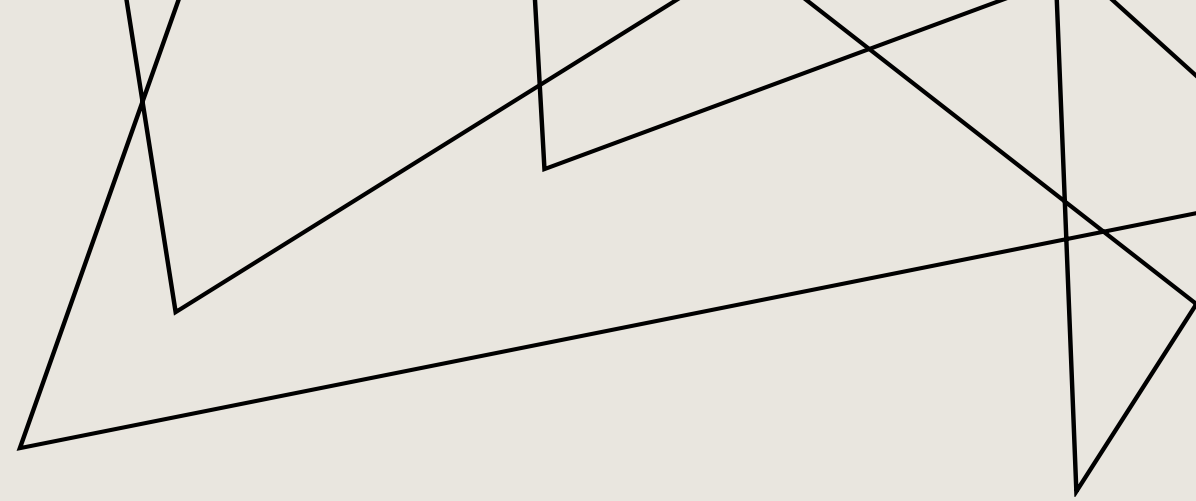
The failure appears to be infrastructure-related, specifically due to a timeout and an issue with downloading a binary archive.

Suggested Action:

The change is unrelated to the failure. Restage the change to resolve the issue.

WHAT NEXT?

- Investigate Retrieval Augmented Generation
 - May be possible to have a database of up-to-date Qt Documentation for each branch.
 - RAG allows the LLM to retrieve authoritative source info on-demand, and automatically.
- Larger context is better
 - Avoiding chunking means better zero-shot analysis, fewer false positives.
- Find ways to give feedback via 👍 and 👎 buttons on bot comments.



NEW IDEAS?

- Must be non-intrusive
- Probably should not suggest specific changes
- Must be unlikely to have a high false-positive rate



THANK YOU

Daniel Smith

daniel.smith@qt.io