ALMA MATER STUDIORUM – UNIVERSITÀ DI BOLOGNA

Corso di Laurea in Ingegneria e Scienze Informatiche

Sviluppo di un'Interfaccia Grafica per Software Simulativi Complessi mediante GraphQL e KotlinJS

Tesi di laurea in:
Programmazione ad Oggetti

Relatore

Candidato
Tiziano Vuksan

Dott. Danilo Pianini

Correlatore

Dott. Angelo Filaseta

Sommario

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- 1.1.2 Alchemist
- 1.2 Motivazione
- 1.3 Obiettivi

Analisi

2.1 Analisi dei requisiti

Lo scopo principale del progetto è la realizzazione di una interfaccia web (quindi interpretabile da un qualsiasi browser moderno) che permetta l'interazione con il sistema software di simulazione *Alchemist* in modo intuitivo e *user-friendly*. Il compito dell'applicativo sarà quindi quello di comunicare, attraverso apposite Application Program Interface (API), con l'infrastruttura server preesistente e presentare in seguito a cambiamenti della simulazione in corso o a richieste da parte dell'utente, un'interfaccia grafica che ne rappresenti i risultati.

2.1.1 Requisiti funzionali

- L'applicativo dovrà presentare un interfaccia grafica all'interno di un web browser.
- L'applicativo dovrà interfacciarsi con l'infrastruttura GraphQL già presente all'interno del progetto.
- In una tipica simulazione di *Alchemist* (come discusso nel paragrafo) sono presenti dei nodi. L'applicativo quindi dovrà essere in grado di rappresentare in un piano bidimensionale la posizione di tali nodi all'interno di un conte-

sto grafico. Ciò implica ovviamente che con l'evolversi della simulazione il contesto grafico debba essere aggiornato. ¹

- Ogni nodo contiene diverse proprietà, reazioni, concentrazioni etc. L'interfaccia dovrà permettere di ispezionare il contenuto di ciascun nodo.
- L'interfaccia dovrà controllare lo stato attuale della simulazione. Ciò vuol dire poterla eseguire o mettere in pausa.

2.1.2 Requisiti non funzionali

- Interagendo con l'interfaccia, non si devono verificare tempi di risposta eccessivi. Per esempio se l'utente decide di ispezionare un nodo, il recupero di tali informazioni deve essere presentato in tempi ragionevoli.
- L'applicativo deve essere compatibile con un ambiente multipiattaforma.
- L'architettura delle componenti grafiche deve essere estendibile e facilmente modificabile.

Questo progetto verte sul bisogno di creare una piattaforma Client tale da impiegare le API esposte dall'infrastruttura GraphQL fornita. Pertanto non esisterà una comunicazione diretta tra il Client e la simulazione di Alchemist. Tutte le informazioni necessarie a rappresentare l'*Environment* della simulazione saranno ottenibili da tale modulo.

2.1.3 Architettura API GraphQL

Prima di analizzare il funzionamento principale dell'architettura fornita è utile capire brevemente le motivazioni dietro l'utilizzo di GraphQL e il contesto per il quale nasce. GraphQL² è un linguaggio di interrogazione per le API che offre una sintassi flessibile e potente per recuperare dati da un server, creato da Facebook nel 2012 come alternativa all'esistente architettura Representational State Transfer (REST). Evidenziamo quindi i punti di forza più pertinenti:

 $^{^{1}}$ Date le diverse *incarnation* e i diversi possibili scenari che *Alchemist* può modellare non è detto che i nodi cambino di posizione.

²https://graphql.org/foundation/

- Flessibilità nelle query: i client possono richiedere esattamente i dati di cui hanno bisogno, evitando di occupare, nelle richieste di dati, più banda di rete del necessario. Con questo linguaggio vengono risolti quindi i problemi di over-fetching e under-fetching.
- Unica endpoint: mentre nelle architetture di tipo REST i dati sono esposti tramite endpoint dedicati che corrispondono ciascuno a una risorsa specifica (identificati tramite un Uniform Resource Identifier (URL) univoco), in GraphQL l'interrogazione dei dati avviene tramite un unico endpoint.
- **Tipizzazione forte**: GraphQL offre una tipizzazione forte dei dati, consentendo ai client di conoscere in anticipo i tipi di dati che riceveranno in risposta alle loro query. Questo porta a un maggiore controllo e previsione durante lo sviluppo delle applicazioni.

È facile quindi notare come questo linguaggio semplifichi lo sviluppo di applicazioni frontend.

L'interazione con i dati avviene attraverso tre operazioni:

- Query: operazione di lettura per ottenere un tipo determinato di dato dal server.
- Mutation: operazione di scrittura per modificare uno o più dati sul server.
- Subscription: operazione per ricevere i cambiamenti di uno o più tipi di dati in tempo reale.

2.1.4 Web Server GraphQL

Al centro delle operazioni GraphQL c'è uno schema che definisce tutti i tipi di dati disponibili e le relazioni che ci sono tra di essi, oltre che alle operazioni che possono essere eseguite. La natura intrinseca dello schema garantisce che fra client e server ci sia un meccanismo di type safety che previene errori legati a richieste che non sono compatibili. Per questo, uno strumento molto utile messo a disposizione dal web server, accessibile tramite l'endpoint /graphiql, è il playground GraphiQL. Qui è possibile effettuare e verificare ex-ante il risultato delle operazioni che si

intendono fare prima che queste vengano usate per generare le classi associate durante la fase di compilazione del progetto. Questo processo, per lo sviluppo di un qualsiasi applicativo client che si appoggia su queste API, permette allo sviluppatore di validare ogni singola operazione che verrà utilizzata all'interno dell'applicativo che si intende sviluppare.

2.1.5 Rendering del contesto grafico

È importante sottolineare come le prestazioni siano un fattore decisivo nella scelta delle tecniche per rappresentare l'ambiente della simulazione. In questo contesto, prestazioni ottimali assicurano un'esperienza utente fluida e soddisfacente. È per questo motivo che la scelta di disegnare i nodi della simulazione di Alchemist direttamente all'interno di un elemento di tipo canvas HTML prevale rispetto alla rappresentazione tramite elementi Document Object Model (DOM). Nell'ipotesi in cui si decidesse di rappresentare ciascun nodo con un elemento del DOM (e.g. div), il renderina risulterebbe oneroso, perché ogni elemento DOM aggiunto alla pagina web richiederebbe risorse di sistema per essere gestito e disegnato dal browser. Con un considerevole numero di nodi, oltretutto aggiornati frequentemente, questo metodo causerebbe solo un deterioramento delle prestazioni. Inoltre, utilizzando un canvas, si ha maggiore flessibilità nel disegno dei nodi e nel loro comportamento. Si può disegnare senza nessun vincolo una qualsiasi forma o figura, applicare trasformazioni ed effetti visivi senza doversi occupare delle restrizioni del DOM. D'altro canto, agli elementi del DOM possono essere collegati dei listener, funzioni associate a un determinato tipo di evento, come un click o il movimento del mouse. Sebbene questo vantaggio, il canvas torna più utile in questa situazione perché offre la possibilità di implementare interazioni più complesse, come per esempio lo zoom del contesto (modifica della scala) o la traslazione dell'intera area di disegno.

Il processo di rendering dei nodi sul *canvas* è illustrato in figura fig. 2.1. Inizialmente, il sistema apre una connessione con il Client GraphQL e si iscrive alla richiesta di invio dei nodi. Il server accetta la richiesta d'iscrizione e invia dati fino a quando la *subscription* non viene cancellata o completamente consumata. A ogni iterazione il Web Client ridisegna i nodi nel *canvas*.

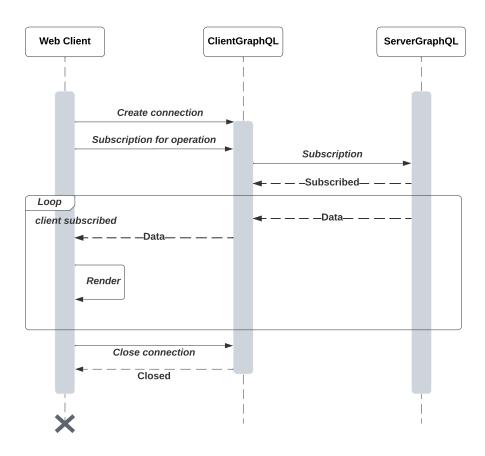


Figura 2.1: Diagramma di sequenza del rendering dei nodi a seguito di una sub-scription

A ogni fase della simulazione i nodi possono cambiare di posizione o meno, in base al tipo di simulazione che è in esecuzione.

2.1.6 Progetto multiplatform

Kotlin Multipltaform è una tecnologia che permette lo sviluppo di codice Kotlin condivisibile tra diverse piattaforme, come per esempio Android, iOS, web e desktop. Questo significa che è possibile utilizzare lo stesso codice Kotlin per creare applicazioni native per diverse piattaforme, riducendo la necessità di scrivere e mantenere codice separato per ciascuna piattaforma. Caratteristica dei progetti

multipiattaforma è che sono composti dai cosiddetti source sets: insiemi di codice sorgente specifico della piattaforma a cui si riferiscono. Generalmente è sempre presente il modulo comune, detto "common code". Questo modulo contiene il codice condiviso che può essere utilizzato su tutte le piattaforme. Ad accompagnarlo quindi sono altri source sets aggiuntivi, compilati per target diversi come JVM, JavaScript o nativo. In questo caso il progetto potrebbe includere i seguenti source set:

- Common Source Set: Codice condiviso che può essere utilizzato su tutte le piattaforme target.
- JVM Source Set: Codice destinate al target JVM.
- JavaScript Source Set: Codice destinato al target JavaScript.

2.2 Analisi e Modello del Dominio

Design

- 3.1 Layout dell'interfaccia
- 3.1.1 I componenti grafici dell'interfaccia
- 3.2 Architettura interfaccia web

Implementazione e Verifica

- 4.1 Componenti grafici
- 4.2 Uso di Redux
- 4.3 State binding
- 4.4 Integrazioni di operazioni GraphQL
- 4.5 Verifica

Conclusione

5.1 Lavori futuri

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