**Cloud Computing (INGI2145) - Lab Session 4**

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# **Background:**

In this lab tutorial, you’ll be introduced to Spark - an open-source data analytics cluster computing framework which builds on-top of the Hadoop Distributed File System (HDFS). During the lectures, you’ve received an introduction on the advantages of using Spark and what it has to offer. Now, we’re going to go through practical examples on some of the features offered by this framework.

Our exercises are based on the UC Berkeley AMP Camp tutorials. You can find more exercises at <http://ampcamp.berkeley.edu/>.

# **Tutorial:**

General instructions:

* **To setup the VM for these exercises**, you need to re-provision the system in order to install Spark. To do this, open your terminal and cd to your INGI2145-vm directory and input vagrant up --provision.
  + If you’re unable to provision your VM, you can follow the following steps:

1. Download the Spark binary directly from: <http://goo.gl/w1vDHv> and extract the tar ball
2. You’ll then need to modify a variable named “sparkHome” in the main classes for both exercises to reflect the extracted binary folder path
3. Next, download and install maven by running sudo apt-get install maven2

* To download the exercise, first git pull (or git clone if you don’t have a pre-existing local repository) from the course’s public repository on github (located here: <https://github.com/mcanini/INGI2145-2014>). The exercises are located in the INGI2145-vm/lab4 folder.
* **To run Spark applications**, you’ll need to perform the following steps:
  1. First, you’ll need to package it into a .jar file using a tool called Maven. To do this, just cd to your project directory and type “mvn package” into your console
  2. After bundling your application, you can launch it by running: /usr/local/spark/bin/spark-submit --class <classname> --master local[4] target/<package>.jar
     + If you’re running mvn using the default configuration, the <package>.jar file will be located in the target folder

### **Machine Learning (K-Means Clustering)**

In this exercise, we’ll learn how to apply machine-learning algorithms on data using the Spark framework. To apply most machine learning algorithms, we must first preprocess and featurize the data. That is, for each data point, we must generate a vector of numbers describing the salient properties of that data point.

We’ve already done this step for you. In our case, each data point will consist of a unique Wikipedia article identifier (i.e., a unique combination of Wikipedia project code and page title) and associated traffic statistics. We generated 24-dimensional feature vectors; with each feature vector entry summarizing the page view counts for the corresponding hour of the day.

The K-Means clustering algorithm’s objective is to partition your data into *K* clusters. In a nutshell, it operates according to the following algorithm:

1. Initialize centroids (central points for each cluster) by randomly picking *K* points from the input dataset
2. Discern the closest point to each centroid
3. Assign points sharing the same centroid to a cluster
4. Re-calculate the centroids by averaging the values of points for every cluster
5. Repeat the process until the margin of error between centroids is less than a predefined threshold

In this exercise, we’ve created a standalone Spark application that takes in the aforementioned featurized file as an input and returns the resulting clusters.

**Task:**

Before starting, first familiarize yourself with the code, and how our function operates. This shouldn’t require any prior machine-learning background (an explanation of K-Means was given in a previous lecture). Your task is to implement the “ClosestPoint” function in order to **calculate the closest points to a centroid**. You’ll also need to **calculate the error between the older and newer centroids** (this is the aggregated squared distances between the centroid vectors).

Before starting to work on these tasks, please refer to the following files:

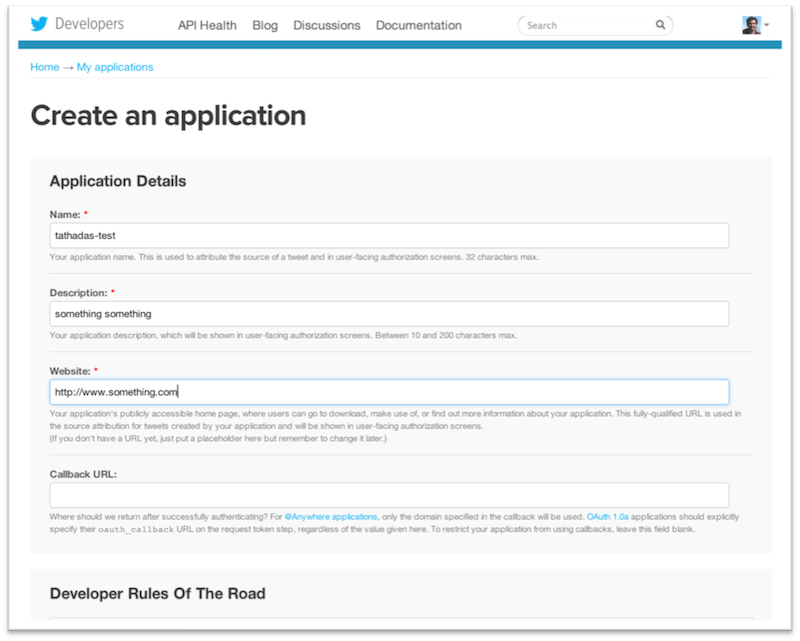
* “KMeans/src/main/java/WikipediaKMeans.java”: This is your main class, which should comprise all the clustering functionality.
* “KMeans/src/main/resources/wiki-stats”: This is the featurized input file that you’ll be using as an input to your K-Means clustering algorithm.

### **Stream Processing:**

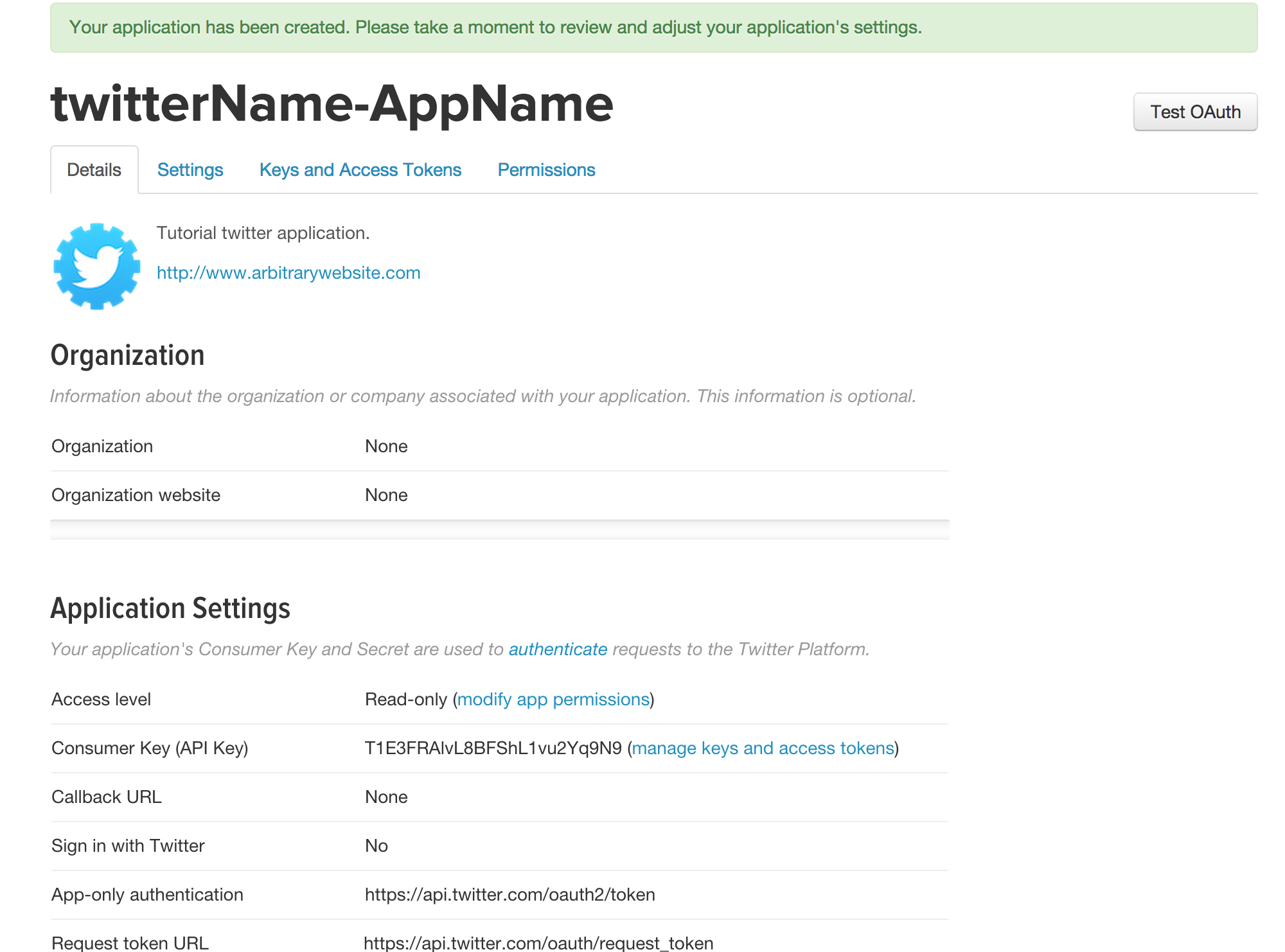
In this exercise, we will walk you through using Spark Streaming to process live data streams. Remember, Spark Streaming is a component of Spark that provides highly scalable, fault-tolerant streaming processing. This exercise is designed as a standalone Java program that will receive and process Twitter’s real sample tweet streams.

## A – Setup:

1. Before starting, you’ll need to setup your twitter tokens. First, open this link: dev.twitter.com/apps. This page lists the set of Twitter-based applications that you own and have already created consumer keys and access tokens for. This list will be empty if you have never created any applications. For this tutorial, create a new temporary application. To do this, click on the blue “Create a new application” button. You should see a page similar to the one below:



1. Provide the required fields. The **Name** of the application must be globally unique, so using your Twitter username as a prefix to the name should ensure that. For example, set it as [your-twitter-handle]-test. For the **Description**, anything is fine. For the **Website**, similarly, any website is fine, but ensure that it is a fully-formed URL with the prefix http://. Then, click on the “Yes, I agree” checkbox below the **Developer Rules of the Road**. Finally, click on the blue “Create your Twitter application” button.
2. Once you have created the application, you will be presented with a confirmation page (as shown below). You should be able to see the consumer key and the consumer secret that have been generated. To generate the access token and the access token secret, click on the “Keys and Access Tokens” tab. Then click on “Generate my access token” on the bottom of the page.



1. To get all of the keys and secrets required for authentication, click on the *“Test OAuth” button* in the top right of the page.
2. Finally, update your twitter configuration file (located at “src/main/resources/twitter.txt”) using your favorite text editor. You should see a template of = separated key-value pairs already setup (like the one shown below)

consumerKey =

consumerSecret =

accessToken =

accessTokenSecret =

Copy the values of your keys into this file and save it.

## B- Exercise:

In this exercise, we’ll work on processing a stream of tweets and then output the top 10 most frequently found hashtags in a 5-minute window that shifts in 1-second increments.

**Task:**

Before starting to work on these tasks, please refer to the following files:

* “Twitter/src/main/java/TwitterStreaming.java”: This is your main class, which should comprise the entire stream processing functionality.
* “Twitter/src/main/resources/twitter.txt”: This is the twitter oauth configuration file which should be filled with your access keys

After setting up your keys, refer to the “TwitterStreaming.java” file in your “lab4” directory. Walkthrough the code, and make sure you read the comments and can understand the general structure of the application. You’ll be required to implement the following tasks to make the application work:

1. Split the retrieved tweets into words
2. Fetch the hashtags from these words
3. Map hashtags to integer values of 1

**Notes:**

* You’ll find the following functions useful for running transform operations on the JavaPairDStream object:
  + **map**(*func*): Return a new DStream by passing each element of the source DStream through a function *func*.
  + **flatMap**(*func*): Similar to map, but each input item can be mapped to 0 or more output items.
  + **mapToPair**(*func*): Return a new JavaPairDStream by passing each element of the source JavaPairDStream through a function *func*.
  + **filter**(*func*): Return a new DStream by selecting only the records of the source DStream on which *func* returns true
* You can consult Apache’s spark programming guides <https://spark.apache.org/docs/1.1.0/programming-guide.html> and/or API <https://spark.apache.org/docs/1.1.0/api/java/index.html> for more details
* If twitter refuses to authenticate and returns a 401 error, this could possibly mean:
  + Your keys are incorrect. In which case, you need to verify the correctness of the keys entered in your twitter.txt configuration file
  + The timestamps for your requests are behind. Verify that your VM’s clock isn’t lagging behind.
  + For more information on what the different response codes entail, visit: <https://dev.twitter.com/overview/api/response-codes>
* You might receive a **warning** similar to: “Block input-x-xxxx already exists on this machine; not re-adding it” while running the streaming application. This is quite normal; it occurs because Spark attempts to replicate streaming data without having any actual nodes (because we’re running locally).