

EEG CLOUD

Capstone Project

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3. Applications for EEG Headsets
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Abstraction

- Exploring the feasibility of using a cloud-based approach to analyzing EEG signals
- Cloud-based benefits:
 - Allows us to leverage demanding analysis algorithms from mobile devices such as smart phones/tablets with limited resources and using these devices to stream data to cloud.
 - Have a much larger database to train the neural networks.
 - Opens up possibilities for statistical and analysis with big data.

Introduction

EEG collection devices become smaller and more mobile, so we need to perform EEG analysis on small-factor devices such as mobile phones or tablets

Android smart phones/tablets and Microsoft Azure cloud to transmit data, analysis and classifying brain's state intention and non-intention.

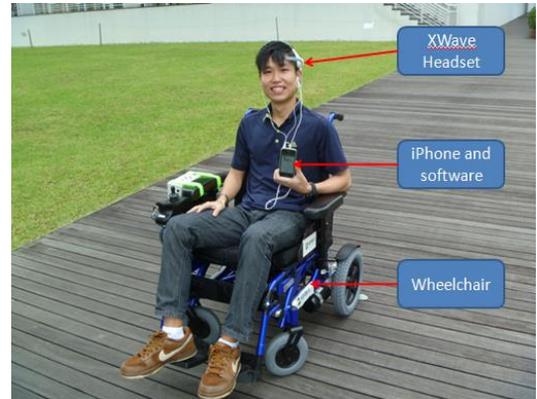


Introduction

Brain Computer Interfaces (BCI)

A brain–computer interface (BCI) is a direct communication pathway between the brain and an external device.

Brain Computer Interfaces (BCIs) had some achievements in recent years.



Introduction

Brain Computer Interfaces (BCI)

Application Areas of BCI



Introduction

Microsoft Azure Cloud

Microsoft Azure is a cloud computing platform and infrastructure, created by Microsoft, for building, deploying and managing applications and services through a global network of Microsoft managed and Microsoft partner hosted datacenters.

Microsoft Azure is Microsoft's application platform for the public cloud.



Introduction

Microsoft Azure Cloud

Catalog of Services

COMPUTE



WEB & MOBILE



DATA



STORAGE & BACKUP



ANALYTICS



MANAGEMENT



IDENTITY & ACCESS

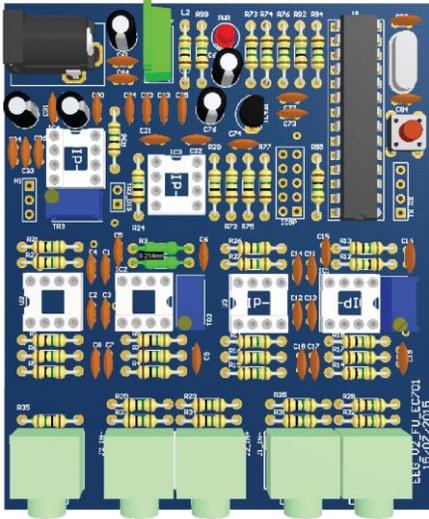


COMMERCE



Introduction

EEG Device



Power: 9V (5V - USB connect)

Input: 1 DRL + 4 Electrode connectors

Output: via Bluetooth 2.0, 1 start bit, 8 data bits, 1 stop bit, no parity, 57600 bits per second.

Data package structure: 17 byte

```
uint8_t    sync0;    // = 0xA5 (decimal 165)
uint8_t    sync1;    // = 0x5A (decimal 90)
uint8_t    version;  // = 2
uint8_t    count;    // packet counter. Increases
                    // by 1 each packet
uint16_t   data[6];  // 10-bit sample (= 0 - 1023)
                    // in big endian (Motorola) format
uint8_t    switches; // = 0
Sampling frequency: 256 Hz
```

CloudThink

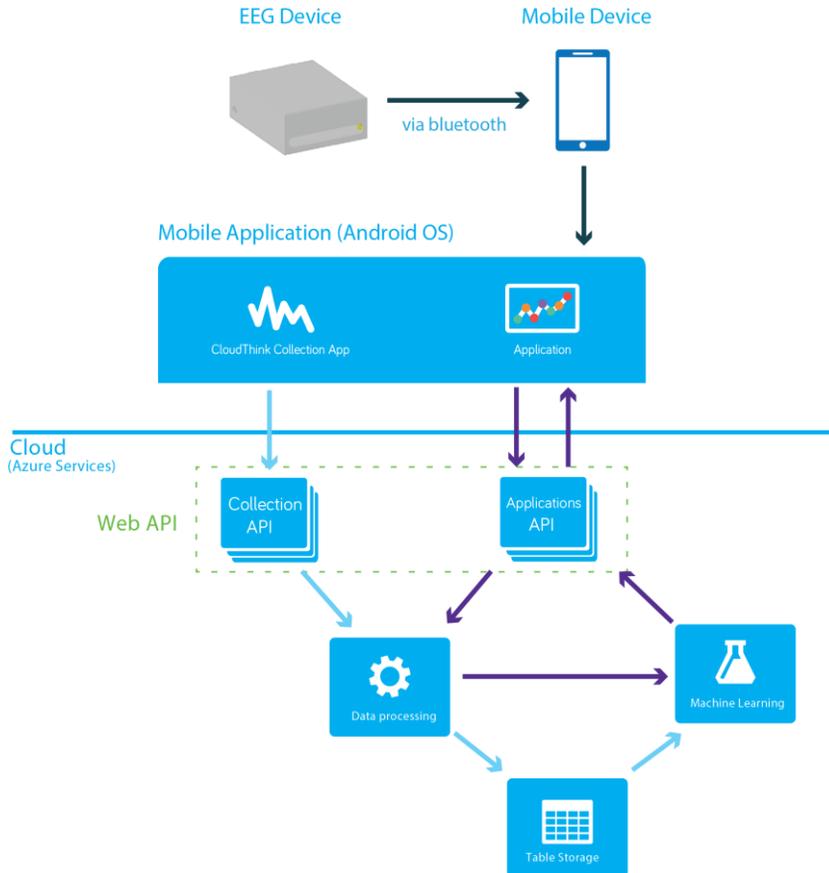
CloudThink is the product of this research topic. It is an integrated system including hardware and software.

CloudThink mix compute clouds and electroencephalograms (EEG) together. Using Cloud-Based Analysis of EEG Signals for BCI Applications.

We implemented the project in two phases:

1. Move the results of the “Electroencephalography Processing” project to Azure cloud.
2. Explore the Azure cloud capabilities to achieve desired results.

Overview



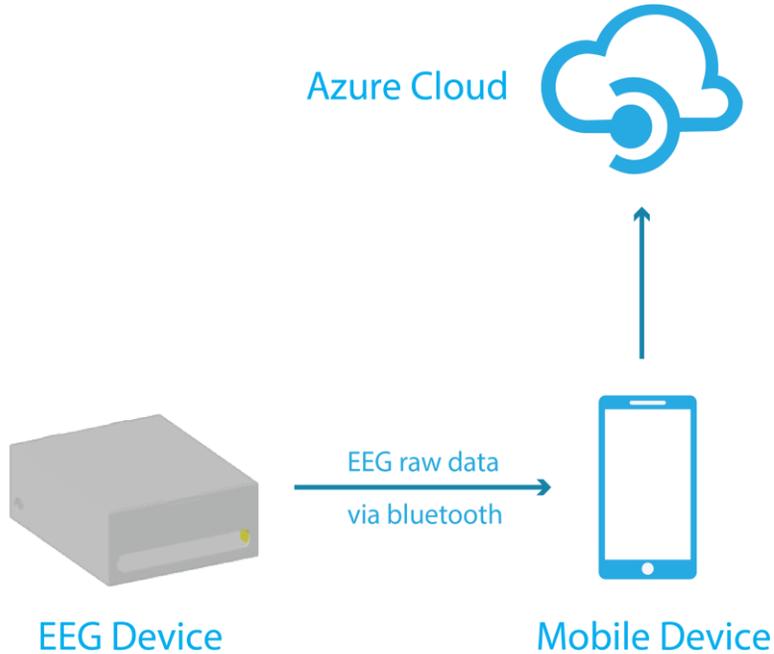
Overview

Main functions:

1. **Classification EEG data:** Gathering user's EEG data and create machine learning web service that allows classification EEG data to intention and non-intention.
2. **Applications using classification result:** Providing a platform for developers create applications using EEG data. Such as monitoring the brain health of an individual, playing game, ...

CloudThink App

Overview

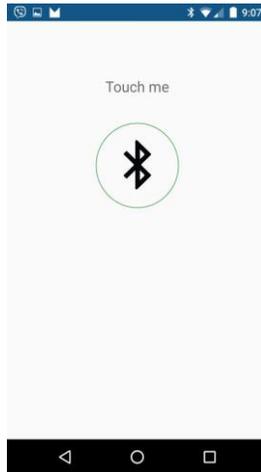


CloudThink App

Connect Bluetooth



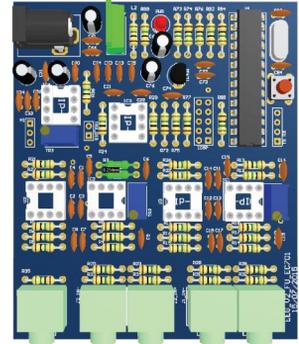
User information screen



Connect bluetooth

← response

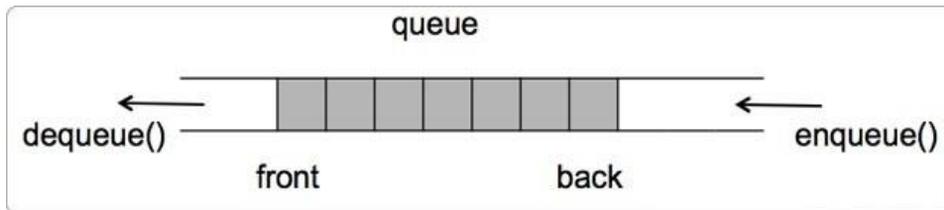
→ connect



CloudThink App

Receive Data App

Data Package

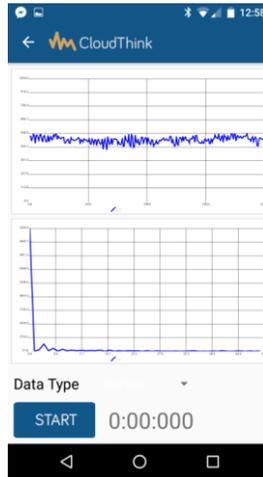


CloudThink App

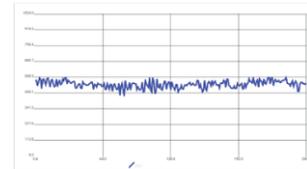
EEG Chart



Pre-EEG Chart Screen



EEG chart screen



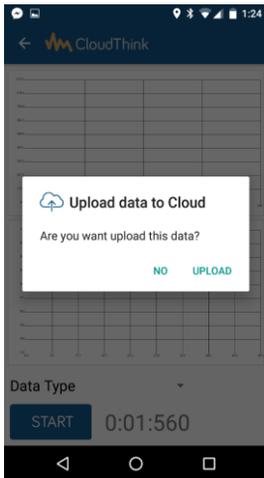
EEG raw chart



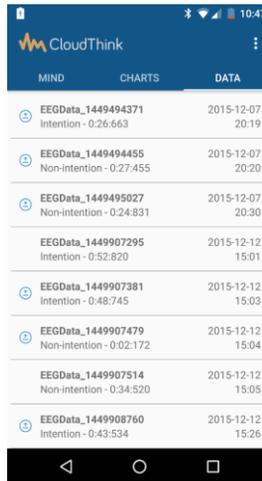
FFT chart

CloudThink App

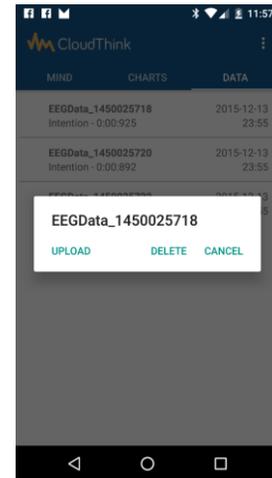
Upload data to cloud



Confirm Upload dialog



List saved data

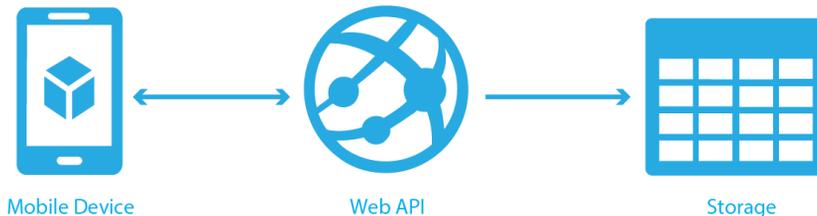


Action dialog

Web API

Web App

We use Web App in Azure to create Web API to connect Mobile app to Storage in Microsoft Azure.
Then we use machine learning in Azure to learn data in Storage



Web API

API Apps

API Apps is one of four app types offered by Azure App Service.



WEB APPS

Web apps that scale with business



Mobile Device

Build mobile apps for any device



LOGIC APPS

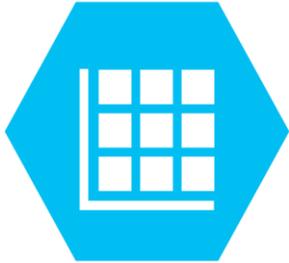
Automate business process across SaaS and on-premises



API APPS

Build and consume APIs in the cloud

CloudThink API



- Table storage easy to adapt your data as the needs of your application evolve
- Table storage is easy to use, so developers can create applications quickly
- Data queries faster and easier.
- It is non-SQL and suitable to store big data.

CloudThink API

Overview API App



Collect Data API



Application API



Analysis EEG Data

Analysis EEG data

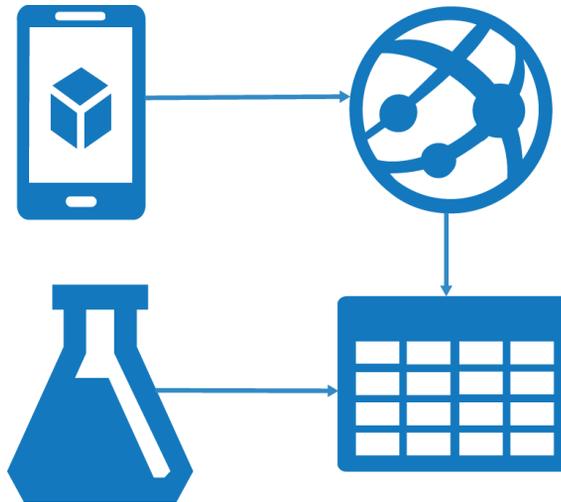
Analysis Data

Using characteristics inherit from previous projects group
Analyze EEG data to 9 characteristics

Features	Type
Percent Alpha	1x4 vector
Percent Beta	1x4 vector
Power Spectral Density Alpha	1x4 vector
Power Spectral Density Beta	1x4 vector
Mean of abs values of first different of normalized signals	a scalar
Mean of abs values of second different of normalized signals	a scalar
Skewness	a scalar
Kurtosis	a scalar
AR Burg	1x6 vector

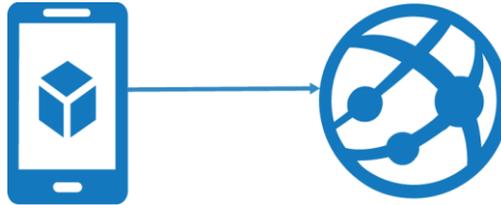
Collection Data API

Receive raw data, split EEG data to segments in 2 seconds sample (512 samples) and overlap 16 samples. Extract features and storage in CloudThink table.



Collection Data API

Step 1: Push data on to Azure



- Mobile App use web API to push data onto the Azure
- Data is pushed up in the form Json
- data include name, age, gender and EEG data

Collection Data API

Step 2: Analyze EEG Data

Using Analysis EEG data to Analysis data is push up. Result is 9 characteristics



Collect Data API

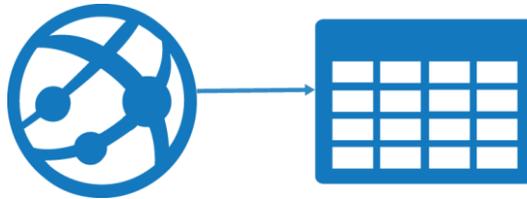


Analysis EEG Data

Collection Data API

Step 3: Store data to Storage Table in Azure

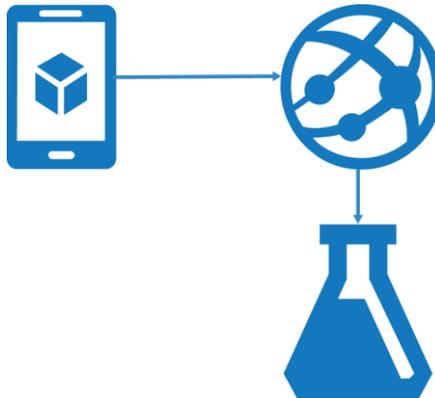
Using Analysis EEG data to Analysis data is push up. Result is 9 characteristics



- When we have 9 characteristics we store them on Storage Table in Azure .
- Data in Storage Table are used as training data for Machine Learning service.

Application API

Receive segment data (512 samples), extract features and call Machine Learning Web service to return classification result to client.



Application API

- When Machine Learning API is receive from Mobile
- Application , API will call web service in Machine learning.
- In Machine Learning EEG data will be analyze and then result
- Intention or Non-Intention to API
- When API have result , it will push result to mobile application
- Mobile Application can using result to play game

Machine Learning

Introduction

Machine learning explores the study and construction of algorithms that can learn from and make predictions on data. Such algorithms operate by building a model from example inputs in order to make data-driven predictions or decisions, rather than following strictly static program instructions.

Algorithms operate by building a model from example inputs in order to make data-driven predictions or decisions



Machine Learning

Machine learning type

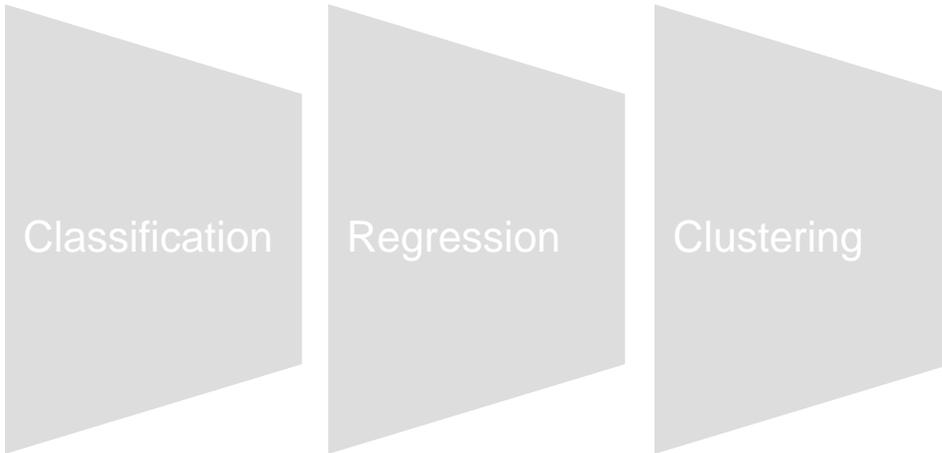
Supervised
learning

Unsupervised
learning

Reinforcement
learning

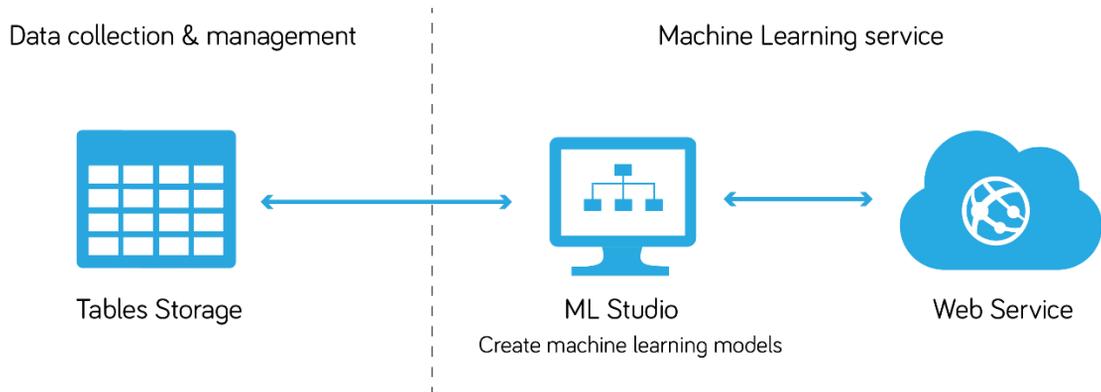
Machine Learning

Initialize Model



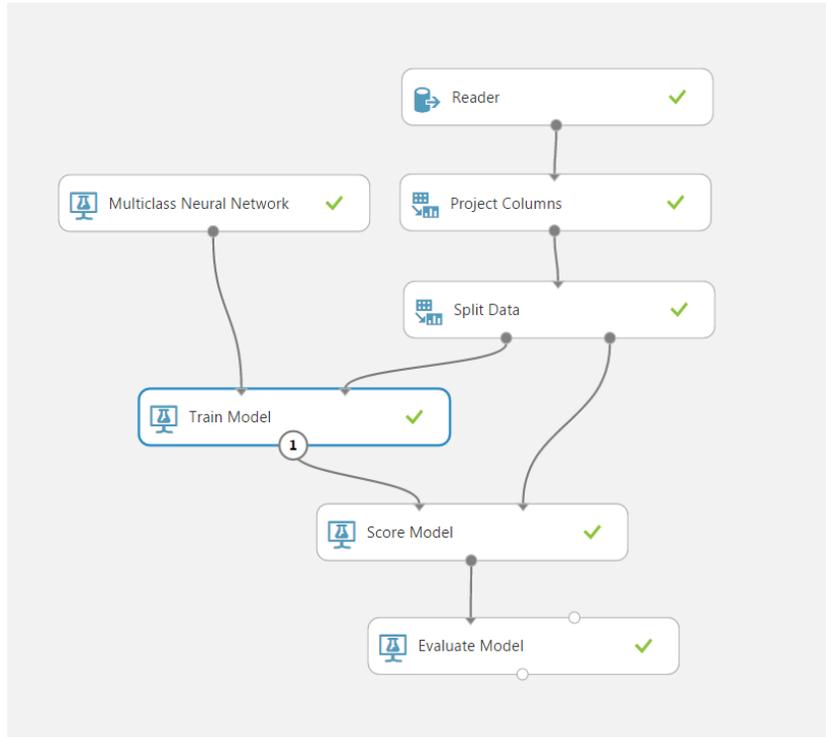
Azure Machine Learning

Workflow



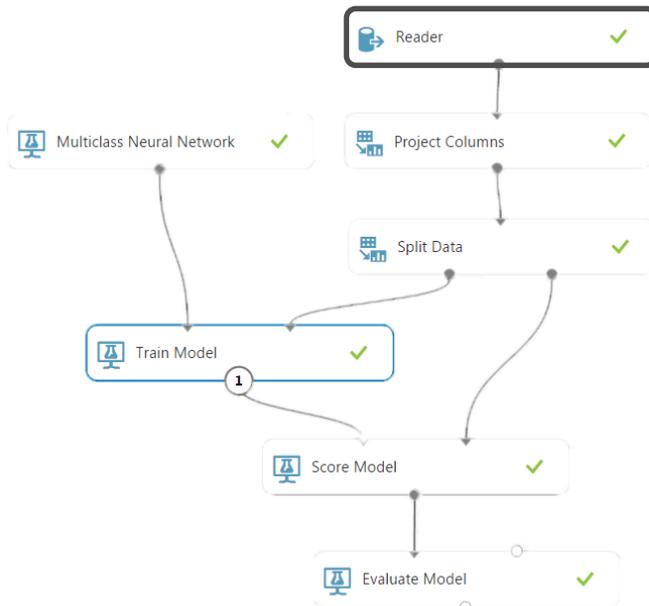
Azure Machine Learning

Training experiment



Azure Machine Learning

Get data



Properties

Reader

Data source

Azure Table

Authentication type

Account

Table account name

cloudthink

Table account key

.....

Table name

cloudthink

Rows to scan for property nam...

TopN

Rows count for TopN

10

START TIME 11/28/2015...

END TIME 11/28/2015...

ELAPSED TIME 0:00:12.866

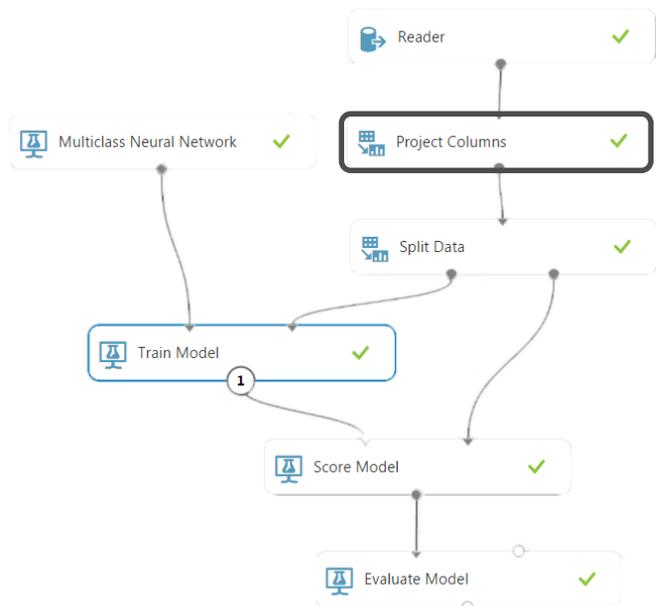
STATUS CODE Finished

STATUS DETAILS None

[View output log](#)

Azure Machine Learning

Pre-process data



Properties

Project Columns

Select columns

Selected columns:

All columns

Exclude column names:

PartitionKey, RowKey, Timestamp, Name

Launch column selector

START TIME 11/28/2015 10:14:18 PM

END TIME 11/28/2015 10:14:21 PM

ELAPSED TIME 0:00:03.335

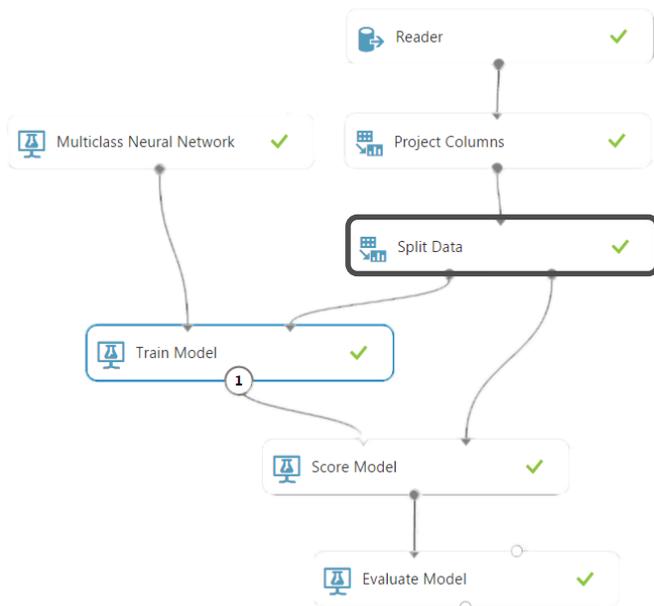
STATUS CODE Finished

STATUS DETAILS None

[View output log](#)

Azure Machine Learning

Split data



Properties

Split Data

Splitting mode

Split Rows

Fraction of rows in the first output dataset

0.8

Randomized split

Random seed

0

Stratified split

False

START TIME 11/28/2015 10:14:24 PM

END TIME 11/28/2015 10:14:27 PM

ELAPSED TIME 0:00:03.266

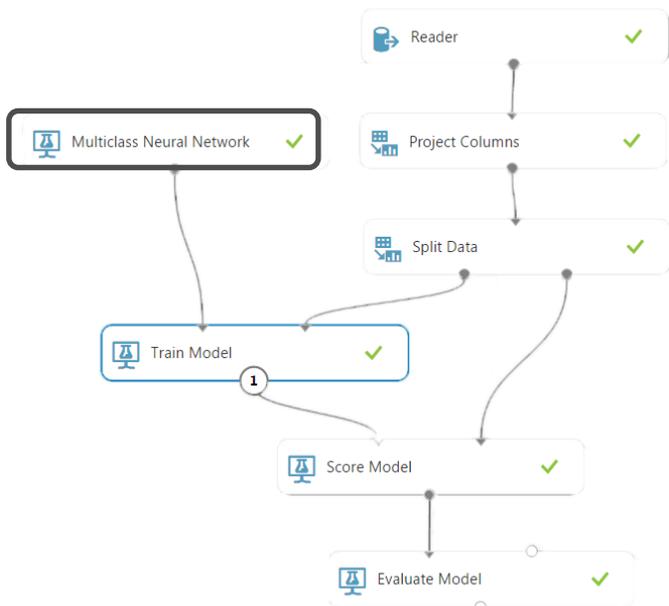
STATUS CODE Finished

STATUS DETAILS None

[View output log](#)

Azure Machine Learning

Apply a learning algorithm



Properties

└ Multiclass Neural Network

Create trainer mode

Single Parameter

Hidden layer specification

Fully-connected case

Number of hidden nodes

100

The learning rate

0.1

Number of learning iterations

100

The initial learning weights diameter

0.1

The momentum

0

The type of normalizer

Min-Max normalizer

Shuffle examples

Random number seed

Allow unknown categorical levels

START TIME 11/28/2015 10:14:02 PM

END TIME 11/28/2015 10:14:02 PM

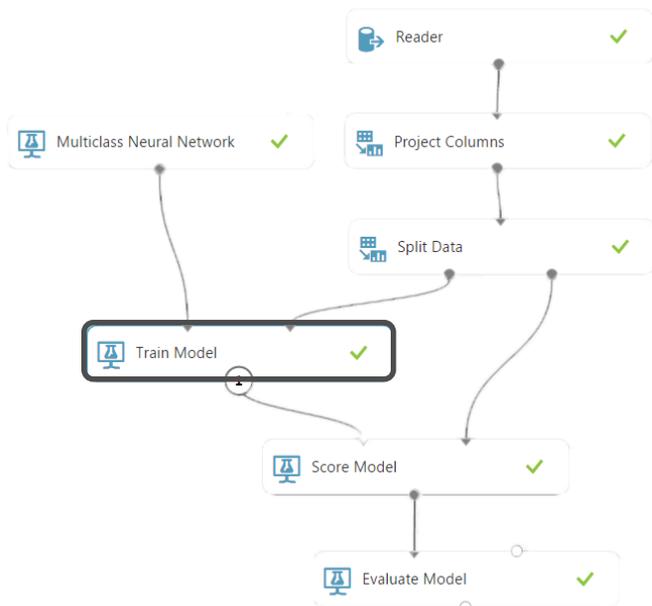
ELAPSED TIME 0:00:00.000

STATUS CODE Finished

STATUS DETAILS Task output was present in output cache

Azure Machine Learning

Train Model



Properties

Train Model

Label column

Selected columns:

Column names: IsIntention

[Launch column selector](#)

START TIME 11/28/2015 10:14:29 PM

END TIME 11/28/2015 10:14:34 PM

ELAPSED TIME 0:00:05.867

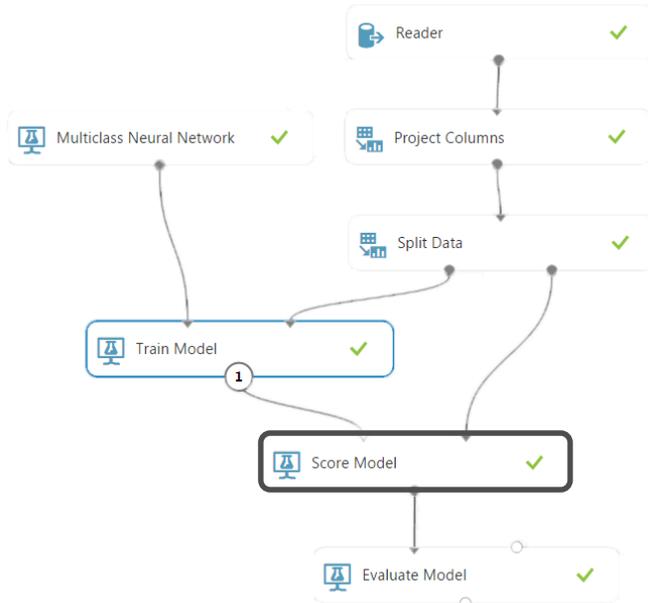
STATUS CODE Finished

STATUS DETAILS None

[View output log](#)

Azure Machine Learning

Evaluate result



Azure Machine Learning

Evaluate result

Microsoft Azure Machine Learning | Home Studio Gallery cloudthink - ?

CloudThink > Score Model > Scored dataset

	percent_alpha	percent_beta	psd_alpha	psd_beta	arburg_1	arburg_2	arburg_3	arburg_4	arburg_5	arburg_6	Scored Probabilities for Class '0'	Scored Probabilities for Class '1'	Scored Labels
0.02512	0.061111	-0.009528	0.030453	-0.532815	0.188877	-0.137813	-0.178037	0.15587	-0.495941	0.999987	0.000013	0	
0.018368	0.063246	-0.010336	0.029756	-0.576012	0.174315	-0.170172	-0.129761	0.065447	-0.363706	0.000003	0.999997	1	
0.03073	0.13261	-0.008653	0.029885	-0.621503	0.071205	-0.113612	-0.127254	0.077605	-0.286295	0.000001	0.999999	1	
0.029151	0.028982	-0.009343	0.029742	-0.51924	0.13105	-0.197433	-0.134192	0.09876	-0.37884	0	1	0	
0.015427	0.049293	-0.004875	0.032215	-0.522091	0.153662	-0.187549	-0.079975	0.085978	-0.449858	0.922676	0.077818	0	
0.019153	0.058115	-0.012002	0.029049	-0.600395	0.158135	-0.115649	-0.17202	0.105731	-0.375713	0.000005	0.999995	1	
0.008682	0.03954	-0.013798	0.030016	-0.607336	0.100402	-0.128194	-0.181705	0.130863	-0.31388	0.000007	0.999993	1	
0.026562	0.062611	-0.009287	0.030336	-0.598013	0.177173	-0.128018	-0.093691	0.06811	-0.425488	0.000063	0.999937	1	
0.019858	0.097328	-0.011617	0.029689	-0.550324	0.191597	-0.21409	-0.151545	0.093656	-0.369117	0.039862	0.960097	1	
0.02839	0.043408	-0.010504	0.03047	-0.553124	0.208274	-0.125933	-0.192647	0.169569	-0.506004	0.996342	0.003655	0	
0.050925	0.041253	-0.006883	0.030527	-0.590315	0.189363	-0.200579	-0.111262	0.137794	-0.424897	0.002292	0.997713	0	
0.02467	0.072816	-0.008896	0.031387	-0.567892	0.18404	-0.164591	-0.148151	0.14955	-0.452807	0.973883	0.026113	0	
0.017357	0.066098	-0.011894	0.029524	-0.557987	0.210158	-0.153543	-0.19177	0.13249	-0.439174	0.995778	0.004202	0	
0.029873	0.066574	-0.010024	0.031123	-0.495545	0.137495	-0.20844	-0.108886	0.062339	-0.386873	0.000001	0.999999	1	
0.00449	0.013454	-0.013378	0.030433	-0.58046	0.166294	-0.141115	-0.189824	0.132335	-0.387035	0.758152	0.241046	0	
0.031131	0.072134	-0.007014	0.027461	-0.537115	0.122827	-0.154788	-0.10577	0.000146	-0.325206	0	1	1	
0.019071	0.059339	-0.013296	0.029016	-0.556784	0.214573	-0.157736	-0.147619	0.056953	-0.4093	0.012374	0.987674	1	
0.019971	0.059323	-0.012308	0.030996	-0.600288	0.110387	-0.190071	-0.136105	0.124733	-0.308529	0	1	1	
0.018624	0.08308	-0.010663	0.030358	-0.543328	0.189934	-0.192755	-0.166799	0.039977	-0.335918	0.000336	0.999664	1	
0.028013	0.047576	-0.008794	0.030166	-0.6126	0.166894	-0.246149	-0.158259	0.153906	-0.303642	0.000001	0.999999	1	
0.0183	0.014153	-0.01231	0.03211	-0.477351	0.218754	-0.185426	-0.244538	0.139178	-0.450464	0.986416	0.013598	0	

Statistics

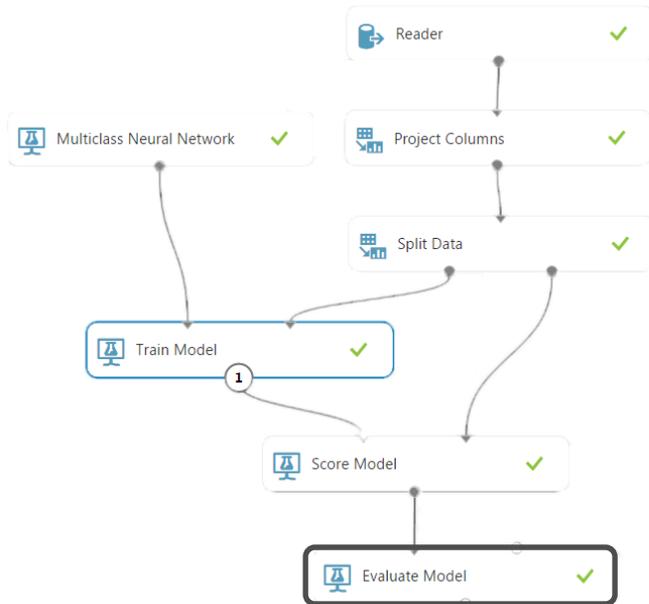
Visualizations

To create a graph, select a column in the table

NEW SAVE DISCARD CHANGES RUN SET UP WEB SERVICE PUBLISH TO GALLERY

Azure Machine Learning

Evaluate result



Azure Machine Learning

Evaluate result

Microsoft Azure Machine Learning | Home | Studio | Gallery | cloudthink -

CloudThink > Evaluate Model > Evaluation results

Search exper

Training experiment | Predictive experiment

Properties

Metrics

- Overall accuracy 0.980057
- Average accuracy 0.980057
- Micro-averaged precision 0.980057
- Macro-averaged precision 0.980661
- Micro-averaged recall 0.980057
- Macro-averaged recall 0.979343

Confusion Matrix

Predicted Class

	0	1
Actual Class 0	96.9%	3.1%
Actual Class 1	1.1%	98.9%

NEW

RUN HISTORY | SAVE | DISCARD CHANGES | RUN | SET UP WEB SERVICE | PUBLISH TO GALLERY

Machine Learning Web Service

Predictive experiment

The screenshot displays the Microsoft Azure Machine Learning Studio interface. The top navigation bar includes "Home", "Studio", and "Gallery". The user profile "cloudthink" is visible in the top right. The main workspace is titled "CloudThink [Predictive Exp.]".

Left Panel (Navigation):

- Search experiment items
- Saved Datasets
- Trained Models
- Data Format Conversions
- Data Input and Output
- Data Transformation
- Feature Selection
- Machine Learning
- OpenCV Library Modules
- Python Language Modules
- R Language Modules
- Statistical Functions
- Text Analytics
- Web Service
- Deprecated

Main Workspace (Predictive experiment):

- Web service input** (blue box) connects to the **Reader** module.
- Reader** (white box with green checkmark) connects to **Project Columns**.
- Project Columns** (white box with green checkmark) connects to **Score Model**.
- CloudThink [trained model]** (white box) connects to **Score Model**.
- Score Model** (white box with green checkmark) connects to **Web service output** (blue box).

Bottom Panel (Tools):

- Zoom in (+), Zoom out (-), Fit to view (1:1), and other navigation icons.
- Buttons for **RUN HISTORY**, **SAVE**, **DISCARD CHANGES**, **RUN**, **DEPLOY WEB SERVICE**, and **PUBLISH TO GALLERY**.

Right Panel: "In draft" status and "Draft saved at 21:24:13".

Machine Learning Web Service

Web Service

cloudthink [predictive exp.]

DASHBOARD CONFIGURATION

General

Published experiment

[View snapshot](#) [View latest](#)

Description

No description provided for this web service.

Training web service

CloudThink

API key

g/1UMmILbR/gZiO7p09eB0wusWW8qnxjsf8sarHf6FbT0a7ebpHMwWzJRCXEtDnU40ghUI8ptEYn4AY5aV41Q==

Default Endpoint

API HELP PAGE	TEST	APPS	LAST UPDATED
REQUEST/RESPONSE	Test	 Download Excel Workbook	11/28/2015 10:17:20 PM
BATCH EXECUTION			11/28/2015 10:17:20 PM

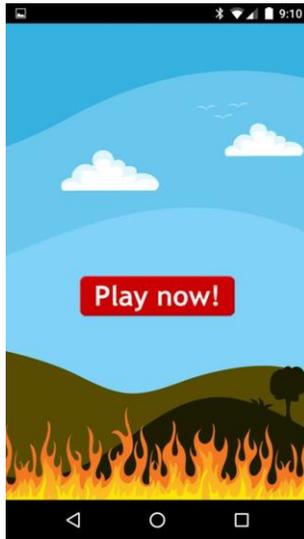
Additional endpoints

Number of additional endpoints created for this web service: 0

[Manage endpoints in Azure management portal](#)

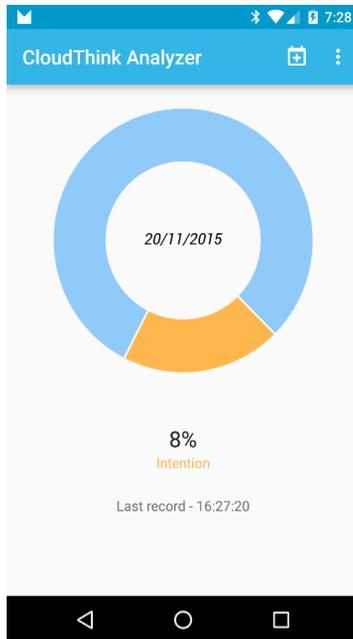
Applications for EEG Headsets

Game



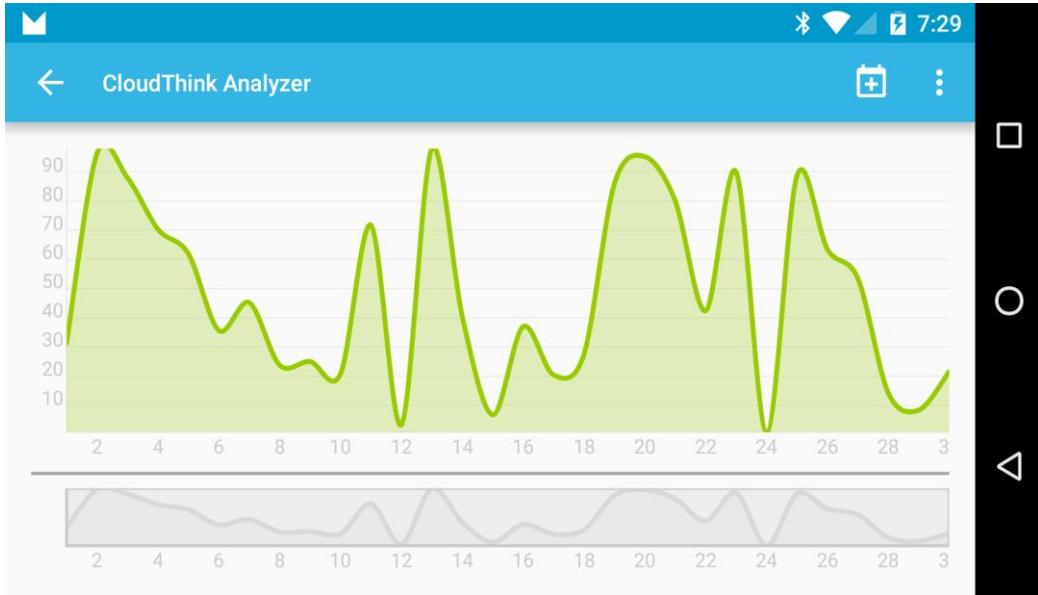
Applications for EEG Headsets

CloudThink Analytics Application



Applications for EEG Headsets

CloudThink Analytics Application



Result

Classification EEG data

Classification personal EEG data

Classification Multiple personality EEG data

Apply results of training

Playing real-time game

Result

Dataset:

- Collected from 1 women and 10 men aged around 22, healthy and right-handed.
- All of subjects are from FPT University and were informed the purpose of this experiment

Result

1. Classification personal EEG data

Name	Age	Gender	Classification result
AnhNPH	22	Male	1
TuanPA	22	Male	0.997061
HungNN	22	Male	1
ManhNB	22	Male	0.987551
LamNH	22	Male	0.993466
BacNV	22	Male	0.985646
DuongNT	22	Male	0.991244
ManhLN	22	Male	0.982345
AnhDD	22	Male	1
ChinhVC	22	Male	0.981564
HuyNM	22	Male	0.998546
MaiCTP	22	Female	0.976125

Result

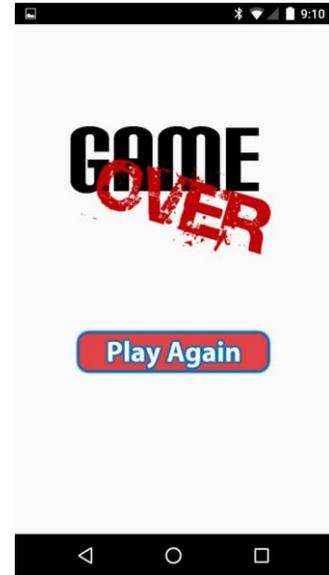
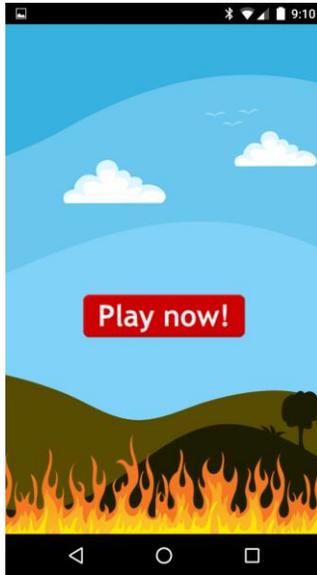
2. Classification Multiple personality EEG data

Test case	Result
2 persons (Male 2)	0.989243
5 persons (Male 5)	0.976512
11 persons (Male 10, Female 1)	0.969243
2 persons (Male 1, Female 1)	0.959243

Result

Apply results of training

Play real-time game



Result

Play real-time game

Case 1: Play game with classification result of his/her EEG data

Case 2: Play game with classification result of multiple personality EEG data

Result

Play real-time game

User Experience Checklist

Question	Answer
1 Have you played Save angle?	
2 Do you play any similar game ?	
3 Do you think this game would be suitable for you?	
4 What do you think about the difficulty of the game?	
5 Do characters move follow your desire or not?	
6 Are you satisfied with what you were able to achieve while playing the game?	
7 Do characters move quickly and smoothly?	
8 Will you continue to play this game beyond this test? Why or why not?	
9 If you had a magic wand, how would you improve this game?	

Result

Play real-time game

Case 1: Play game with classification result of his/her EEG data

- The majority of volunteers are satisfied with the game satisfied with the game.
- The player can control the characters move in subjective consciousness.

Case 2: Play game with classification result of multiple personality EEG data

- Players do not get stuck to control the character.
- The player can control the characters move in subjective consciousness similar playing game with classification result of his/her EEG data.
- We conducted experiments on volunteers is not in the database has been learned. Results playing game remains as expected.

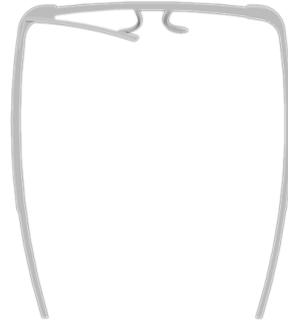
Discussion

In the future, to achieve more accurate results, we need to conduct experience with longer duration, greater number of users.

We have explored methods of supporting multiple users concurrently.

Develop a small-form models, which allow quick classifications on the mobile device itself.

Future Work



The design described in this paper is the idea to carry a wearable headband that is easily connected to the smartphone, which acts as a medium to transfer data to the cloud network for analyses.



DEMO



Q&A