Al and ML Overview and Applications of Al/ML

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Basic Background of Data Science

Data?

• 未經過處理的原始記錄。

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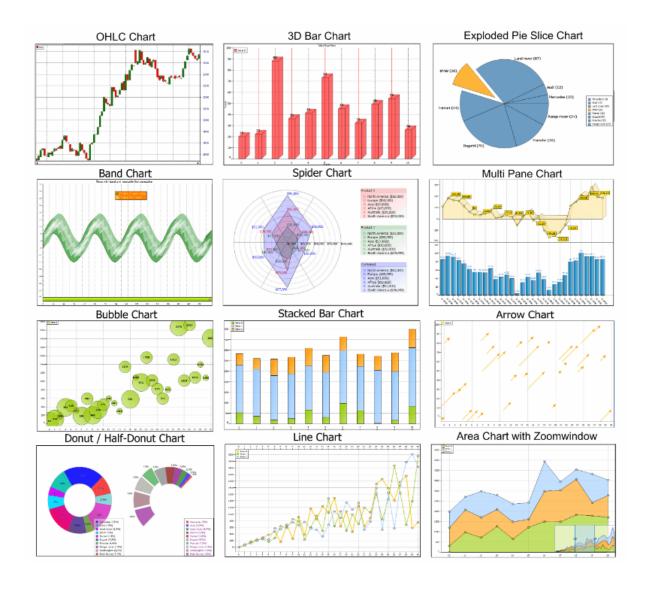
Information?

• 資訊是經過處理後的資料。

• 資訊是有用的或有意義的資料。

• 對接受者有意義的資料能使接受者產生資訊。

Information?



Knowledge?

• 知識是資訊、文化脈絡以及經驗的整合。

知識是對某個主題確信的認識,並且這些認識擁 有潛在的能力為特定目的而使用。

• 藉由專業技能或豐富經驗用以分析資訊的結果。

Intelligence?

• 以知識為基礎, 運用個人能力, 實踐能力來開創價值。

• 分析、判斷、創造、思考的能力。

• 智慧具有反應能力與價值判斷。

人工智慧?

- 指由人製造出來的機器所表現出來的智慧。(Wiki)
- 弱人工智慧 → 專家系統
 - 處理特定的問題
- 強人工智慧
 - 通用人工智慧

IBM Watson 益智節目



IBM Watson



過去

- Small Data
 - 針對某一個問題,只能獲得小量數據。
 - 數百筆到數萬筆。
 - 花費大量人工編碼。

過去

- Small Data 統計分析
 - 樣本推論母體(抽樣)
 - 在小樣本中,需要發展一系列理論來解釋事物的原理(學說)
 - [啟示] 1936 羅斯福與藍頓 的民調

過去

- 小數據
- Rule-based AI
- 類神經網路 (1980s)

現在與未來

- Big Data
 - 由"母體"來分析數據
 - 數萬筆到幾近無限
 - 雜亂的原始資料

上一世代

- 大數據
- 分類: SVM → 機器學習
- 分群:Kmeans
- 關聯式法則: Apriori

What's difference?

- Small Data vs Big Data
 - 都有目的或待解的問題

But

- 減少假設
- 力求呈現真實世界

What's difference?

• 資料可重組與檢視關聯。

•接受「數據的雜亂性」,不再追求「精確」的 數據。

• 重「相關」而輕「因果」。

現在

- 大數據
- 運算力的提升
- 深度學習 (強AI的可能性)
 - 類神經網路的文藝復興
- 演進趨勢
 - 腦神經科學
 - 認知科學
 - 認知心理學

AlphaGo

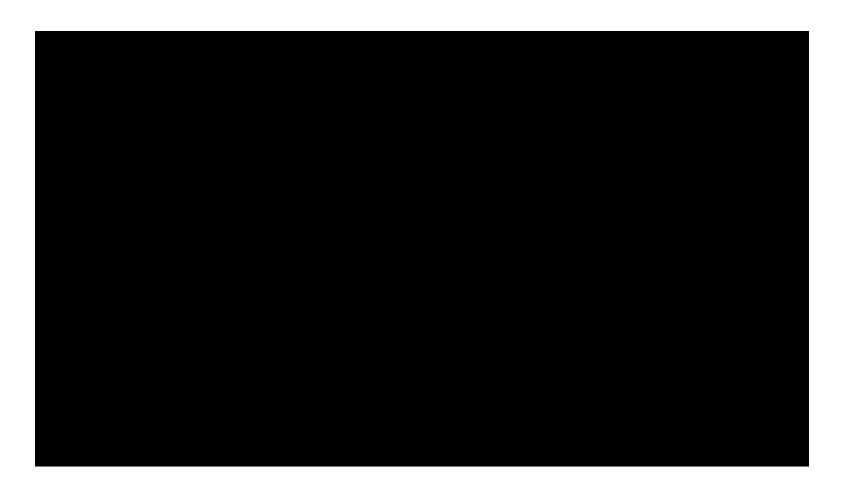


https://www.youtube.com/watch?v=SUbqykXVx0A

AlphaGo ZERO



AlphaGo 中理解增強式學習



Big Data 的沿革 (1/3)

- Data Mining
 - 資料探勘是利用分析技術來發掘資料間未知的關聯性與規則。
 - 少女未婚懷孕 購物商場比老爸還早知道?!
 - https://www.nownews.com/news/20120223/42676

- ✓分群
 - 用於沒有標籤的資料,又通常為非監督式演算法。
- ✓分類
 - 用於有標籤的資料,又通常為監督式演算法。
- ✓關聯式法則
 - 有序性規則的資料

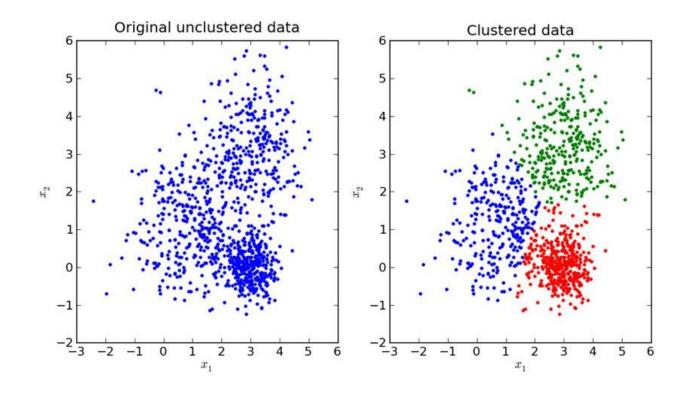
✓分群

• 用於沒有標籤的資料,又通常為非監督式演算法。

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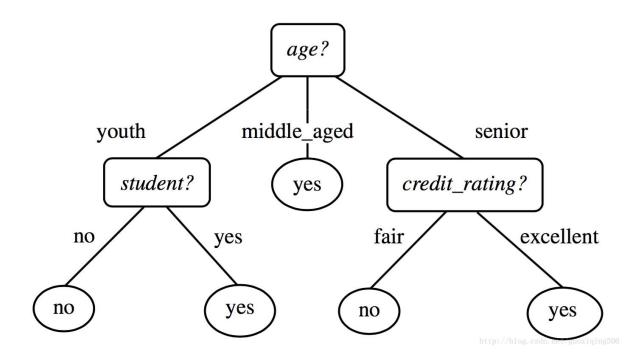
✓分群

• 用於沒有標籤的資料,又通常為非監督式演算法。

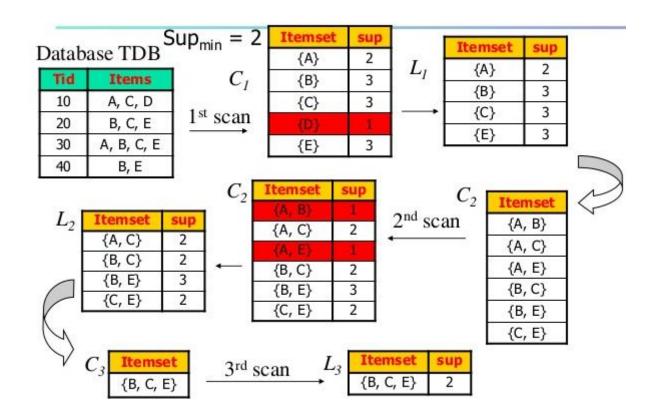


✓分類

• 用於有標籤的資料,又通常為監督式演算法。



- ✓關聯式法則
 - 有序性 (尿布與啤酒)

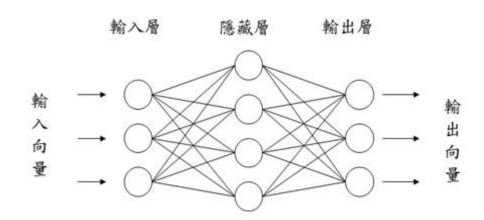


Big Data 的沿革 (2/3)

- Machine Learning
 - 人工智慧的分支,可用於資料探勘。
 - 讓機器可以自動學習、從巨量資料中找到規則,進而有能力做出分類或預測。
 - 判斷出類別
 - 估計出數值

Big Data 的沿革 (3/3)

- Deep Learning
 - 是機器學習的分支
 - 類神經網路的文藝復興



- 從大規模未標記資料中建立更好的預測模型
- 建立強 AI 的可能性

資料分析的基本步驟

- 1. 資料清除:去除極端、遺失值資料、不重要的屬性
- 2. 資料整合:因應用目的或特性,整合不同來源的資料
- 3. 資料選擇:揀選重要的屬性來逼近目的之最佳成效
- 4. 資料轉換:基於領域知識進行特徵縮放、數值類別轉換等
- 5. 資料探勘:選用合適的分析演算法得到目的之結果
- 6. 樣式評估:評估結果的樣式,是否如預期
- 7. 知識表示:因應目的將樣式轉換成合適的表達方法

資料分析的演算法重點

- 預處理 (Preprocessing)
- 降維 (Dimensionality Reduction)
- 模型選擇 (Model Selection)
 - 監督式學習 (Supervised learning)
 - 分類(Classification):機器給出一個類別
 - 迴歸 (Regression):機器給出一個數值
 - 非監督式學習 (Unsupervised learning)
 - 分群 (Clustering)

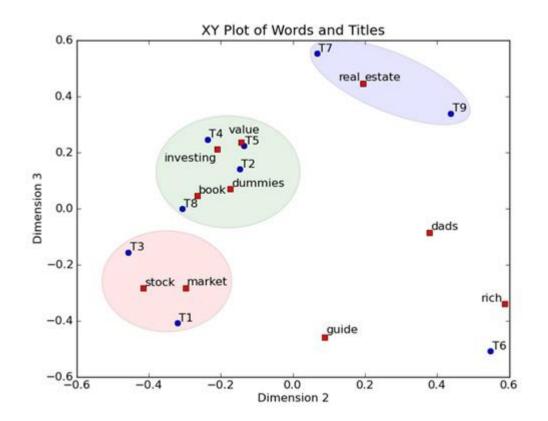
降維(Dimensionality reduction)

- 奇異值分解
 - Singular Value Decomposition (SVD)

Index Words Titles																											
	T1	T2	ТЗ	T4	T5	T6	T7	T8	Т9	book	0.	15-0	.27	0.04													
book			1	1						dads	0.2	24 0.	38	-0.09													
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降維(Dimensionality reduction)

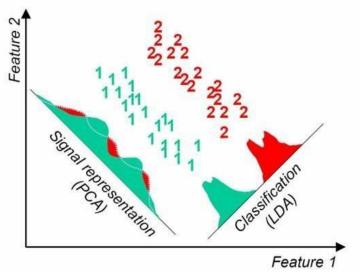
- 奇異值分解
 - Singular Value Decomposition (SVD)

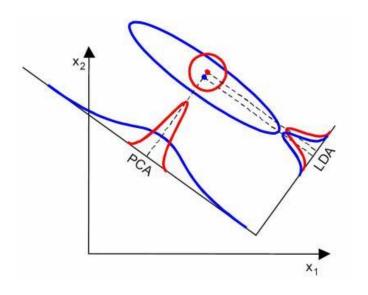


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real							1		1				
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stock	1		1					1					
value				1	1								

降維 (Dimensionality reduction)

- 主成分分析
 - Principal Component Analysis (PCA)
 - 非監督式
- 線性判別分析
 - Linear Discriminant Analysis (LDA)
 - 監督式





Thinking Time

資料分析的常見角色

- 資料產品經理人:將真實世界的問題轉換成資料可以解決的問題,通常是該問題領域的專業人士
- 資料工程師:蒐集、整理、清理資料,通常是具備程式技術能力的工程師
- 資料分析師:負責資料建模和分析,通常由擅長找出資料關聯的統計人擔當
- 資料視覺化設計師:將報表變得簡明易懂

Applications

以語言學習輔助工具為例

Collocation online suggestion v1.0 英語搭配詞線上檢索系統

介绍 常用搭配調查詢 整句搭配調查詢與推薦

整句搭配詞查詢與推薦

輸入句子: We commonly use a small cell for medical research.

清除

送出

輸入的句子為

We commonly use a small cell for medical research.

副網修飾(V/Adv/Adj級合)

#	collocation	freq(%)
1	commonly use	46.5
2	commonly used	4.7
3	commonly find	4.4
4	commonly know	3.3
5	commonly employ	2.4
6	commonly refer	2.2
7	commonly observe	1.9
8	commonly report	1.9
9	commonly encounter	1.4
10	commonly available	1.3

commonly與use的搭配字同義組合

	commonly + 搭章	freq(%)			
#	collocation	freq(%)			
1	commonly use	46.5	4		
2	commonly employ	2.4	8		
3	commonly apply	0.5	~		

同義詞搭配詞級搜導結果

#	commonly的同義字+use collocation	count	
1	commonly use	296	4
2	often use	140	4
3	frequently use	68	4
4	commonly employ	15	4
5	frequently employ	9	4
6	often employ	6	4
7	frequently apply	5	4
8	repeatedly use	5	8
9	routinely use	5	8
10	frequently utilize	4	4
11	routinely employ	3	4
12	commonly apply	3	8

查詢總時間:0.52sec

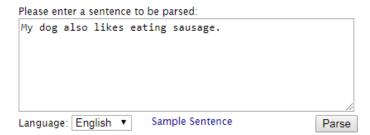
以語言學習輔助工具為例

	computer	data	pinch	result	sugar
aprocot	0	0	1	0	1
pineapple	0	0	1	0	1
digital	2	1	0	1	0
information	1	6	0	4	0

$$P(x=information,y=data)=rac{6}{19}=0.32$$
 $P(x=information)=rac{6+4+1}{19}=rac{11}{19}=0.58$
 $P(y=data)=rac{6+1}{19}=rac{7}{19}=0.37$
 $pmi(x=information,y=data)$
 $=lograc{P(x=information,y=data)}{P(x=information) imes P(y=data)}$
 $=log1.49$
 $=0.57$

以語言學習輔助工具為例

Stanford Parser



Your query

My dog also likes eating sausage.

Tagging

```
\label{eq:my/PRPS} \textit{My/PRPS} \quad \textit{dog/NN} \quad \textit{also/RB} \quad \textit{likes/VBZ} \quad \textit{eating/VBG} \quad \textit{sausage/NN} \quad \textit{./.}
```

Parse

```
(ROOT
    (S
          (NP (PRP$ My) (NN dog))
          (ADVP (RB also))
          (VP (VBZ likes)
           (S
               (VP (VBG eating)
                (NP (NN sausage)))))
          (. . )))
```

Universal dependencies

```
nmod:poss(dog-2, My-1)
nsubj(likes-4, dog-2)
advmod(likes-4, also-3)
root(ROOT-0, likes-4)
xcomp(likes-4, eating-5)
dobj(eating-5, sausage-6)
```

Your query

猴子喜欢吃香蕉。

Segmentation

猴子 喜欢 吃 香蕉 。

Tagging

猴子/NN 喜欢/VV 吃/VV 香蕉/NN ·/PU

Parse

```
(ROOT
(IP
(NP (NN 猴子))
(VP (W 喜欢)
(IP
(VP (W 吃)
(NP (NN 香蕉)))))
```

Universal dependencies

```
nsubj(喜欢-2, 猴子-1)
root(ROOT-0, 喜欢-2)
ccomp(喜欢-2, 吃-3)
dobj(吃-3, 香蕉-4)
punct(喜欢-2, 。-5)
```

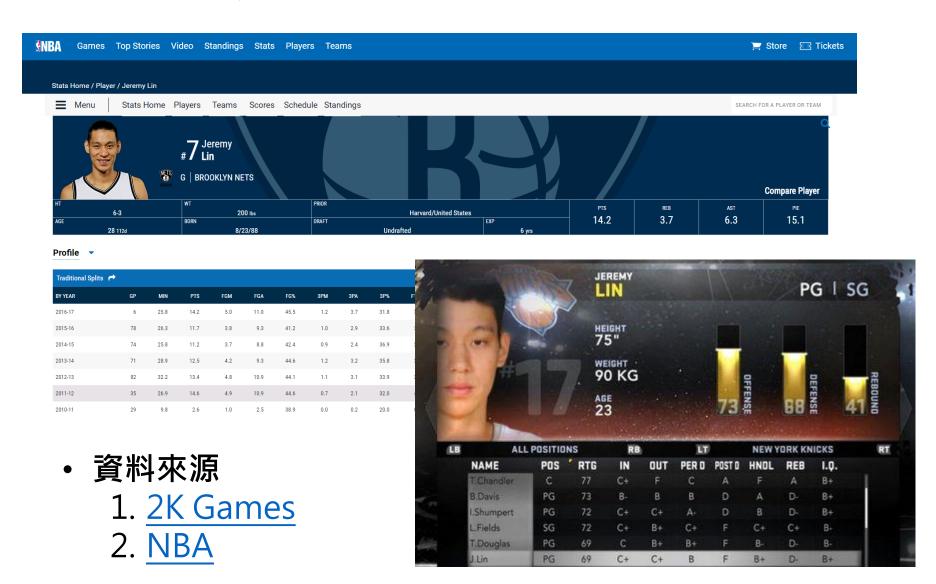
http://nlp.stanford.edu:8080/parser/

以NBA的應用為例

- DevDays Asia 2016
- 入圍前五
 - 24小時黑客松
 - 3人臨時組團
 - 臨時命題
 - 純好玩

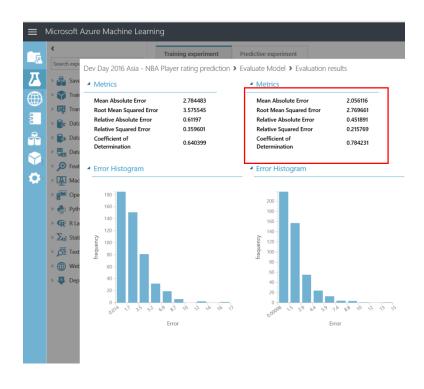


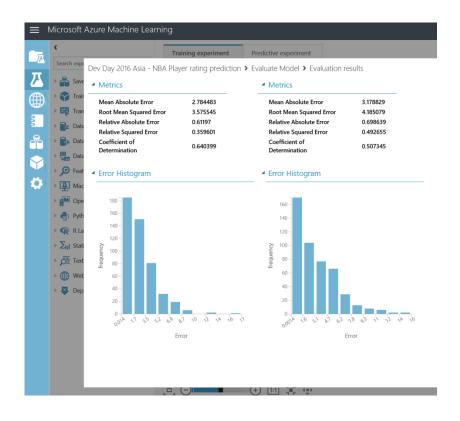
NBA公開資料 & Game NBA 2K 能力值



以NBA的應用為例

• NBA 2K17能力預測





NBA季後賽預測



資料驅動創新應用

- 文字、聲音、影像
 - 自然語言處理
 - 語音辨識
 - 影像辨識
- 數值與非數值
 - 連續性
 - 離散性、類別

Thinking Time

Potential Applications

中文OCR辨識為例





 Lee, M. C., Chiu S. Y., & <u>Chang, J. W.</u> (2017) A Deep Convolutional Neural Network based Chinese Menu Recognition App. Information Processing Letters, 128, 14-20. https://doi.org/10.1016/j.ipl.2017.07.010 (SCI, COMPUTER SCIENCE, INFORMATION SYSTEMS)

CNN應用於情緒感知辨識的照護機器人



link

 Lee, M. C., Yeh, S. C., Chiu, S. Y. & <u>Chang, J. W.</u> (2017, June). A Deep Convolutional Neural Network Based Virtual Elderly Companion Agent. ACM Multimedia Systems 2017 (MMSYS2017), Taipei, Taiwan. (Accept Rate: 28%) http://dl.acm.org/citation.cfm?id=3083220

工業 4.0



http://www.esta.com.tw/knowledge-info.asp?id=263 https://www.youtube.com/watch?v=HexQLQIHrAY

工業 4.0



Fintech





Open Datasets

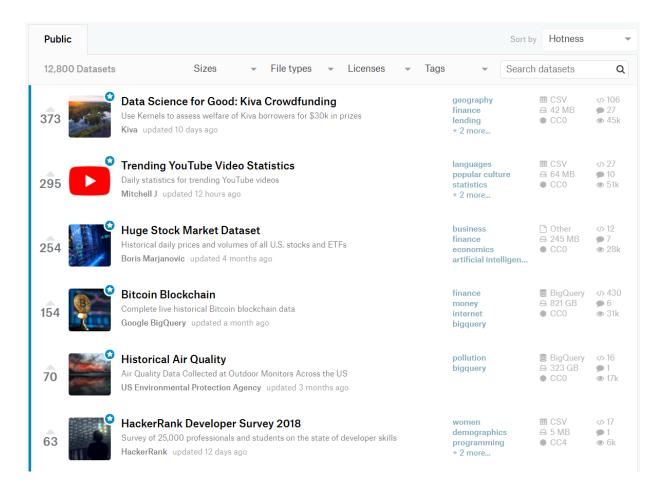
UC Irvine Machine Learning Repository

http://archive.ics.uci.edu/ml/datasets.html



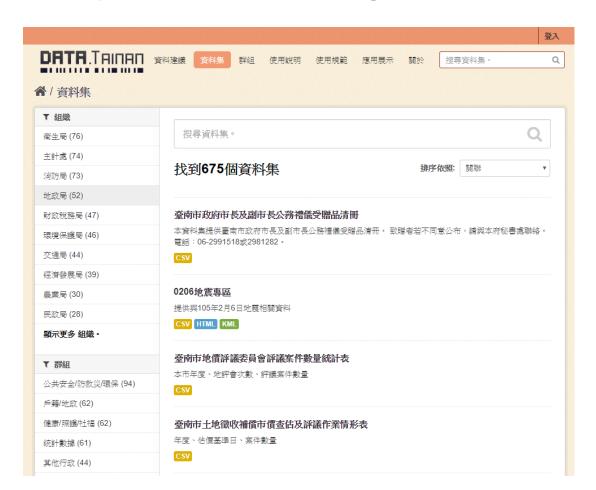
Kaggle DataSets

https://www.kaggle.com/datasets



臺南市開放資料

http://data.tainan.gov.tw/dataset



Thank you