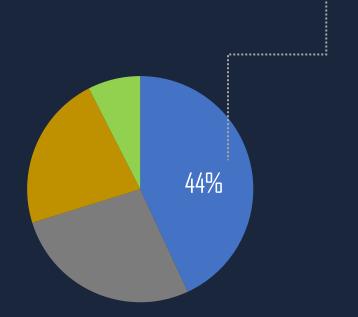


Sebastián Torres Head of Merchandising Analytics

Walmart > Chile















11.115 stores2.3 millions associatesRevenue of US\$500 billions



BUY

MOVE

SELL

- Planning
- Negotiation
- Assortment
- Pricing

Imports

- Warehouses
- Routing
- Supply chain

- Store location
- Workforce scheduling
- Customer Relationship Management (CRM)

390 stores, 60000 products, 50000 associates

- >4.5 millions customers
- >8000 millions scans

Merchandising Analytics

To provide digital solutions for Walmart Chile business issues, by using **new technologies**, **mathematical modeling**, and the ability to process **large amounts of data**.

Pricing Promotions Assortment Layout

Pricing optimization

Best price of each product and store.

Association of products or set of products (reference)

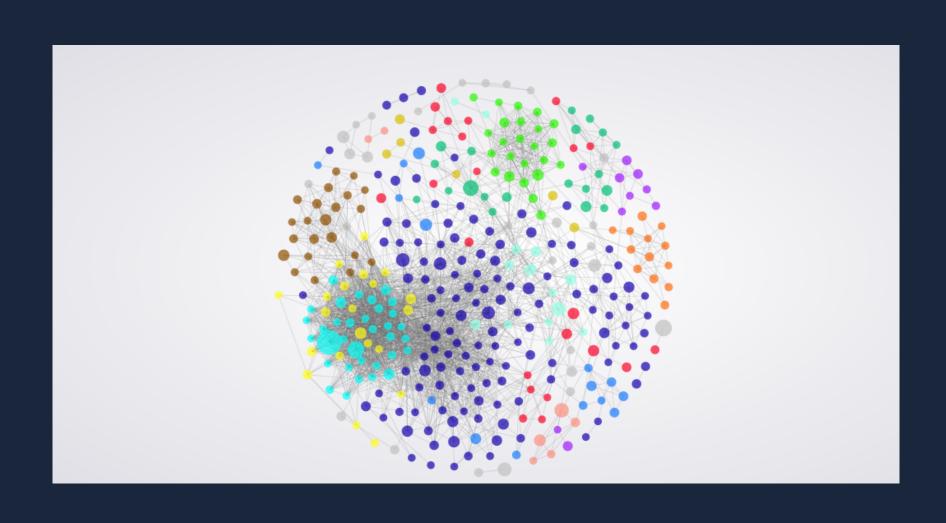
| 7809611707444 PECHUGA DESH \$ 3.690 7802575201218 NIDO FETTUC \$ 1.030 7808743602146 AVENA INSTAN \$ 770 7805045000144 JABON LAVAR \$ 3.490 MARIA TERESA ALARCON ANDANA RUT MCL: ******7708 7803468003025 MOLDE LIGHT \$ 1.390 7802920000916 YOGHURT LIGH \$ 220 78013036756440 NUBE PINA \$ 380 7613036756440 NUBE PINA \$ 380 7613036443166 NUBE COCO \$ 380 7613036443166 NUBE COCO \$ 380 76130350504 CASSATTA BRI \$ 2.190 7802200400061 MERM DAMASCO \$ 770 7613035180703 PACK CONDENS \$ 1.490 7802926000682 HELADO AGUA \$ 2.690 | 7804642160138 PAN ARABE | \$ 990 |
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| 7802926000682 HELADO AGUA \$ 2.690 | 7802615006551 ARROZ GRADO | \$ 1.150 |
| | 7802926000682 HELADO AGUA | \$ 2.690 |

$$supp(X) = rac{|\{t \in D; X \subseteq t\}|}{|D|} = rac{C_x}{|D|} = P(X)$$

$$conf(X\Rightarrow Y)=rac{supp(X\cup Y)}{supp(X)}=rac{P(X\cap Y)}{P(X)}=rac{C_{xy}}{C_x}=P(Y|X)$$

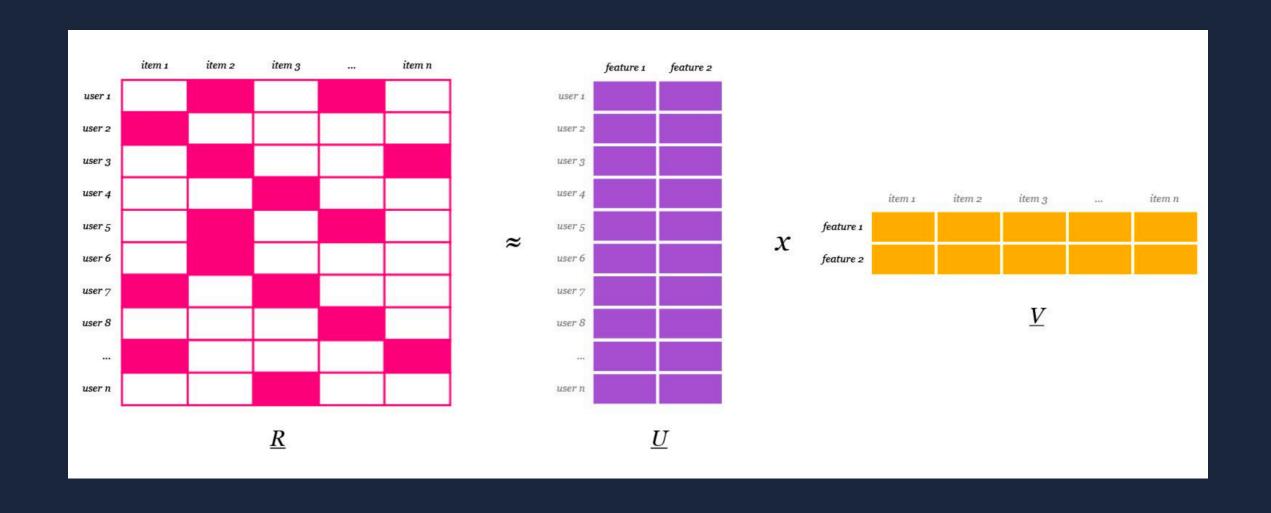
$$lift(X\Rightarrow Y)=rac{conf(X\Rightarrow Y)}{supp(X)}=rac{P(X\cap Y)}{P(X)P(Y)}=rac{C_{xy}}{C_{x}C_{y}}|D|$$

| STORE_NBR | DPFL_X | Fineline_Desc_X | DPFL_Y | Fineline_Desc_Y | C_xy | C_x | С_у | Lift |
|-----------|--------|--------------------|--------|----------------------|-------|-------|-------|------|
| 3 | 21100 | ACOND FAMILIAR | 23600 | SHAMPOO FAMILIAR | 14991 | 30140 | 43910 | 52.3 |
| 3 | 21075 | ACOND TOD/TIPO CAB | 23525 | SHAMPOO CABELLO SECO | 10035 | 62870 | 24799 | 29.7 |
| 3 | 924500 | CREMAS | 924525 | SOPAS | 24650 | 58176 | 78410 | 25 |
| 3 | 21075 | ACOND TOD/TIPO CAB | 23475 | SHAMPOO CABELLO NORM | 23979 | 62870 | 72489 | 24.3 |
| 8 | 922750 | TODA OCASION | 928350 | TENTACION | 17077 | 38506 | 54085 | 23.6 |
| 616 | 924500 | CREMAS | 924525 | SOPAS | 21864 | 42975 | 58263 | 23.5 |
| 616 | 21100 | ACOND FAMILIAR | 23600 | SHAMPOO FAMILIAR | 29500 | 52975 | 64427 | 23.3 |
| 3 | 921875 | DOYPACK KETCHUP | 921950 | MOSTAZA REGULAR | 13060 | 73408 | 39251 | 20.9 |
| 616 | 21075 | ACOND TOD/TIPO CAB | 23525 | SHAMPOO CABELLO SECO | 10182 | 57335 | 23325 | 20.5 |



Forecast modeling

Implicit feedback data



NEW YORKER

ANNALS OF COMMUNICATIONS

HOW THE MATH MEN OVERTHREW THE MAD MEN



By Ken Auletta May 21, 2018





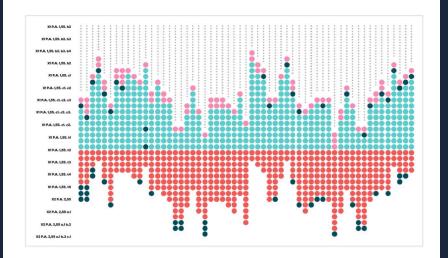




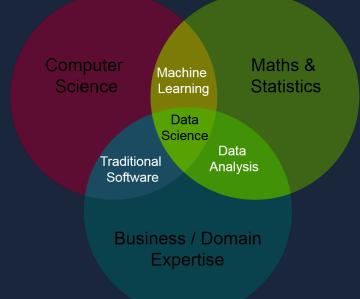


laSegunda

viernes_reportaje



LA NUEVA INFLUENCIA **DE LOS MATEMÁTICOS**



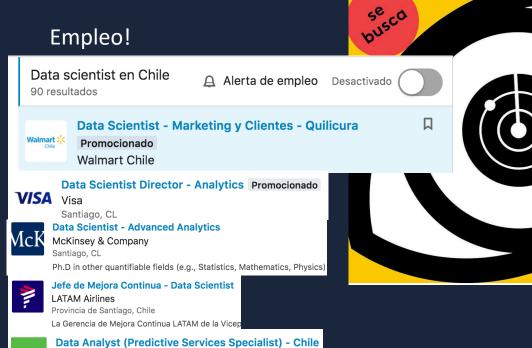


El Laboratorio de Gobierno está buscando nuevos talentos con compromiso por lo público y que quieran transformar el Estado desde adentro.

Si calzas con este perfil y tienes ganas de enfrentar el desafío de impulsar la innovación pública de cara a los ciudadanos, postula para el cargo de Consultor en Ciencia de Datos.

Laboratorio

de Gobierno



ONCR

NCR Corporation

Santiago

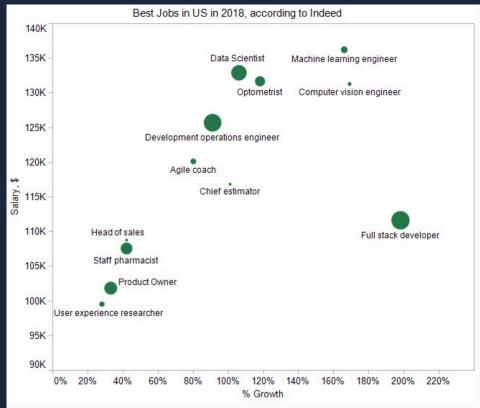


Fig. 1: Top US Jobs in 2018, based on Salary (Y-Axis) and Growth (X-Axis). Circle size is proportional to the number of job titles.

Recursos:
https://www.kdnuggets.com/
https://datasciencecentral.com/

http://blog.kaggle.com/



Walmart Chile

2 años y 4 meses

Head of Merchandising Analytics

ago. de 2019 – actualidad · 3 meses

Product Owner

mar. de 2019 – actualidad · 8 meses

Data Scientist

jul. de 2017 – feb. de 2019 · 1 año y 8 meses Quilicura, Región Metropolitana de Santiago, Chile

Teamwork



Optimization:

Mathematical modeling and optimization of product assortment.

Price-demand elasticity and price optimization.

Time series:

Hierarchical or grouped forecast of time series.

Data mining:

Asymmetrical association rules.



sebastian.torres@walmart.com