



CURSOS DE VERANO 2014

APROXIMACIÓN PRÁCTICA A LA CIENCIA DE DATOS Y BIG DATA: HERRAMIENTAS KNIME, R, HADOOP Y MAHOUT

Experiencia práctica en Ciencia de Datos: La Competición de KAGGLE como plataforma para la adquisición de experiencia profesional

José Antonio Guerrero Durán

Contenidos

- **Kaggle: plataforma de referencia mundial para análisis predictivo de datos**
- **Estado del arte en análisis predictivo: Paradigmas de la Estadística Multivariable vs el Aprendizaje Automático**
- **Experiencias en competencias Kaggle**

Origen de Kaggle

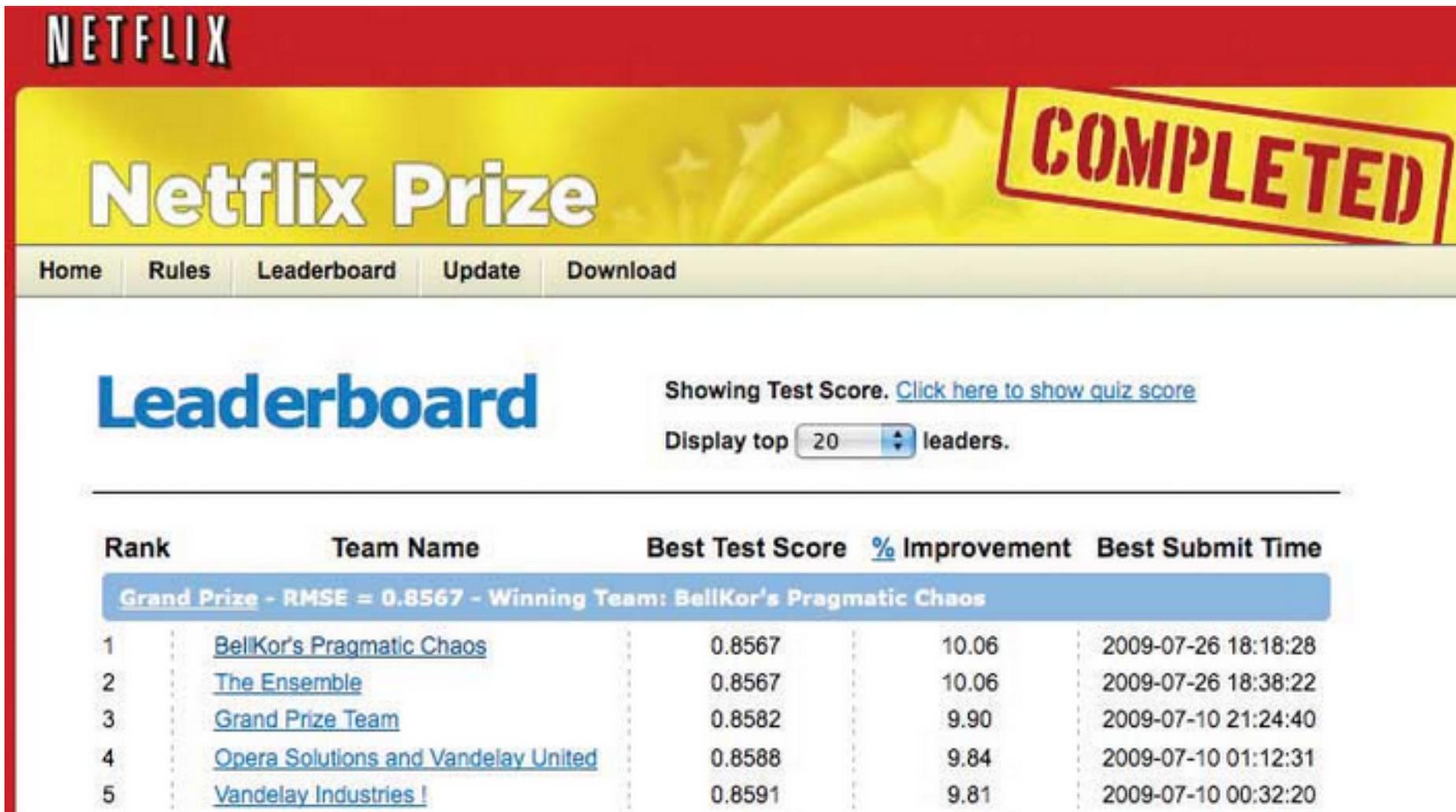


- 2006: Algoritmo de recomendación de películas
 - 100 M de votos
 - 480 K clientes
 - 17.7 K películas
- Mejora del 10% en la predicción -> 1.000.000 \$
- 2009: 40.000 equipos participantes

Origen de Kaggle

		Best Score	% Improvement
1	The Ensemble	0.8553	10.10
2	BellKor's Pragmatic Chaos	0.8554	10.09
	Grand Prize Barrier	0.8563	
3	Grand Prize Team	0.8571	9.91
4	Opera Solutions and Vandelay United	0.8573	9.89
5	Vandelay Industries !	0.8579	9.83
6	Pragmatic Theory	0.8582	9.80
7	BellKor in BigChaos	0.8590	9.71
8	Dace_	0.8603	9.58
9	Opera Solutions	0.8611	9.49
10	BellKor	0.8612	9.48

Origen de Kaggle



NETFLIX

Netflix Prize

COMPLETED

Home Rules Leaderboard Update Download

Leaderboard

Showing Test Score. [Click here to show quiz score](#)

Display top leaders.

Rank	Team Name	Best Test Score	% Improvement	Best Submit Time
Grand Prize - RMSE = 0.8567 - Winning Team: BellKor's Pragmatic Chaos				
1	BellKor's Pragmatic Chaos	0.8567	10.06	2009-07-26 18:18:28
2	The Ensemble	0.8567	10.06	2009-07-26 18:38:22
3	Grand Prize Team	0.8582	9.90	2009-07-10 21:24:40
4	Opera Solutions and Vandelay United	0.8588	9.84	2009-07-10 01:12:31
5	Vandelay Industries !	0.8591	9.81	2009-07-10 00:32:20

Origen de Kaggle



Origen de Kaggle

- ❑ Ensamblado
- ❑ SVD matrices dispersas
- ❑ Producción científica
- ❑ La totalidad de sistemas de recomendación actuales incorporan mejoras obtenidas de esta competición



Origen de Kaggle

References

[Awards](#)[Customers](#)[Public relations](#)[recommend
The Engine](#)[Customized
Systems](#)[Basic Information](#)

Achievements

- Expedia Challenge: Personalize Expedia Hotel Searches - ICDM 2013 Kaggle Competition (11/2013)
- KDD Cup 2012: 2nd place (Track 2) - together with Opera Solutions ACM Sig Conference on Knowledge Discovery and Data Mining (08/2012)
- KDD Cup 2011: 2nd place (Track 1) & 3rd place (Track 2) ACM Sig Conference on Knowledge Discovery and Data Mining (08/2011)
- KDD Cup 2010: 3rd place. ACM Sig Conference on Knowledge Discovery and Data Mining (06/2010)
- INNOward 2010. The State Economic Chamber Styria, Austria (02/2010)
- Austrian Federal State Award 'Consulting/Knowledge based services'. Republic of Austria, Federal Ministry of Economy (11/2009)
- Western Styrian Business Award - Category Innovation Wirtschaftsbund Steiermark - Voitsberg, Austria (10/2009)
- ebiz egovernment Award Styria: 2nd place.



□ Georg Preßler, Michael Schrotter, Michael Jahrer, Andreas Töscher

Origen de Kaggle



"We're making data science into a sport" ... Kaggle founder Anthony Goldbloom.

- ▣ 2010: We're making data science into a sport

Kaggle, referencia para el análisis predictivo

- **400 retos en un formato similar a Netflix:**
 - **Problemas de predicción o de optimización.**
 - **Variable respuesta**
 - **Métrica para evaluar el error cometido en las estimaciones.**

- **Training set: conjunto de datos con variable respuesta.**

- **Test set: conjunto de datos para validar los modelos**

- **Clasificación pública: sobre una parte del test set**

- **Clasificación privada: otra parte del test set no utilizada hasta la finalización**

Kaggle, referencia para el análisis predictivo

- 200.000 miembros registrados
- 400 retos (250 son prácticas de cursos de instituciones académicas)
 - Patrocinados por empresas para resolver un problema real
 - Organizados por instituciones académicas (congresos, investigación)
 - Promocionados por Kaggle (conocimiento)

Kaggle, referencia para el análisis predictivo

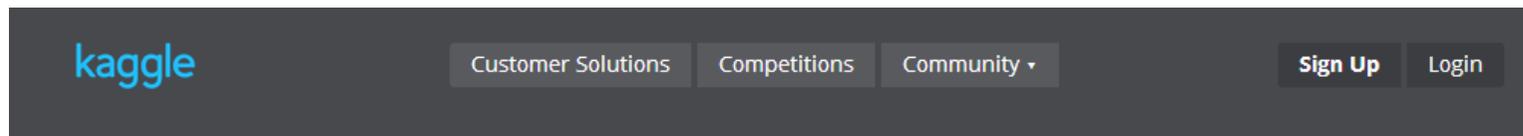
- Puntos en función del número de participantes y de la posición alcanzada.
- Los puntos se van acumulando mediante una fórmula que tiene en cuenta el tiempo.

$$\text{Competition Points} = \frac{100000}{\# \text{ Team Members}} (\text{Team Rank})^{-0.75} \log_{10}(\# \text{ Teams}) \frac{2 \text{ years} - \text{time elapsed since deadline}}{2 \text{ years}}$$

Kaggle, referencia para el análisis predictivo

- Ofertas de trabajo: 700 en dos años
- Algunas ligadas a ranking global o de alguna competición
- Retos específicos para seleccionar personal:
 - WalMart
 - Facebook

Kaggle, referencia para el análisis predictivo



Walmart Recruiting - Store Sales Forecasting

Thursday, February 20, 2014

Jobs • 694 teams

Monday, May 5, 2014

Finished

- Dashboard
- Home
 - Data
 - Make a submission
- Information
 - Description
 - Evaluation
 - Rules
 - Prizes
 - Timeline
- Forum
- Leaderboard
 - Public
 - Private

Competition Details » [Get the Data](#) » [Make a submission](#)

Use historical markdown data to predict store sales

One challenge of modeling retail data is the need to make decisions based on limited history. If Christmas comes but once a year, so does the chance to see how strategic decisions impacted the bottom line.



Kaggle, referencia para el análisis predictivo

The screenshot shows the Kaggle website interface. At the top, there is a navigation bar with the Kaggle logo, links for Customer Solutions, Competitions, and Community, and buttons for Sign Up and Login. Below this, the main content area features a competition card for "Facebook Recruiting III - Keyword Extraction". The card includes a Facebook logo, the competition title, a "Finished" status bar, and dates: "Friday, August 30, 2013" and "Friday, December 20, 2013". It also indicates "Jobs • 367 teams". A sidebar on the left contains navigation options: Dashboard, Home, Data, Make a submission, Information, Forum, and Leaderboard. The main content area displays the competition details, including a breadcrumb trail: "Competition Details » Get the Data » Make a submission". The primary text reads: "Identify keywords and tags from millions of text questions". Below this, a paragraph explains the competition's purpose: "Looking for a data science position at Facebook? After two successful prior Kaggle competitions, Facebook continues their mission to identify the best data scientists and software engineers that Kaggle has to offer. In this third installment, they seek candidates who have experience text mining large amounts of data." At the bottom of the main content area, there is a row of ten decorative tags with various patterns and colors.

Kaggle, referencia para el análisis predictivo

[Sign Up](#) [Login](#)

Predicting unemployment in the Great Recession

Monday, September 23, 2013 Knowledge • 84 teams Friday, December 6, 2013

Finished

Dashboard

- Home ↑
- Data ☰
- Make a submission ✔

Information i

- Description
- Evaluation
- Rules
- Prizes

Forum 💬

Leaderboard ☰

- Public
- Private

Competition Details » [Get the Data](#) » [Make a submission](#)

This competition is private-entry. You can view but not participate.

Stats 202 Prediction Challenge.

Who can participate?

This challenge is restricted to students enrolled in [Stats 202](#) at Stanford University in the fall of 2013.

The data

We will use the National Longitudinal Study of Youth (NLSY79). This landmark study published by the National Bureau of Labor Statistics has followed a cohort of baby boomers since 1979, recording various data on employment, education, poverty, family, attitudes, etc.

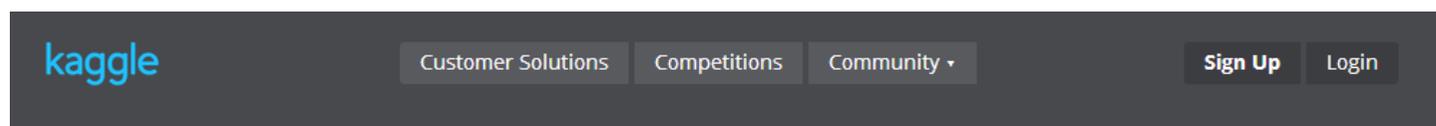
What is your goal?

Based on interviews spanning from 1979 to 2006, you will be tasked with predicting the number of weeks that each person was unemployed during 2010, at the peak of the Great Recession.

Leaderboard

1. GobbleGobble
2. Bryan
3. Jim Monteleone
4. DMFK
5. mudkips
6. Steven Balough

Kaggle, referencia para el análisis predictivo



Deloitte.

As the World Churns

Tuesday, October 22, 2013

\$70,000 • 37 teams

Saturday, December 21, 2013

Finished

- Dashboard
- Home 
- Data 
- Make a submission 
- Information 
 - Description
 - Evaluation
 - Rules
 - Prizes
 - Timeline
 - Winners
- Leaderboard 
 - Public
 - Private

[Leaderboard](#)

Competition Details » [Get the Data](#) » [Make a submission](#)

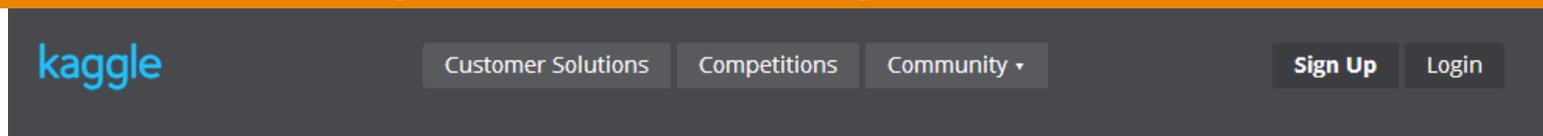
 **This competition is private-entry.** You can view but not participate.

Predict which customers will leave an insurance company in the next 12 months.

Understanding customer loyalty is an important part of any business. The ability to predict ahead of time when a customer is likely to churn can enable early intervention processes to be put in place, and ultimately a reduction in customer churn. This competition seeks a solution for predicting which current customers of an insurance company will leave in 12 months time, and when.

This competition is now closed to new entrants.

Kaggle, referencia para el análisis predictivo



MasterCard - Data Cleansing Competition

Finished

Thursday, July 25, 2013

\$100,000 • 6 teams

Wednesday, August 7, 2013

- Dashboard
- Home
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 - Make a submission
- Information
 - Description
 - Rules
 - Prizes
 - About the Sponsor
- Leaderboard
 - Public
 - Private

Competition Details » [Get the Data](#) » [Make a submission](#)

 **This competition is private-entry.** You can view but not participate.

Improve the quality of information within transaction data

This is a private, invitation-only competition. The relevant information is provided only to contestants. The competition is closed to new entrants.

Qualification for future private competitions is based solely on objective leaderboard performance in competitions.

Kaggle, referencia para el análisis predictivo

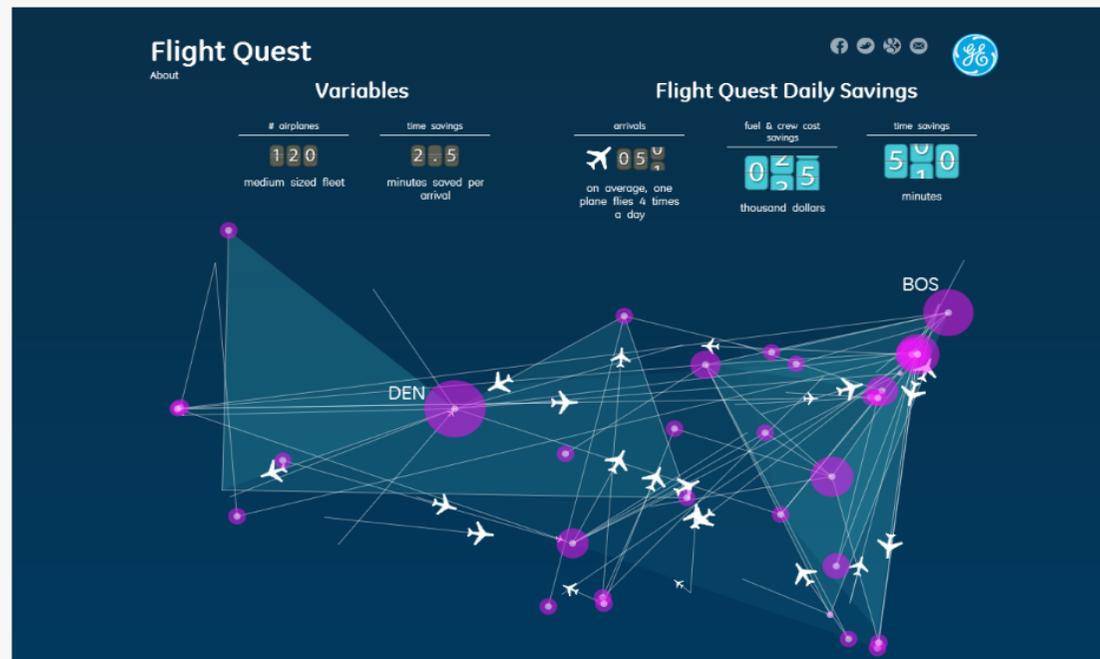
powered by kaggle

sign out



josé a. guerrero flight quest phase 2 | 1 hospital quest

Congratulations to our Flight Quest Phase 2 [winners](#)! In this challenge, participants created models that better optimize flight paths to help airlines reduce costs, avoid bad weather, and get to their destinations on time. [See the challenge.](#)



Kaggle, referencia para el análisis predictivo

kaggle

Customer Solutions

Competitions

Community ▾

Sign Up

Login



Allstate Purchase Prediction Challenge

Finished

Tuesday, February 18, 2014

\$50,000 • 1,571 teams

Monday, May 19, 2014

Dashboard

Home

Data

Make a submission

Information

Description

Evaluation

Rules

Prizes

Timeline

Forum

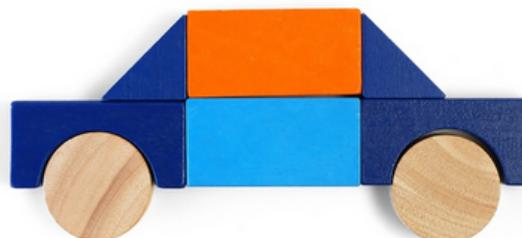
Leaderboard

Public

Private

Competition Details » [Get the Data](#) » [Make a submission](#)

Predict a purchased policy based on transaction history



Kaggle, referencia para el análisis predictivo

kaggle

Customer Solutions

Competitions

Community ▾

Sign Up

Login

Genentech
A Member of the Roche Group

Flu Forecasting

Finished

Thursday, December 19, 2013

\$125,000 • 50 teams

Monday, March 3, 2014

Dashboard

Home

Data

Make a submission

Information

Description

Evaluation

Rules

Prizes

About Genentech

Enter the Competition

Timeline

Winners

Leaderboard

Public

Private

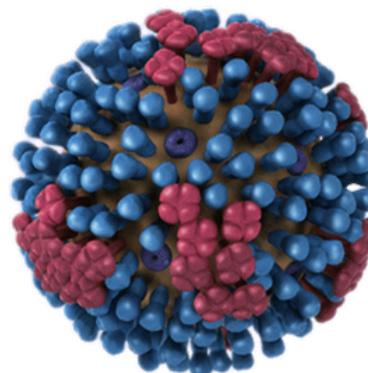
Leaderboard

Competition Details » [Get the Data](#) » [Make a submission](#)



This competition is private-entry. You can view but not participate.

Predict when, where and how strong the flu will be



Kaggle, referencia para el análisis predictivo

[Sign Up](#) [In the News](#) [Judging Panel](#) [Visit HPN](#)



- Dashboard
- Home
 - Data
- Information
 - Description
 - Evaluation
 - Rules
 - Dos and Don'ts
 - FAQ
 - Milestone Winners
 - Timeline
- Forum
- Leaderboard
 - Public
 - Private

[Leaderboard](#)



Improve Healthcare, Win \$3,000,000.

Identify patients who will be admitted to a hospital within the next year using historical claims data. (Enter by 06:59:59 UTC Oct 4 2012)

Please note: This competition is over! The leaderboard now displays the final results.

Kaggle, referencia para el análisis predictivo

Kaggle Rankings

Sorted by Rank (Beta)

<p>1st 685,783 pts</p>  <p>José A. Guerrero 20 competitions Spain</p>	<p>2nd 584,479 pts</p>  <p>Leustagos 28 competitions Belo Horizonte Brazil</p>	<p>3rd 569,575 pts</p>  <p>BreakfastPirate 18 competitions Indianapolis United States</p>	<p>4th 541,648 pts</p>  <p>Owen 16 competitions NYC United States</p>	<p>5th 447,273 pts</p>  <p>Naokazu Mizuta 28 competitions Tokyo Japan</p>
<p>1st 821,194 pts</p>  <p>Owen 26 competitions NYC United States</p>	<p>2nd 539,227 pts</p>  <p>BreakfastPirate 25 competitions Indianapolis United States</p>	<p>3rd 498,581 pts</p>  <p>Leustagos 36 competitions Belo Horizonte Brazil</p>	<p>4th 496,081 pts</p>  <p>David Thaler 14 competitions Seattle United States</p>	<p>5th 457,483 pts</p>  <p>José A. Guerrero 28 competitions Spain</p>

Estado del Arte

- ¿Cómo son los datos facilitados en este tipo de problemas y que tamaño tienen?
- ¿Qué herramientas son las que se usan más frecuentemente?
- ¿Cuál es el perfil de las personas que se dedican a resolverlos?
- ¿Qué técnicas son las más utilizadas?

Estado del Arte: Datos

- 10M – 250 M Registros
- 100 – 10000 variables
- 1 – 20 Gb
- Microarrays: Variables:Registros -> 10:1
- Raw data vs blind data

Estado del Arte: Datos

- Información texto:
- Corpus (construido o externo)
- Tf-idf (Term frequency – Inverse document frequency)
- N-gramas: palabras próximas aportan información contextual
- Correctores gramaticales, ortográficos, traductores, análisis de sentimiento
- Aproximaciones bayesianas
- Cadenas de Markov

Estado del Arte: Datos

- **Web 1T 5-gram Version 1 (Google 2006)**
- **Construido a partir de 95.000 millones de frases con más de 1.000.000.000.000 de palabras.**
 - **13.5 M 1-gramas**
 - **314 M bi-gramas**
 - **977 M tri-gramas**
 - **1.300 M 4-gramas**
 - **1.174 M 5-gramas**

Estado del Arte: Datos

▣ CIFAR10 60.000 imágenes en 10 categorías

airplane



automobile



bird



cat



deer



dog



frog



horse



ship



truck



Estado del Arte: Datos

- MNIST (Mixed Nat. Institute of Standards and Technology) 70.000 dígitos



Estado del Arte: Datos

UCI Machine Learning Repository



UCI Machine Learning Repository
Center for Machine Learning and Intelligent Systems

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Welcome to the UC Irvine Machine Learning Repository!

We currently maintain 295 data sets as a service to the machine learning community. You may [view all data sets](#) through our searchable interface. Our [old web site](#) is still available, for those who prefer the old format. For a general overview of the Repository, please visit our [About page](#). For information about citing data sets in publications, please read our [citation policy](#). If you wish to donate a data set, please consult our [donation policy](#). For any other questions, feel free to [contact the Repository librarians](#). We have also set up a [mirror site](#) for the Repository.

Supported By:  In Collaboration With: 

<p>Latest News:</p> <p>2013-04-04: Welcome to the new Repository admins Kevin Bache and Moshe Lichman!</p> <p>2010-03-01: Note from donor regarding Netflix data</p> <p>2009-10-16: Two new data sets have been added.</p> <p>2009-09-14: Several data sets have been added.</p> <p>2008-07-23: Repository mirror has been set up.</p> <p>2008-03-24: New data sets have been added!</p> <p>2007-06-25: Two new data sets have been added: UJI Pen Characters, MAGIC Gamma Telescope</p> <hr/> <p>Featured Data Set: Chess (King-Rook vs. King-Pawn)</p>  <p>Task: Classification Data Type: Multivariate # Attributes: 36 # Instances: 3196</p> <p>King+Rook versus King+Pawn on a7 (usually abbreviated KRKPA7).</p>	<p>Newest Data Sets:</p> <p>2014-07-25:  REALDISP Activity Recognition Dataset</p> <p>2014-07-22:  Parfume Data</p> <p>2014-06-18:  Gesture Phase Segmentation</p> <p>2014-06-12:  Parkinson Speech Dataset with Multiple Types of Sound Recordings</p> <p>2014-06-01:  Tennis Major Tournament Match Statistics</p> <p>2014-05-29:  BlogFeedback</p> <p>2014-05-20:  StoneFlakes</p> <p>2014-05-20:  Bach Choral Harmony</p> <p>2014-05-03:  Diabetes 130-US hospitals for years 1999-2008</p> <p>2014-04-11:  Twitter Data set for Arabic Sentiment Analysis</p>	<p>Most Popular Data Sets (hits since 2007):</p> <p>592577:  Iris</p> <p>413794:  Adult</p> <p>353901:  Wine</p> <p>288750:  Breast Cancer Wisconsin (Diagnostic)</p> <p>287233:  Car Evaluation</p> <p>231302:  Abalone</p> <p>191103:  Poker Hand</p> <p>187105:  Wine Quality</p> <p>166884:  Heart Disease</p> <p>164241:  Forest Fires</p>
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Estado del Arte: Herramientas

▣ www.r-project.org



About R
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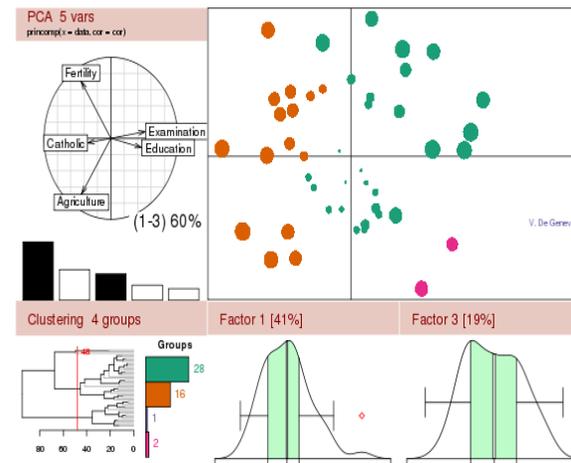
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The R Project for Statistical Computing



Getting started:

- R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To [download R](#).
- If you have questions about R like how to download and install the software, or what the license terms are, please read our [answers to frequently asked questions](#) before you

News :

- **R version 3.1.0** (Spring Dance) has been released on 2014-04-10.
- **R version 3.0.3** (Warm Puppy) has been released on 2014-03-06.
- [The R Journal Vol.5/2](#) is available.
- [useR! 2013](#), took place at the University of Castilla-La Mancha, Albacete, Spain, July 10-12 2013.
- **R version 2.15.3** (Security Blanket) has been released on 2013-03-01.

Estado del Arte: Herramientas

- **R : Lenguaje interpretado de propósito general**
- **Más de 5.500 paquetes disponibles**
- **Facilidad de uso interactivo**
- **Puntos débiles:**
 - **Gestión de la memoria**
 - **Paralelización**
- **Paquetes clave:**
 - **data.table**
 - **Bigmemory**
 - **foreach**

Estado del Arte: Herramientas

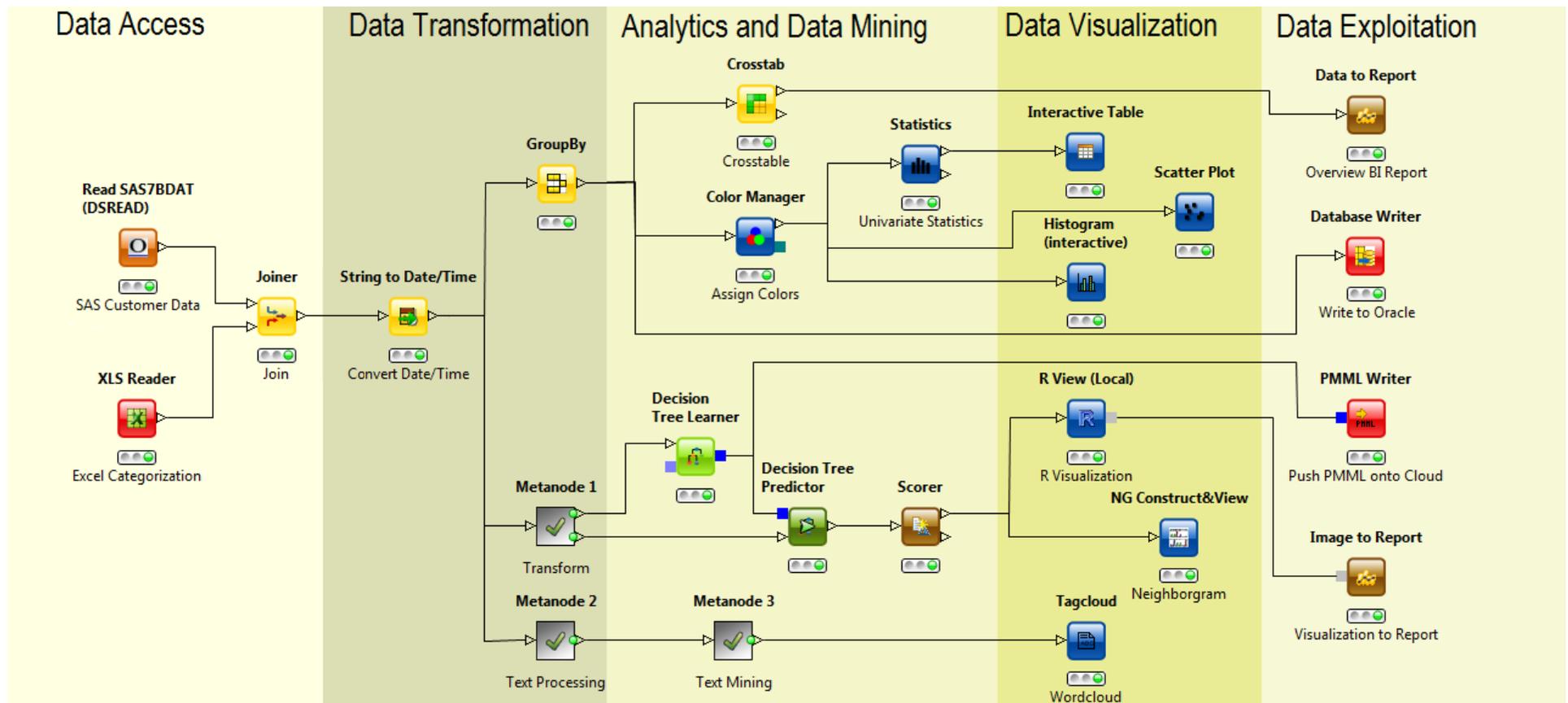


Estado del Arte: Herramientas

- **Python: Lenguaje compilado**
- **Orientado a objetos**
- **Eficiente gestión de memoria**
- **Paralelización**
- **Menos paquetes disponibles**
- **Mejor para textos e imágenes que R**
- **Referencia para NN (pylearn2)**

Estado del Arte: Herramientas

□ www.knime.org (Konstanz Information Miner)



Estado del Arte: Herramientas



Estado del Arte: Herramientas



Elmer Fudd
Vorpal Rabbit



(Fast & Incremental Learning)



John Langford

Estado del Arte: Herramientas

Sofia – ML (Fast & incremental Learning)

Google™

“This implementation is especially well suited to large, sparse learning problems, and can be used to learn linear SVM models on hundreds of thousands or **millions of data points using a only fraction of a second of CPU time for training on a normal laptop**”.

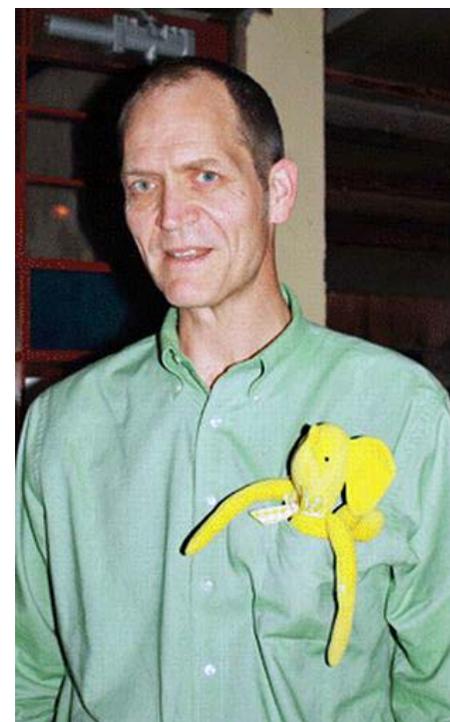


David Sculley

Estado del Arte: Herramientas



Google™



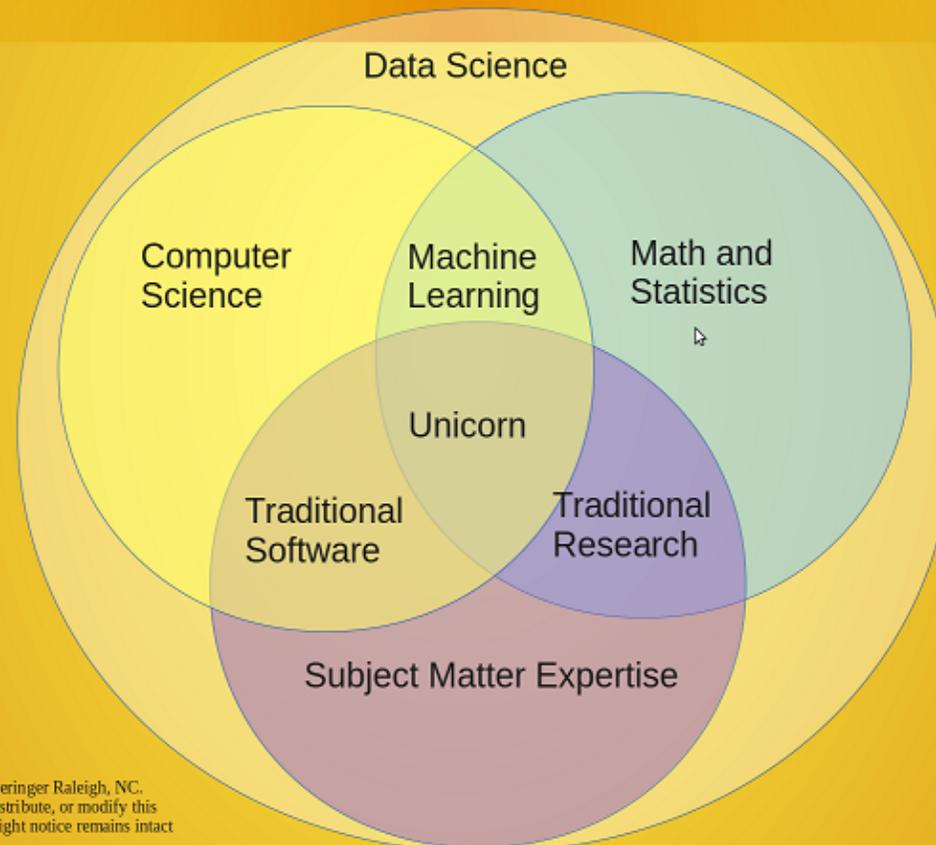
ML para Big Data

Aplicaciones distribuidas

Doug Cutting

Estado del Arte: Profesionales

Data Science Venn Diagram v2.0



Estado del Arte: Estadística Multivariable - Machine Learning



Estado del Arte: Estadística Multivariable

- **Hipótesis**
 - Normalidad
 - No correlación de errores
 - Homocedasticidad
 - No colinealidad

 - **Bondad del ajuste:**
 - Grados de libertad
 - Descomposición de la varianza
 - Estimaciones puntuales y por IC de errores y coeficientes
 - Contraste de hipótesis
- X , Y

Estado del Arte: Estadística Multivariable

■ DEBILIDADES

- Asumir hipótesis sobre la distribución de los datos
- Mal manejo de la colinealidad
- Convergencia y estabilidad de las soluciones
- La limitación en la forma funcional del modelo
- Alta sensibilidad a observaciones extremas
- Mal manejo de observaciones desconocidas
- Problemas de escalabilidad
- Mal manejo variables >> casos



Estado del Arte: Estadística Multivariable

■ FORTALEZAS

- Reproducibles
- Rápidos de ajustar
- Modelos interpretables (expresión analítica)
- Importancia relativa de variables
- Inferencia (bondad de ajuste, coeficientes)



Estado del Arte: Machine Learning

- **Arthur Samuel (1959):**
 - "Field of study that gives computers the ability to learn without being explicitly programmed"

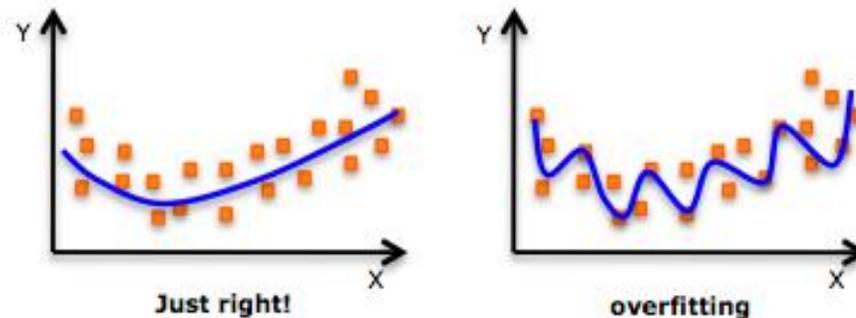
- **Tom M. Mitchell (1997):**
 - "A computer program is said to learn from experience E with respect to some class of tasks T and performance measure P , if its performance at tasks in T , as measured by P , improves with experience E ".

Estado del Arte: Sobreajuste

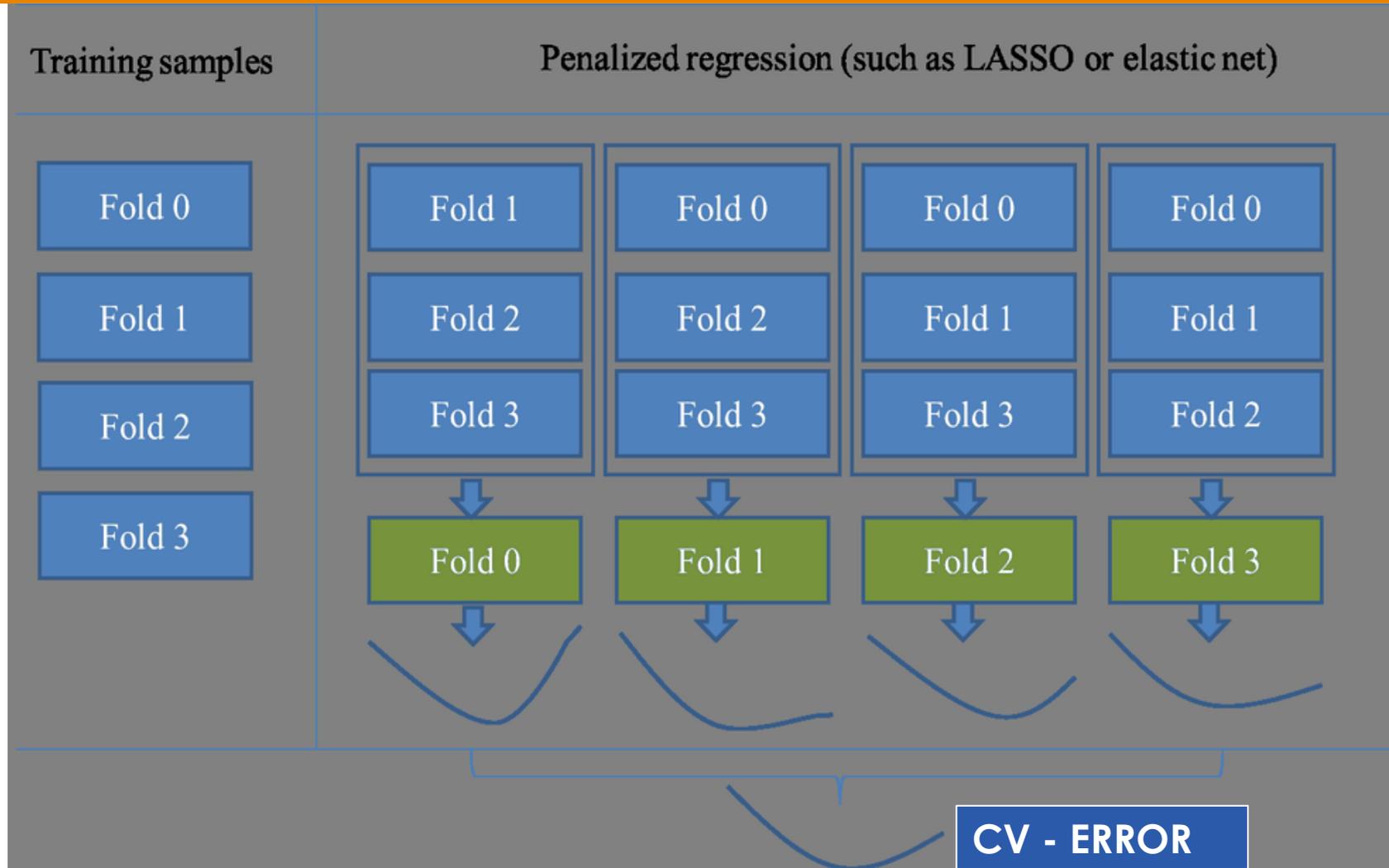


Estado del Arte: Sobreajuste

- El modelo ajusta el error aleatorio en vez de la verdadera relación entre los predictores y la respuesta
- Modelos complejos (muchos parámetros en relación con observaciones)
- Pocos grados de libertad
- Cross-validación, regularización



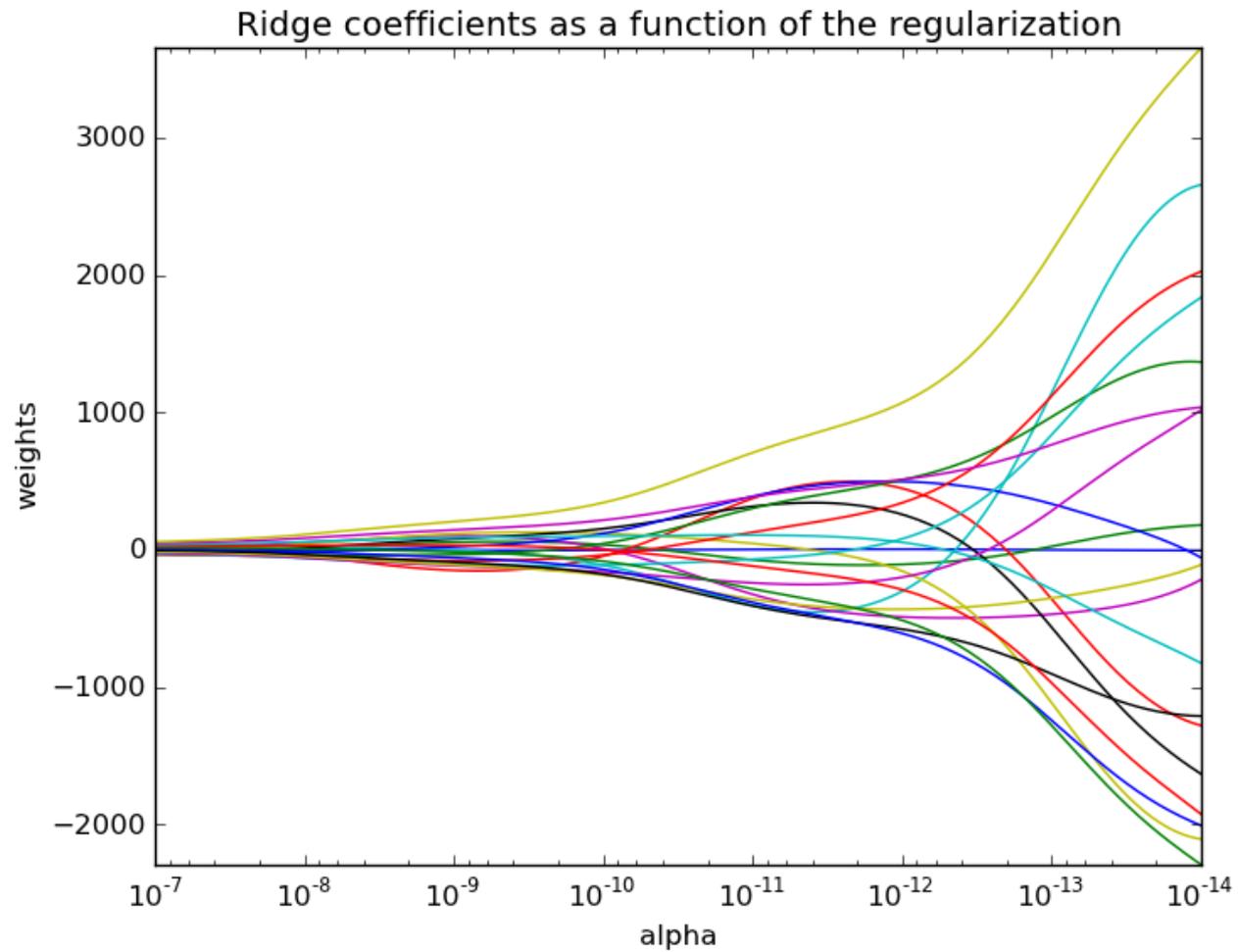
Estado del Arte: Validación cruzada



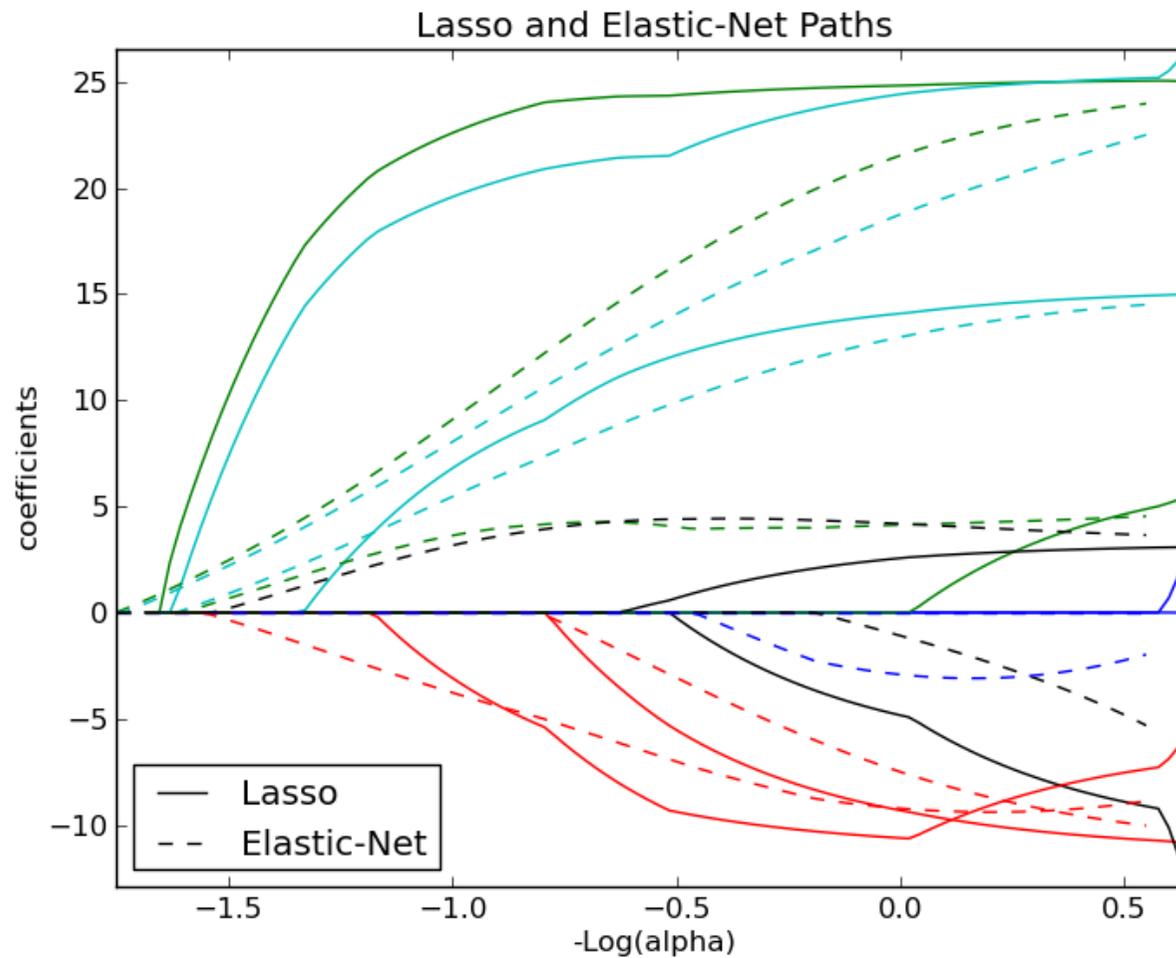
Estado del Arte: Regularización

- **Introducción en el modelo restricciones para evitar el sobreajuste**
- **Penalizaciones a la complejidad del modelo**
- **Regresión lineal:**
 - **Lambda, factor de penalización sobre los coeficientes:**
 - **L1 (Lasso) (1996) R. Tibshirani.**
 - **L2 (Ridge) (1970) A. Tikhonov, A.E. Hoerl**

Estado del Arte: Regularización



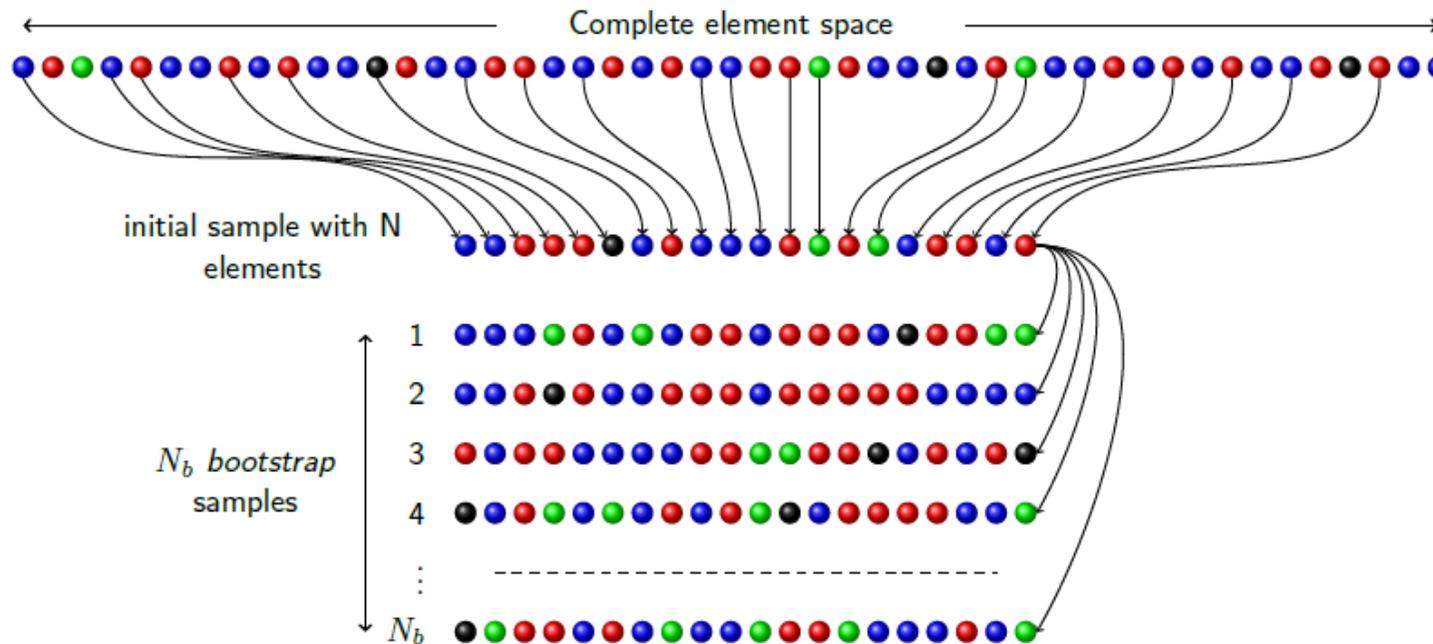
Estado del Arte: Regularización



Estado del Arte: Reducción dimensionalidad

- **PCA (Análisis Componentes Principales)**
- **Stepwise**
- **Regularización Lasso**
- **Métodos de permutación**
- **Random Forest stepwise**
- **Muestreo de variables y ensamblado**
- **K-means**

Estado del Arte: Bootstrapping (remuestreo)

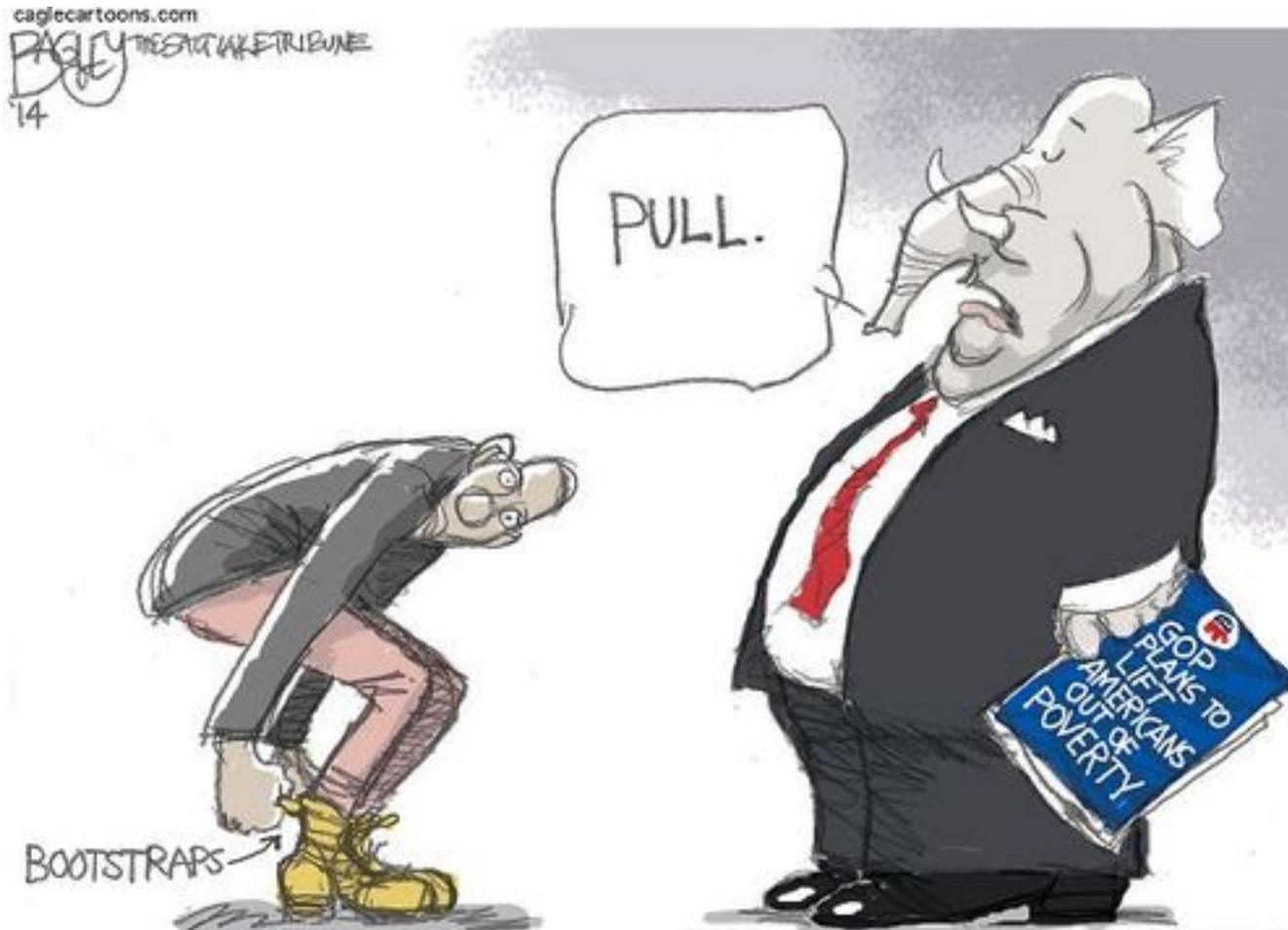


Theorem (B. Efron, Ann. Statist. 1979)

When N tend to infinity, the distribution of average values computed from bootstrap samples is equal to the distribution of average values obtained from ALL samples with N elements which can be constructed from the complete space. Thus the width of the distribution gives an evaluation of the sample quality.

Estado del Arte: Bootstrapping (remuestreo)

'To lift himself up by his bootstraps'



Estado del Arte: Técnicas Machine Learning

- Según conocimiento que se tiene de la variable respuesta:
- Supervisados:
 - Conjunto de datos etiquetados (clasificación) o medidos (regresión) para el training
- No supervisados:
 - No necesario las clases a las que pertenecen las observaciones
 - Tampoco cuántas clases hay en total
- Semisupervisados:
 - Elevado coste de la clasificación manual del training set
 - Label propagation (asignación iterativa de etiquetas)
 - Manifolds (hipótesis sobre dimensionalidad espacio observaciones)

Estado del Arte: Random Forest (2001)



Adele Cutler



Leo Breiman



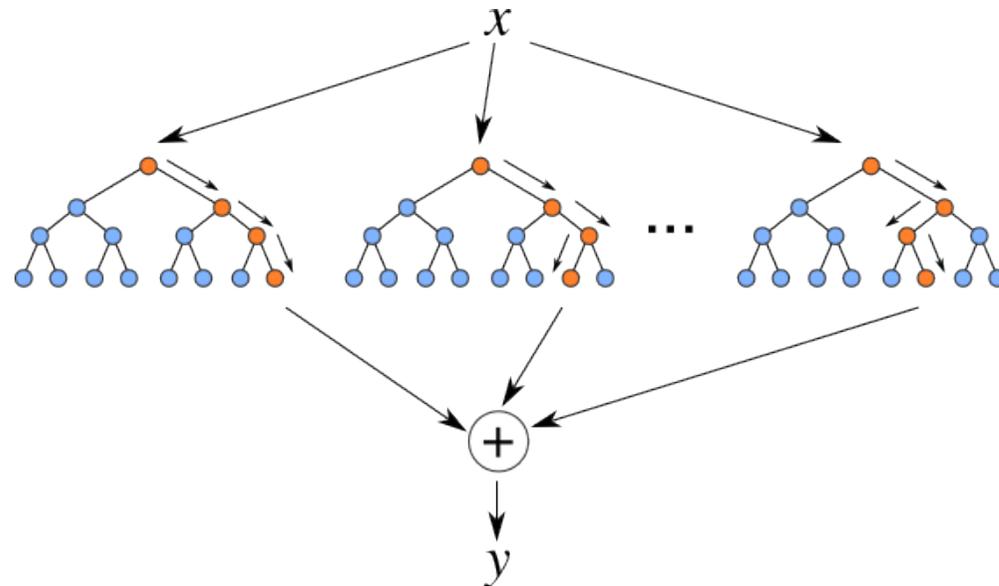
Phil Cutler

Estado del Arte: Random Forest (2001)

- Ensamblado de árboles contruidos con bootstrapping
- Regresión o clasificación
- En cada nodo se selecciona un subconjunto de variables y para ellas se determina el mejor punto de corte
- No causan sobreajuste
- Detectan interacciones muy fractalizadas
- Pueden utilizarse para imputación de valores perdidos
- Puede inducirse una distancia entre casos

Estado del Arte: Random Forest (2001)

- OOB error es generalizable
- Importancia de variables por permutación
- Categorías son tratadas como numéricas
- Pueden agregarse
- Buen manejo outliers



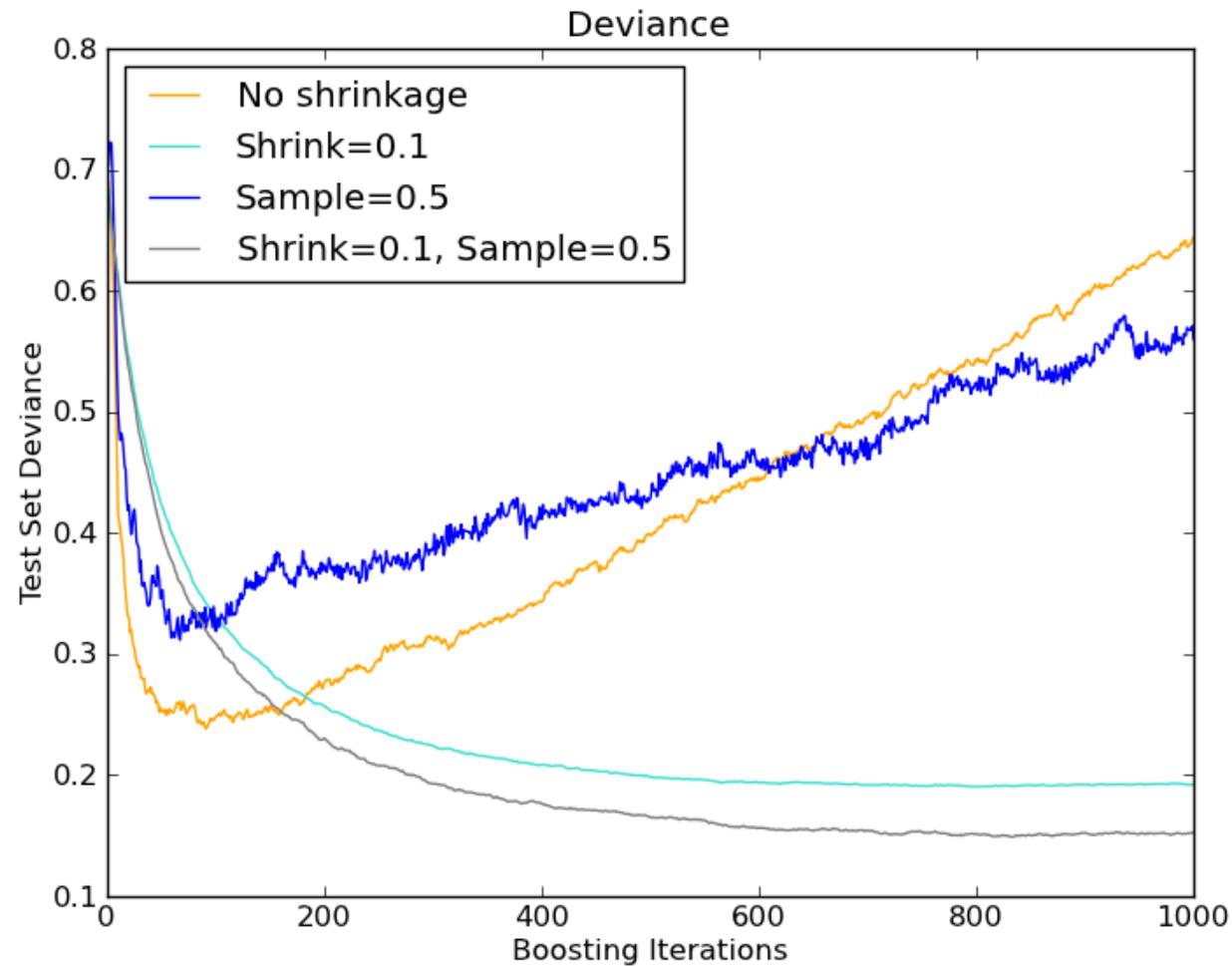
Estado del Arte: Gradient Boosting (1999)

- Jerome Friedman
- Modelo ensamblado de otros modelos de una forma iterativa
- Para cualquier función error diferenciable
- Se inicia el modelo con una constante
- Se calculan los pseudoresiduos: menos el gradiente de la función error en las estimaciones actuales.
- Se ajusta un modelo a los pseudoresiduos
- Se actualizan las estimaciones en la dirección de dicho modelo eligiendo un paso que minimice el error.

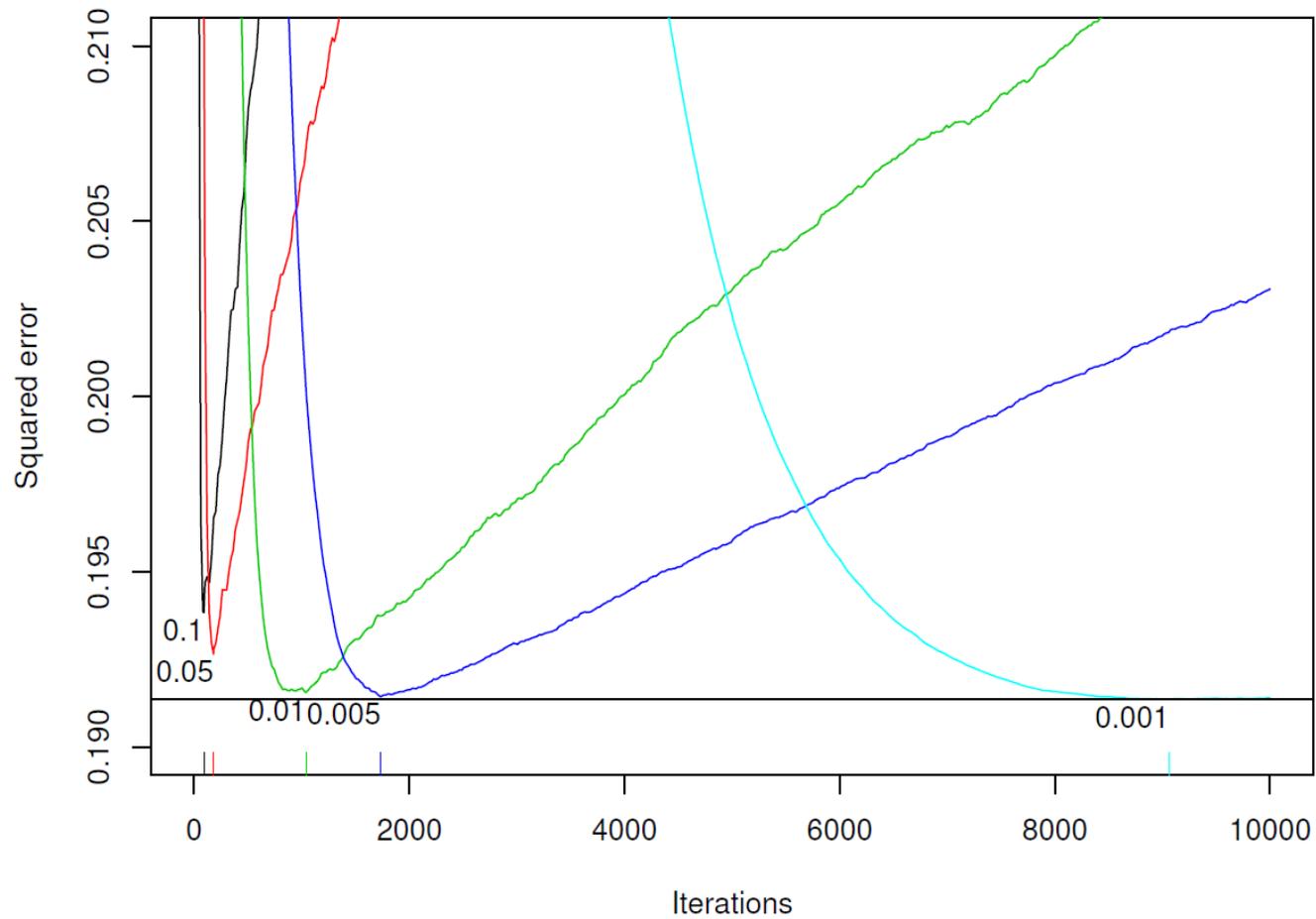
Estado del Arte: Gradient Boosting

- **Regularizaciones:**
 - **Interaction – depth (Número de niveles del árbol)**
 - **Mínimo número de observaciones en nodos finales**
 - **Shrinkage: constante que limita cada paso en la dirección del gradiente**
 - **Bag fraction: Fracción de submuestreo.**
 - **Criterio de parada por cross-validación**

Estado del Arte: Gradient Boosting (gbm)



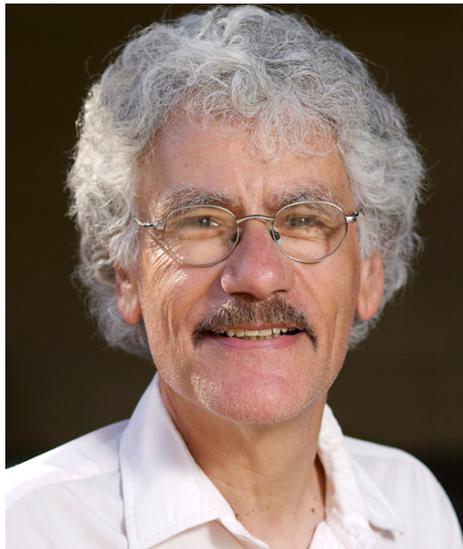
Estado del Arte: Gradient Boosting (gbm)



Estado del Arte: Gradient Boosting



STANFORD
UNIVERSITY



Jerome Friedman



Trevor Hastie



Robert Tibshirani

Estado del Arte: Gradient Boosting



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THE NIJ DIRECTOR

[ABOUT ACTING DIRECTOR DR. GREGORY K. RIDGEWAY](#)

[SPEECHES AND REMARKS](#)

About the NIJ Director

The Director is appointed by the President to lead the National Institute of Justice and establish the agency's objectives, guided by the needs of the field and the priorities of the U.S. Department of Justice.

Upon the departure of Director John H. Laub, Deputy Director Greg Ridgeway became Acting Director. ([Read Dr. Laub's farewell message.](#))

On this page you can follow NIJ Directors through their speeches and commentary.

Posted February 12, 2013

Statement on NIJ's Role in the National Dialogue on Gun Violence

Our entire country is talking about gun violence. The recent spate of mass gun



Estado del Arte: Support Vector Machine (SVM)



Corinna Cortes

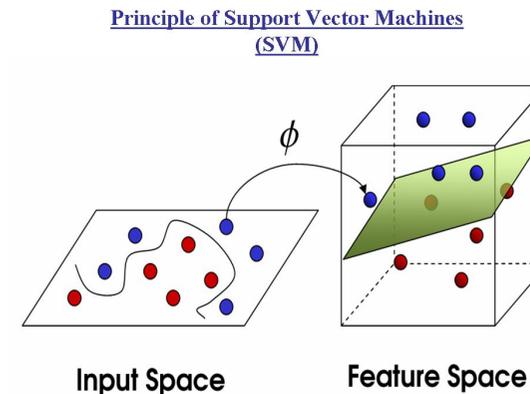
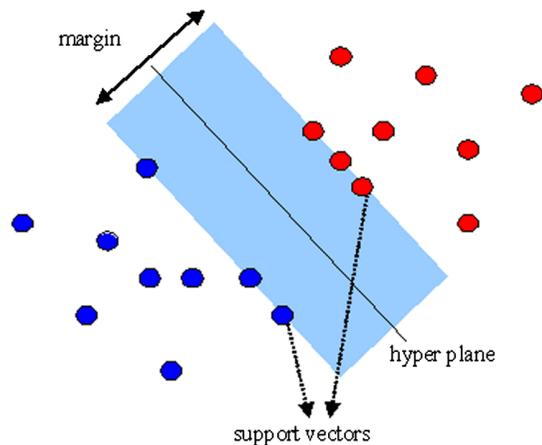
**Vladimir
Vapnik**



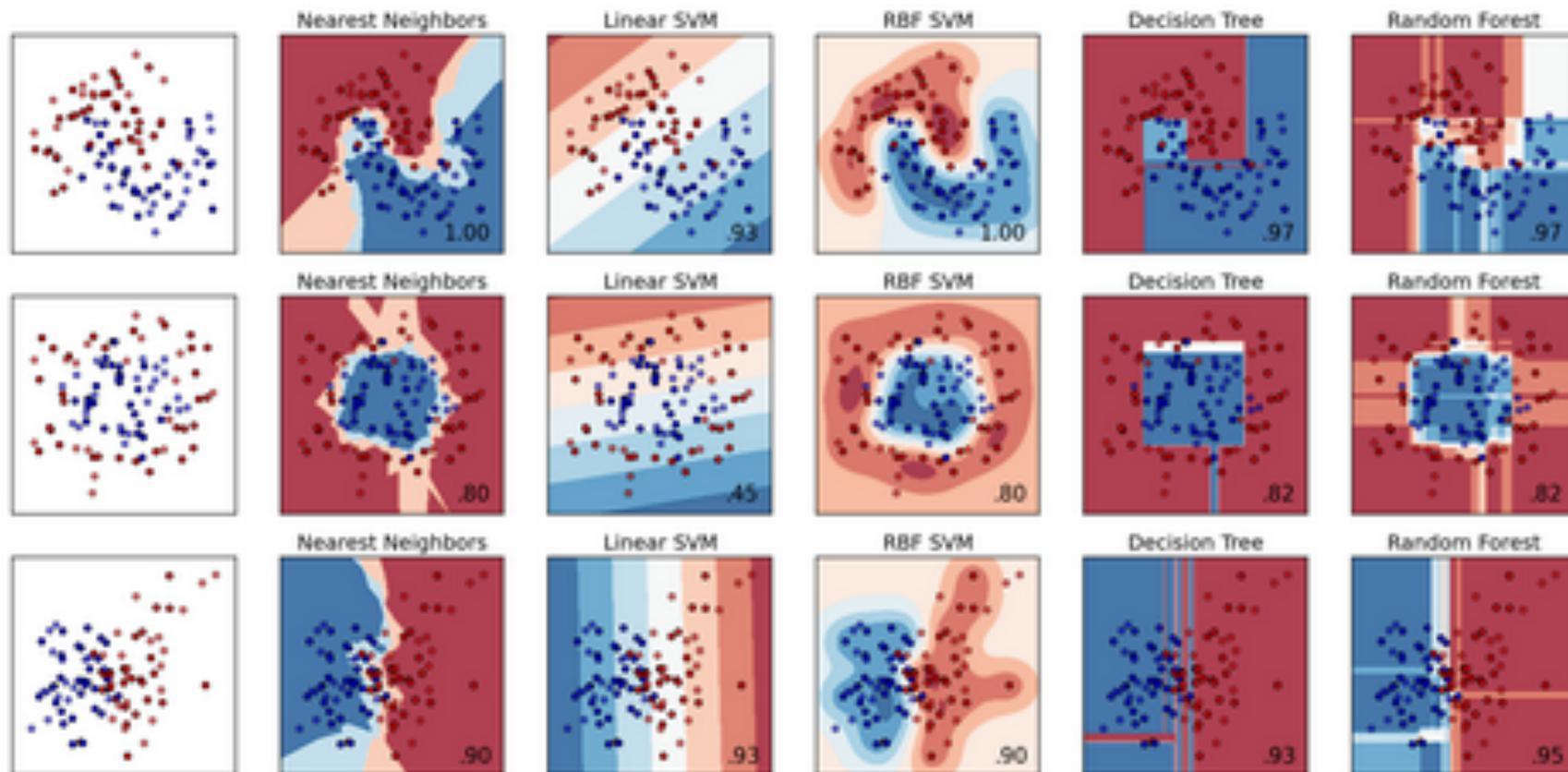
“For 2,000 years, we believed logic was the only instrument for solving intellectual problems. Now, our analysis of machine learning is showing us that to address truly complex problems, we need images, poetry, and metaphors as well”

Estado del Arte: Support Vector Machine (SVM)

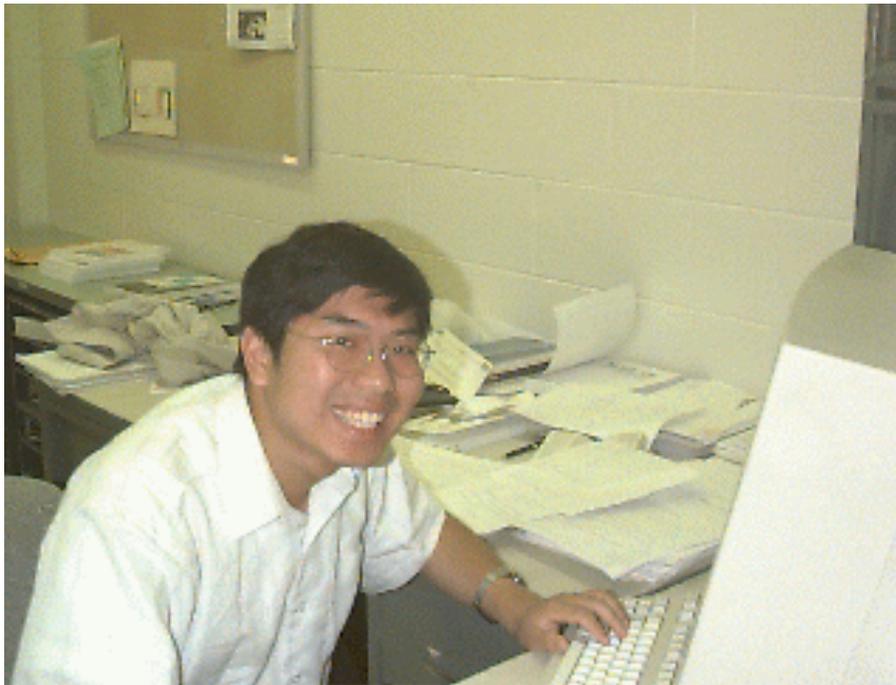
- Hiperplanos con máximo margen
- C: penalización para los casos mal clasificados (Soft margin)
- Mapeo de casos a una dimensión mayor para facilitar la separación: Kernels
- Kernels: lineal, gauss, polinomial
- Extensiones para regresión, clasificación multinomial, ranking



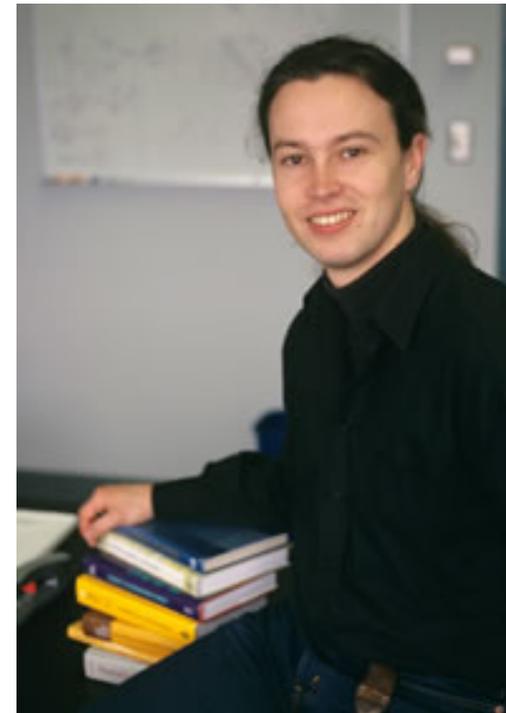
Estado del Arte: Support Vector Machine (SVM)



Estado del Arte: Support Vector Machine (SVM)



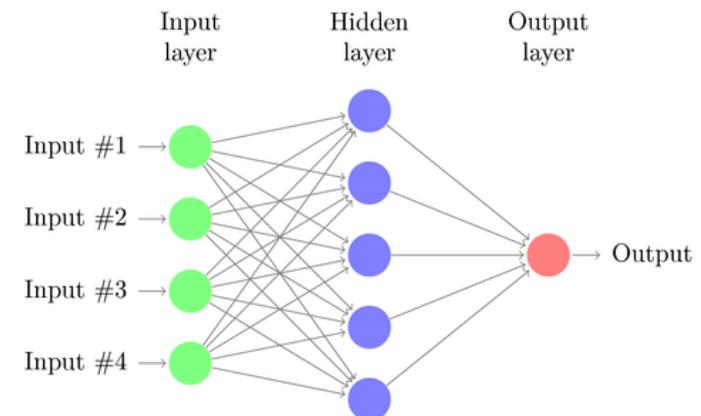
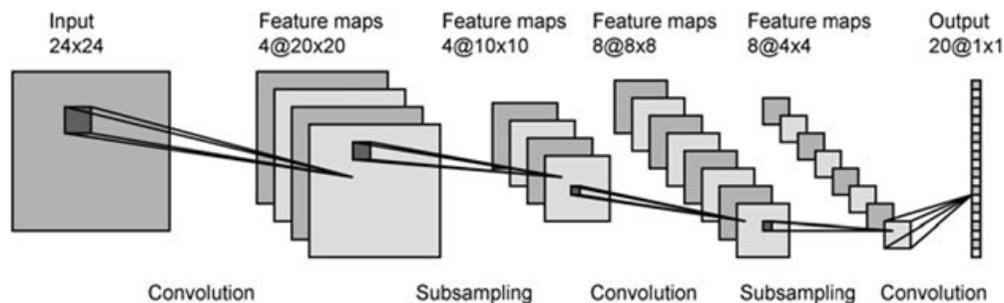
Chih-Jen Lin
LibSVM
LibLinear



Thorsten Joachims
SVMlight

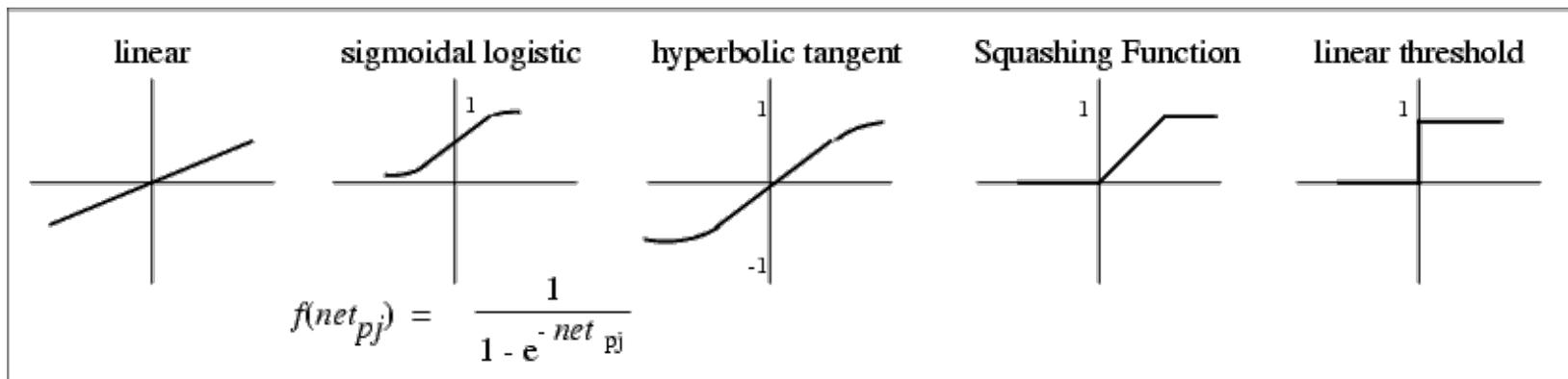
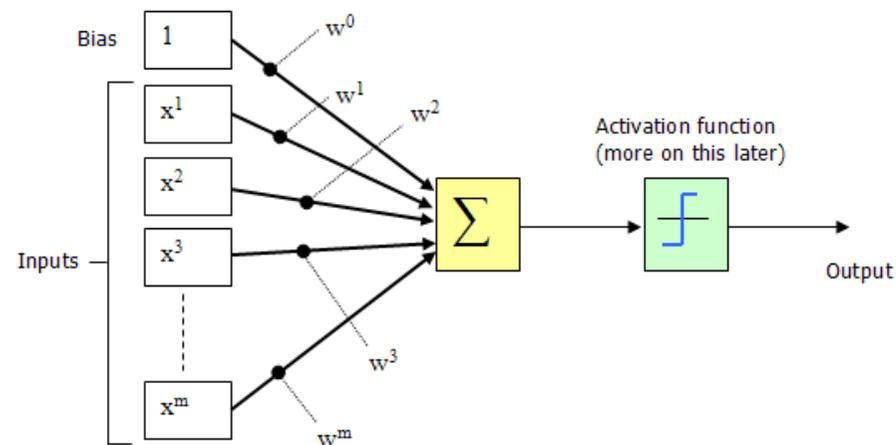
Estado del Arte: Redes neuronales (NN)

- ❑ Optimización multietapa (Back propagation)
- ❑ Teorema de aproximación universal: Una capa es suficiente para aproximar cualquier función continua en un conjunto compacto bajo ciertas condiciones de la función de activación.
- ❑ MLP: Multilayer Perceptron
- ❑ CNN: Convolution Neural Network



Estado del Arte: Redes neuronales (NN)

■ Funciones de activación y de transferencia



Estado del Arte: Redes neuronales (NN)



Geoffrey Hinton

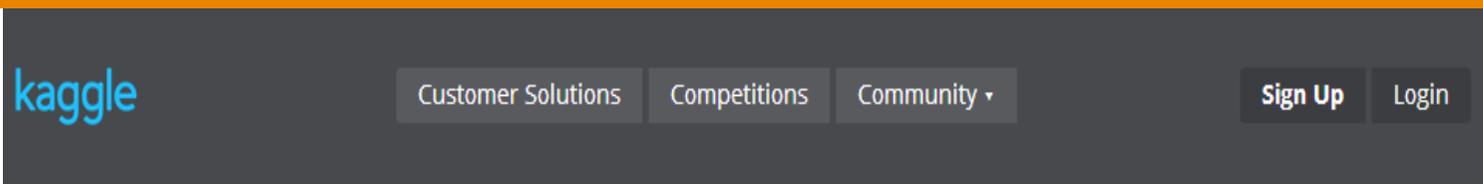


**Ian Goodfellow
(pylearn2)**



Yoshua Bengio

Experiencias



José A. Guerrero

Data Scientist

<http://www.kressala.com/>

MASTER ?

Highest 1st	Current 3rd /176,495
-----------------------	-----------------------------------

579,416.8 points
Joined 3 years ago

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1ST

1st/532

1ST

1st/146

2ND

2nd/50

3RD

3rd/1353

5TH

5th/132

5TH

5th/12

6TH

6th/337

9TH

9th/362

25

Competitions

Experiencias

kaggle

Customer Solutions

Competitions

Community ▾

José A. Guerrero

Logout



Traveling Santa Problem

Finished

Friday, December 14, 2012

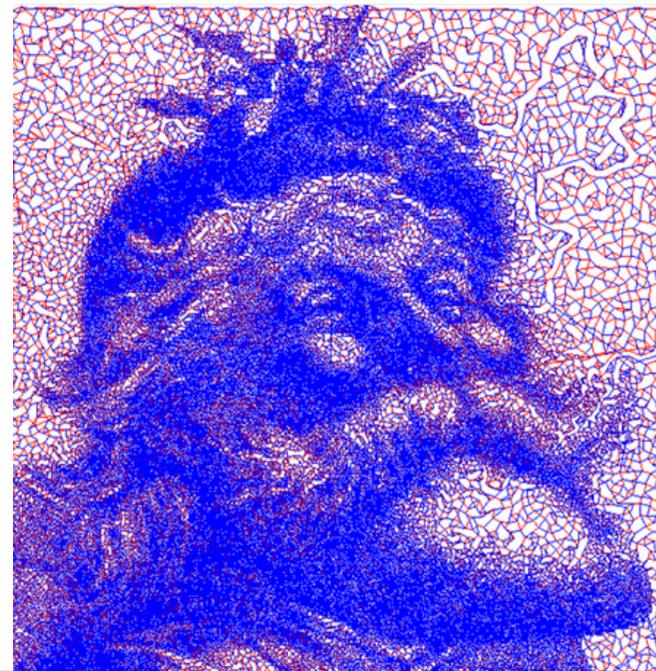
\$3,000 • 355 teams

Saturday, January 19, 2013

150.000 chimeneas

Leaderboard

1. Farmers peeing further
2. wleite
3. Rudolph
4. Olexandr Topchylo
5. TravelingSasquatch
6. kc
7. Leustagos
8. Helsgaun
9. Titericz & Santooma
10. 4259018372



Experiencias


Customer Solutions Competitions Community ▾
José A. Guerrero Logout



Personalize Expedia Hotel Searches - ICDM 2013

Finished

Tuesday, September 3, 2013

\$25,000 • 337 teams

Monday, November 4, 2013

Dashboard ▾

Leaderboard - Personalize Expedia Hotel Searches - ICDM 2013

This competition has completed. This leaderboard reflects the final standings.

See someone using multiple accounts?

[Let us know.](#)

#	Δ1w	Team Name <small>*in the money</small>	Score <small>📊</small>	Entries	Last Submission UTC (Best - Last Submission)
1	-	commendo - part of Opera Solutions <small>👤 *</small> <ul style="list-style-type: none"> Michael Jahrer AndreasToescher 	0.54075	55	Mon, 04 Nov 2013 22:41:11
2	-	Owen <small>*</small>	0.53984	35	Mon, 04 Nov 2013 22:35:38
3	↑4	Jun Wang@UniGe <small>*</small>	0.53839	55	Mon, 04 Nov 2013 23:12:44 (-47.1h)
4	↓1	idle_speculation <small>👤 *</small>	0.53366	46	Mon, 04 Nov 2013 14:20:46 (-14.6h)
5	↑1	bingsu & MLRush & BrickMover <small>👤</small>	0.53102	101	Mon, 04 Nov 2013 22:13:23
6	↓2	J.A. Guerrero	0.53069	48	Mon, 04 Nov 2013 22:16:26

Experiencias

 José A. Guerrero [In the News](#) [Judging Panel](#) [Visit HPN](#)

Dashboard ▾ Private Leaderboard - Heritage Health Prize

This competition has completed. This leaderboard reflects the final standings. [See someone using multiple accounts?](#)
[Let us know.](#)

#	Δ1w	Team Name <small>* in the money</small>	Score	Entries	Last Submission UTC (Best - Last Submission)
1	-	POWERDOT  *	0.461197	671	Thu, 04 Apr 2013 05:12:00 (-12.3d)
2	↑60	EXL Analytics 	0.462247	555	Thu, 04 Apr 2013 00:06:09 (-3.4d)
3	↑15	J.A. Guerrero	0.462417	173	Thu, 04 Apr 2013 06:03:09
4	↑10	PANDA 	0.462644	63	Thu, 04 Apr 2013 01:44:15 (-23.9h)
5	↓3	CombinedPower 	0.463052	286	Thu, 04 Apr 2013 06:15:57 (-173.5d)
6	↓2	Xing Zhao	0.463125	161	Thu, 04 Apr 2013 00:13:08 (-5d)
7	↓4	Ambrosia	0.463133	134	Mon, 10 Dec 2012 20:34:10 (-2.5d)
8	↓3	Areté Associates 	0.463526	112	Sun, 31 Mar 2013 20:54:52 (-226.8d)
9	↓1	Analytics Inside 	0.464170	162	Thu, 04 Apr 2013 00:00:31
10	↓4	Old Dogs With New Tricks 	0.464452	370	Wed, 03 Apr 2013 20:04:56 (-4.7d)
11	↓4	luscus	0.464457	52	Fri, 15 Mar 2013 05:00:27 (-12.2d)
12	↓3	J Analysis	0.464542	165	Thu, 24 Jan 2013 01:22:13 (-37.9d)
13	↓3	Dolphin 	0.464684	555	Thu, 04 Apr 2013 05:37:08 (-22.4d)
14	↓3	Hopkins Biostat 	0.464803	444	Thu, 04 Apr 2013 03:06:25 (-7.6d)

Experiencias

kaggle

Customer Solutions

Competitions

Community ▾

José A. Guerrero

Logout

MathWorks



Packing Santa's Sleigh

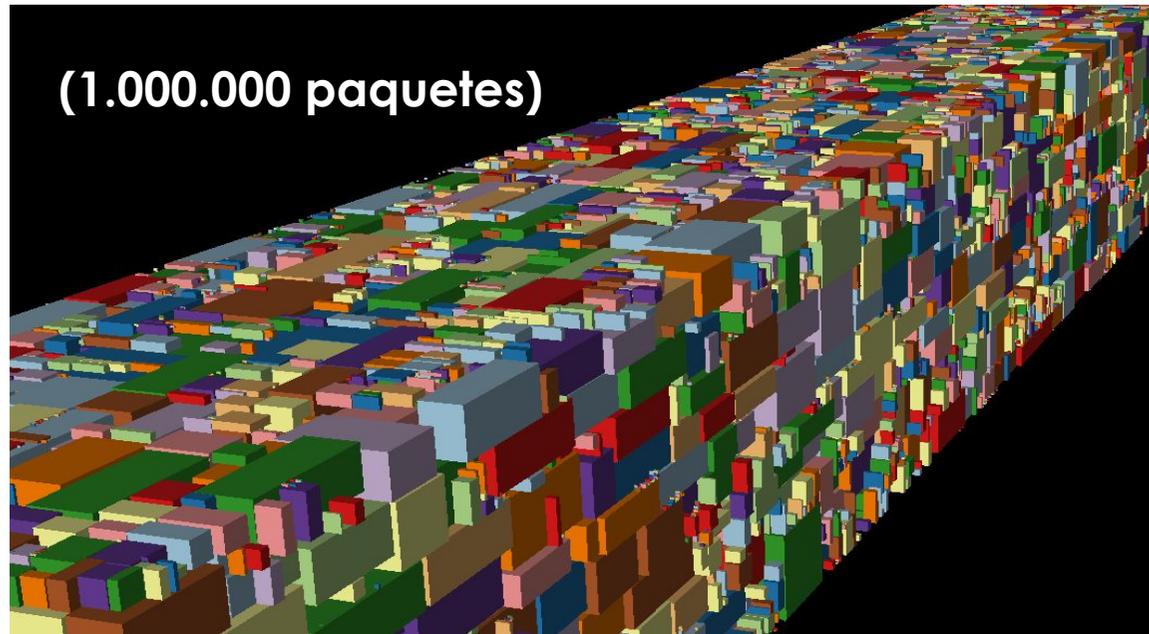
Monday, December 2, 2013

\$10,000 • 362 teams

Finished

Sunday, January 26, 2014

(1.000.000 paquetes)



Experiencias

kaggle

Customer Solutions

Competitions

Community ▾

José A. Guerrero

Logout



Psychopathy Prediction Based on Twitter Usage

Finished

Monday, May 14, 2012

\$1,000 • 111 teams

Friday, June 29, 2012

Dashboard

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Leaderboard

Identify people who have a high degree of Psychopathy based on Twitter usage.

The aim of the competition is to determine to what degree it's possible to predict people with a sufficiently high degree of Psychopathy based on Twitter usage and Linguistic Inquiry.

The organizers provide all interested participants an anonymised dataset of users self assessed psychopathy scores together with 337 variables derived from functions of Twitter information, useage and lingusitc analysis. Psychopathy scores are based on a checklist developed by Professor Del Paulhus at the University of British Columbia.

Experiencias


Customer Solutions Competitions Community ▾
José A. Guerrero Logout



CHALEARN Gesture Challenge 2

Finished
Tuesday, May 8, 2012
\$10,000 • 31 teams
Tuesday, September 11, 2012

Dashboard ▾

Leaderboard - CHALEARN Gesture Challenge 2

This competition has completed. This leaderboard reflects the final standings.

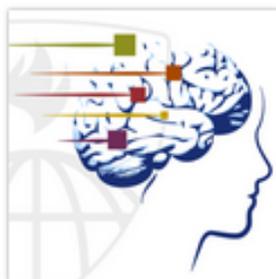
See someone using multiple accounts?
[Let us know.](#)

#	Δ1w	Team Name <small>* in the money</small>	Score <small>📊</small>	Entries	Last Submission UTC (Best - Last Submission)
1	↑20	alfnie *	0.07099	7	Sat, 08 Sep 2012 05:09:02
2	↑8	Joewan *	0.14476	58	Mon, 10 Sep 2012 02:48:33
3	-	Wayne Zhang *	0.16084	16	Sun, 09 Sep 2012 10:27:54
4	↑16	Manavender	0.19246	12	Sun, 09 Sep 2012 00:37:42
5	↑21	HIT_CS	0.20078	11	Tue, 11 Sep 2012 14:09:02 (-16.4h)
6	↑1	vigilant	0.22352	9	Mon, 10 Sep 2012 00:21:25
7	new	Mikalai Drabovich	0.31115	12	Tue, 11 Sep 2012 17:55:45
		Principal Motion benchmark	0.31725		
8	↓7	JNB Concepts	0.90682	41	Tue, 11 Sep 2012 23:01:11 (-95d)
		Winner round 1	1.00000		

Cursos y documentación

Especializaciones

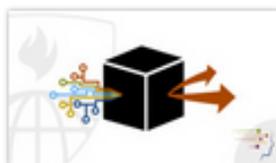
www.coursera.org



Universidad Johns Hopkins
Data Science

Siguiente sesión:
may. 5ª 2014

Cursos



Universidad Johns Hopkins
Aprendizaje automático en la práctica
con Jeff Leek, Brian Caffo & Roger D. Peng

jun. 2ª 2014
4 weeks de duración
Especializaciones

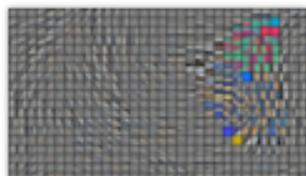


Universidad Stanford
Aprendizaje automático
con Andrew Ng

jun. 16ª 2014
10 weeks de duración

Cursos y documentación

www.coursera.org



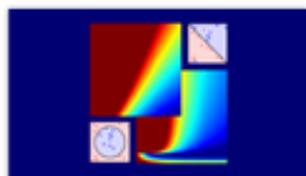
Universidad de Toronto
Las redes neuronales y el aprendizaje automático
con Geoffrey Hinton

oct. 1^{er} 2012
8 weeks de duración



Universidad Stanford
Modelos en grafo de probabilidades
con Daphne Koller

abr. 8^{er} 2013
11 weeks de duración



Universidad Nacional de Taiwán
機器學習基石 (Fundamentos del aprendizaje
automático)
con Hsuan-Tien Lin

nov. 26^{er} 2013
8 weeks de duración

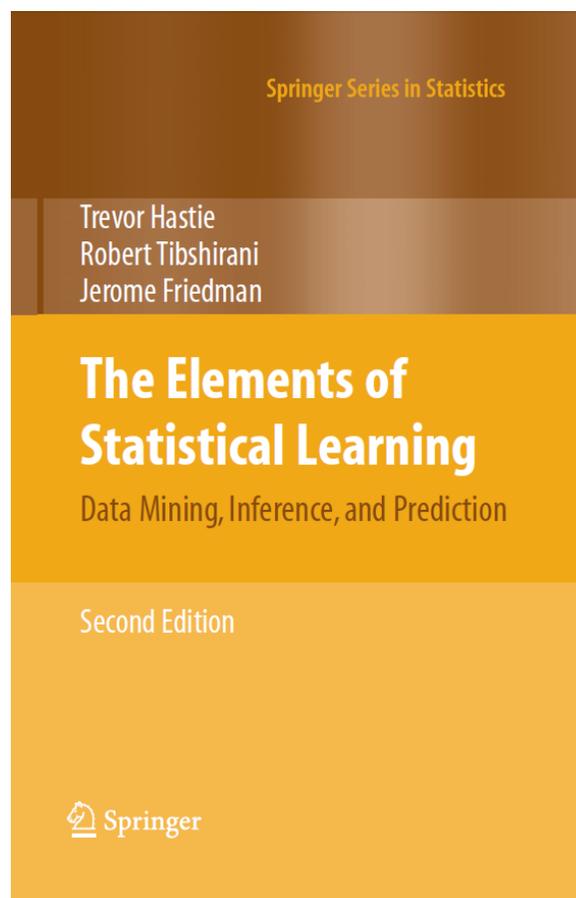


Universidad de Washington
Aprendizaje automático
con Pedro Domingos

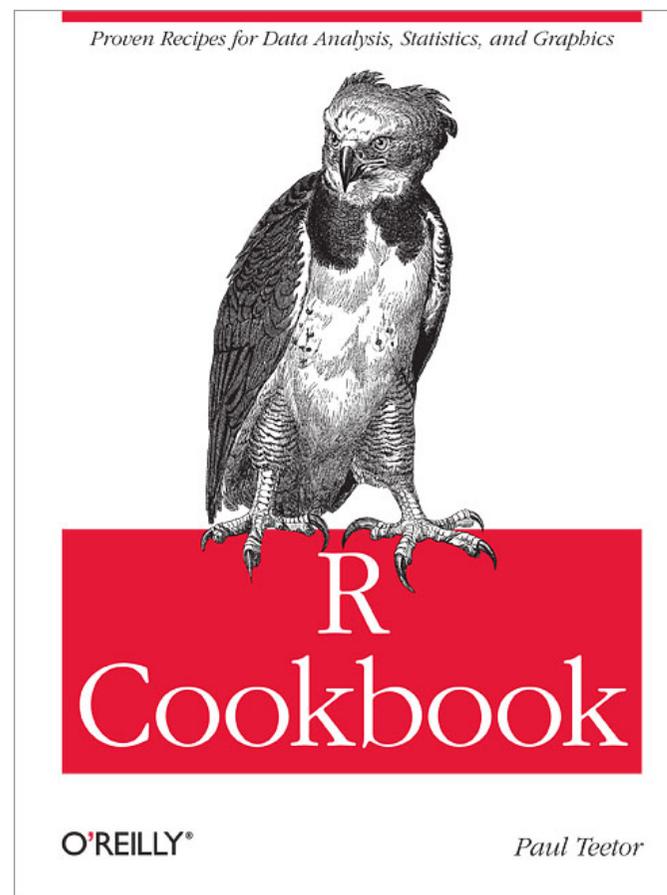
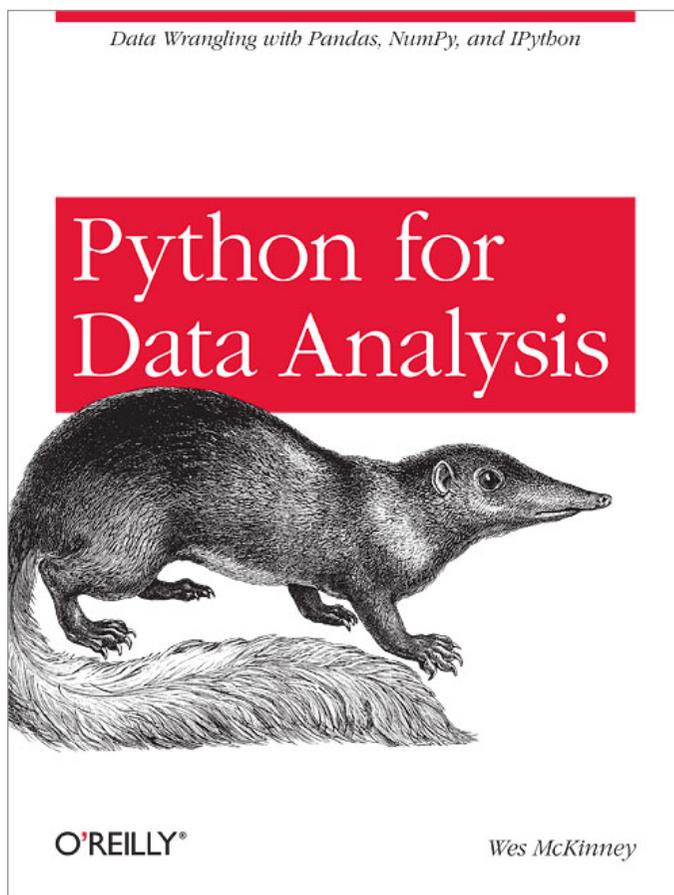
No hay
sesiones abiertas.

Cursos y documentación

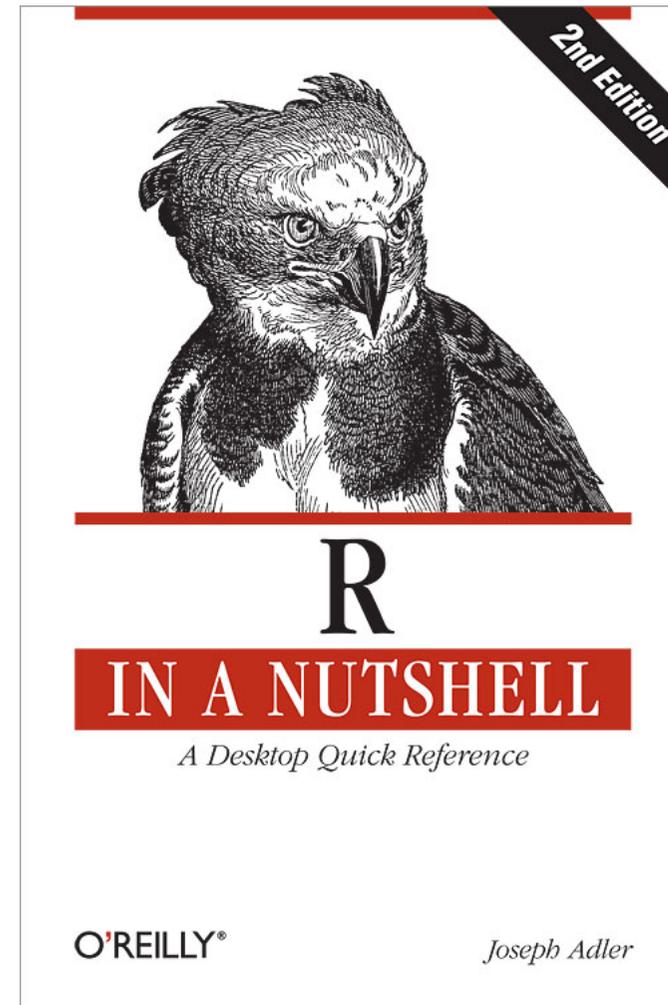
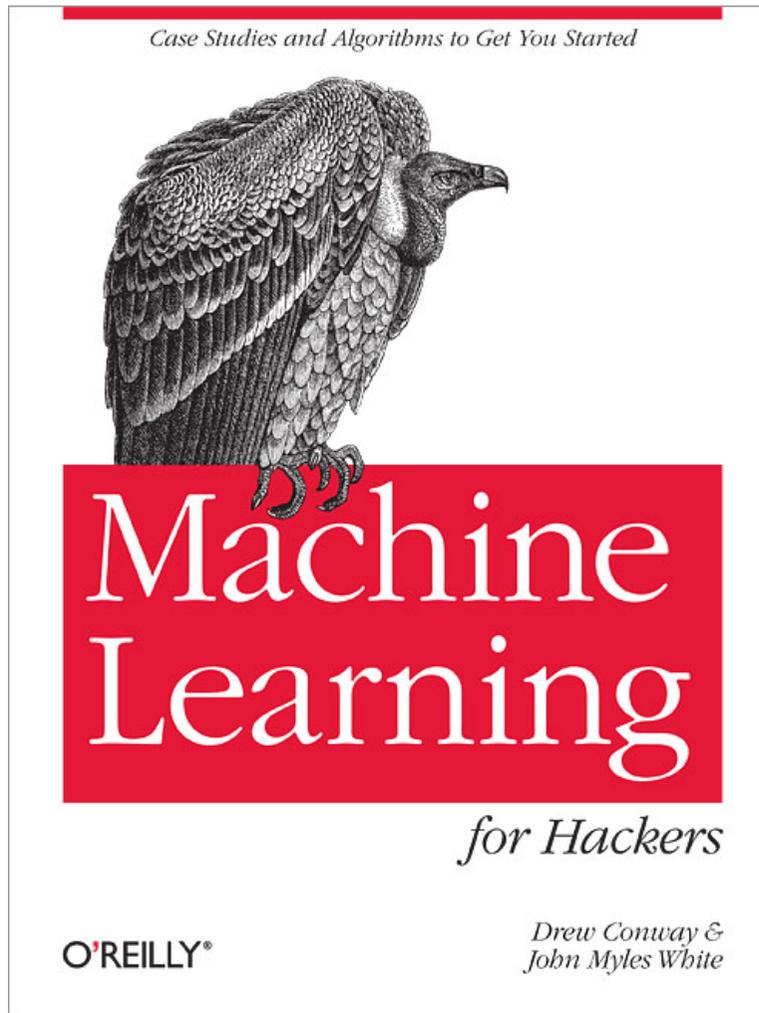
<http://statweb.stanford.edu/~tibs/ElemStatLearn/download.html>



Cursos y documentación



Cursos y documentación



Contacto

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jaguerrero@ono.com