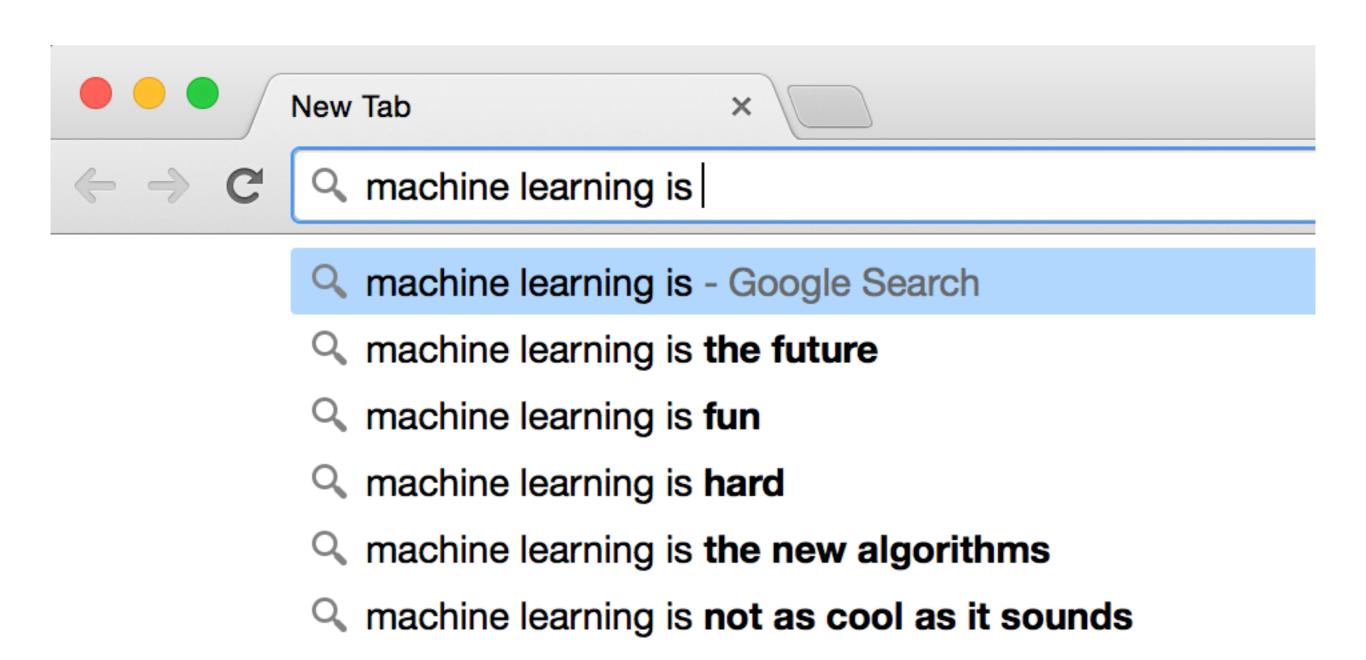
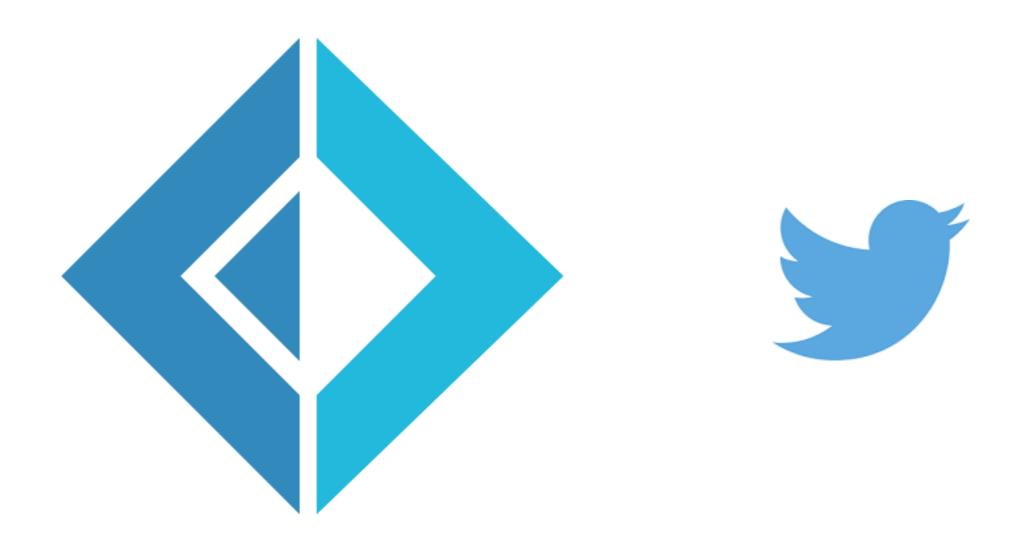
Putting fun into data analysis with F#

Evelina Gabasova

ØREDEV \$\frac{1}{2}\$

Machine learning



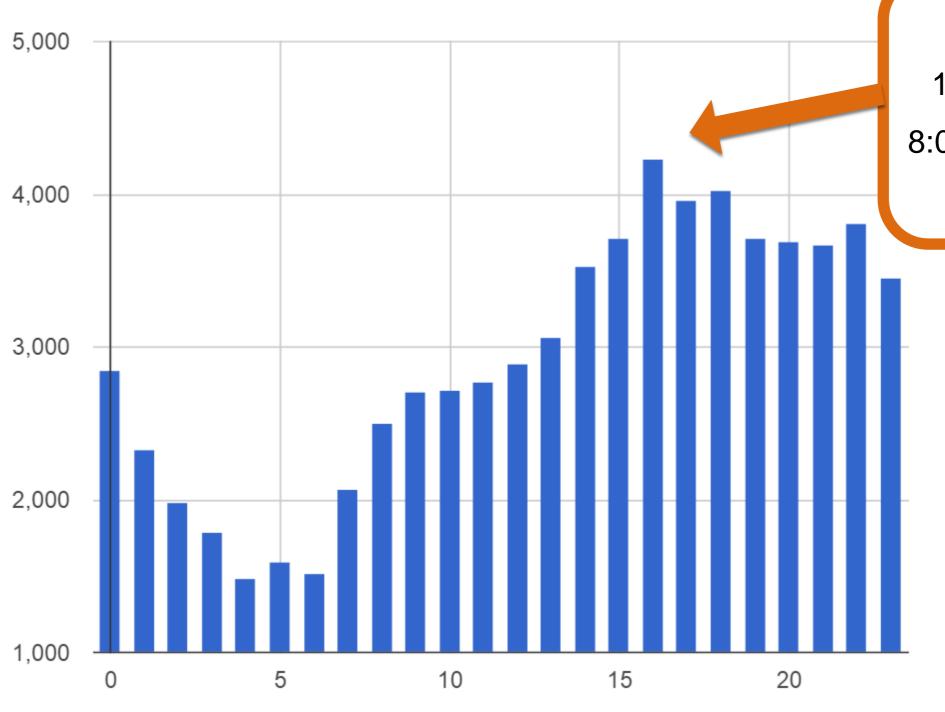


With F# about F#

What is the community's dynamics?



When do people tweet?



16:00 in London

11:00 in New York

8:00 in San Francisco

0:00 in Tokyo



Growth of the community

$$N = w_0 + w_1 D + \epsilon$$

D Date

N Number of people tweeting

Programming in data science

Scripting languages

fast prototyping, easy to use

R, Python, Matlab

Why F#?

```
Lp = lapply(logL, exp)
for (m in 1:M) (
    for(i in 1:N) L[[m]][i,] = rmultinom(1,1,Lp[[m]][i,]) #Generate L from Lp
    if (w>1) L[[m]] = AlignClusters (C, L[[m]], type = 'mat') #Helps to align indices
    n[m,] = colSums(L[[m]])
    for (k in 1:K) ( ###Update cluster parameters based on normal-gamma distribution
        if (d[m] == 1&n[m, k]>1) {
            S[[m]][,k] = sd(X[[m]][,L[[m]][,k]==1])^2
            PostMean = sum(X[[m]][,L[[m]][,k]==1])/(n[m,k]+1)
            B[[m]][,k] = b0[[m]]+0.5*(n[m,k]*S[[m]][,k]+n[m,k]*(mean(X[[m])[,L[[m]][,k]==1])-mu0
        if (d[m]>1&n[m, k]>1) {
            PostMean = (mu0[[m]]+rowSums(X[[m]][,L[[m]][,k]==1]))/(n[m,k]+1)
            S[[m]][,k] = apply(X[[m]][,L[[m]][,k]==1],MARGIN=1,FUN='ad')^2
        B[[m]][,k] = b0[[m]]+0.5*(n[m,k]*S[[m]][,k]+n[m,k]*(rowMeans(X[[m])[,L[[m]][,k]==1])-mu0
        if (n[m, k]==1) {
            PostMean = (mu0[[m]]+X[[m]][,L[[m]][,k]==1])/2
        B[[m]][,k] = b0[[m]]+0.5*(X[[m]][,L[[m]][,k]==1]-mu0[[m]])^2/2
        if (n[m, k]==0) (
            PostMean = mu0[[m]]
            B[[m]][,k] = b0[[m]])
        Lambda = 1+n[m,k]
        A[[m]][,k] = a0[[m]]+n[m,k]/2
        Tau[[m]][,k] = rgamma(d[m],shape=A[[m]][,k],rate=B[[m]][,k])
        mu[[m]][,k] = rnorm(d[m], PostMean, sgrt(1/(Tau[[m])[,k]*Lambda)))
        Sigma[[m]][,k] = sqrt(1/Tau[[m]][,k])}
```

Why F#?

```
Lp = lapply(logL, exp)
for (m in :M) {
    for (i in 1:N) L[[m]][i,] = rmultinom(], Lp[[m]][i,]) #Generate L from Lp
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            PostMean = sum(X[[m]][,L[[m]][,k]==])/(n[m,k]+])
            B[[m]][,k] = b0[[m]]+0.0*(n[m,k]*S[[m]][,k]+n[m,k]*(mean(X[[m]][,L[[m]][,k]==:])-mu0
        if (d[m]>| 4n[m, k]>|) (
            PostMean = (mu0[[m]]+rowSums(X[[m]][,L[[m]][,k]==]))/(n[m,k]+1)
            S[[m]][,k] = apply(X[[m]][,L[[m]][,k]==1],MARGIN=1,FUN=*=1')^=
        B[[m]][,k] = b0[[m]]+0.4*(n[m,k])Vector? Watrix?
            PostMean = (mu0[[m]]+X[[m]][, L[[m]][, k]==1])/2
        \underset{\text{lf}(n[m,k]=0)}{\text{Bf[m]]][t,k]} = \text{b0f[m]]]+0.5*(x[[m]][t,k]=k]-mu0\{[m]])^2/2} 
            PostMean = mu0[[m]]
            B[[m]][,k] = b0[[m]])
                                             Data frame?
        Lambda = 1+n[m,k]
        A[[m]][,k] = a0[[m]]+n[m,k]/2
        Tau[[m]][,k] = rgamma(d[m],shape=A[[m]][,k],rate=B[[m]][,k])
        mu[[m]][,k] = rnorm(d[m], PostMean, sgrt(1/(Tau[[m]][,k]*Lambda)))
        Sigma[[m]][,k] = sqrt([/Tau[[m]][,k])}
```

Why F#?

```
25
           let newas =
26
               data.Contexts
27
               |> Array.map (fun context ->
28
                   let pis = state.ContextWeights.[context]
                   let rawPriorPis = Array.create pis.Length 1.0
29
                   let value = sampleDirichletConcentration (hyperprior.AlphasPrior.[context])
30
31
32
                     val sampleDirichletConcentration :
          { state w
33
                         gammaDist : Gamma ->
                                                                     as = newas \} 
                         rawPriorPis: seq<float> ->
34
       | FixedValue(
35
                                     : seq<float> ->
                         pis
36
          // do not
                         sampleType : SampleConcentrationParams
37
           state
                                    -> float
38
     Context-specif
                     Summary
     *****
                     Adaptive rejection sampling (derivative-free)
41
42 // Sample from conditional viricniel distribution with random watk Metropolis—Hastings
43 let sampleDirichlet_MetropolisHastings (currentValues: float[])
       priorConcentration loglikFunction =
44
      // 1. Add random walk proposal to current values
45
46
      let randomWalkProposal = Normal(0.0, 1.0, rnd)
       let proposal_unnorm =
47
           currentValues
48
           |> Array.map (fun x -> x + 0.1 * randomWalkProposal.Sample())
49
50
```

Answering real questions:

Are people happy with F#?

Sentiment analysis

The movie was funny.

The movie was trying to be funny.

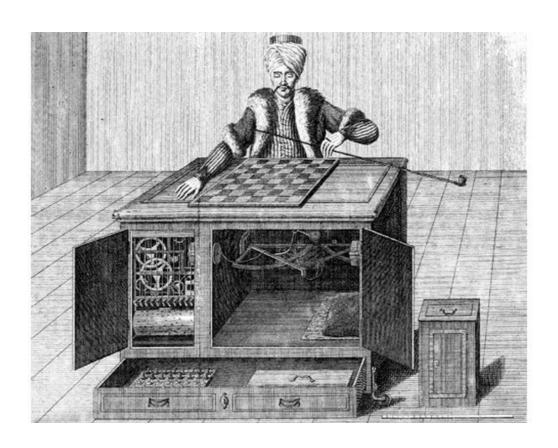


Sentiment analysis

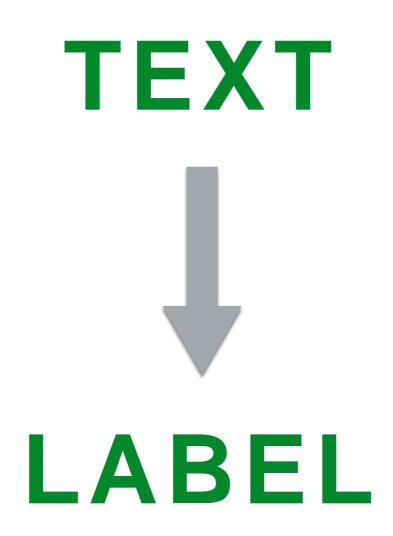
Stanford NLP library

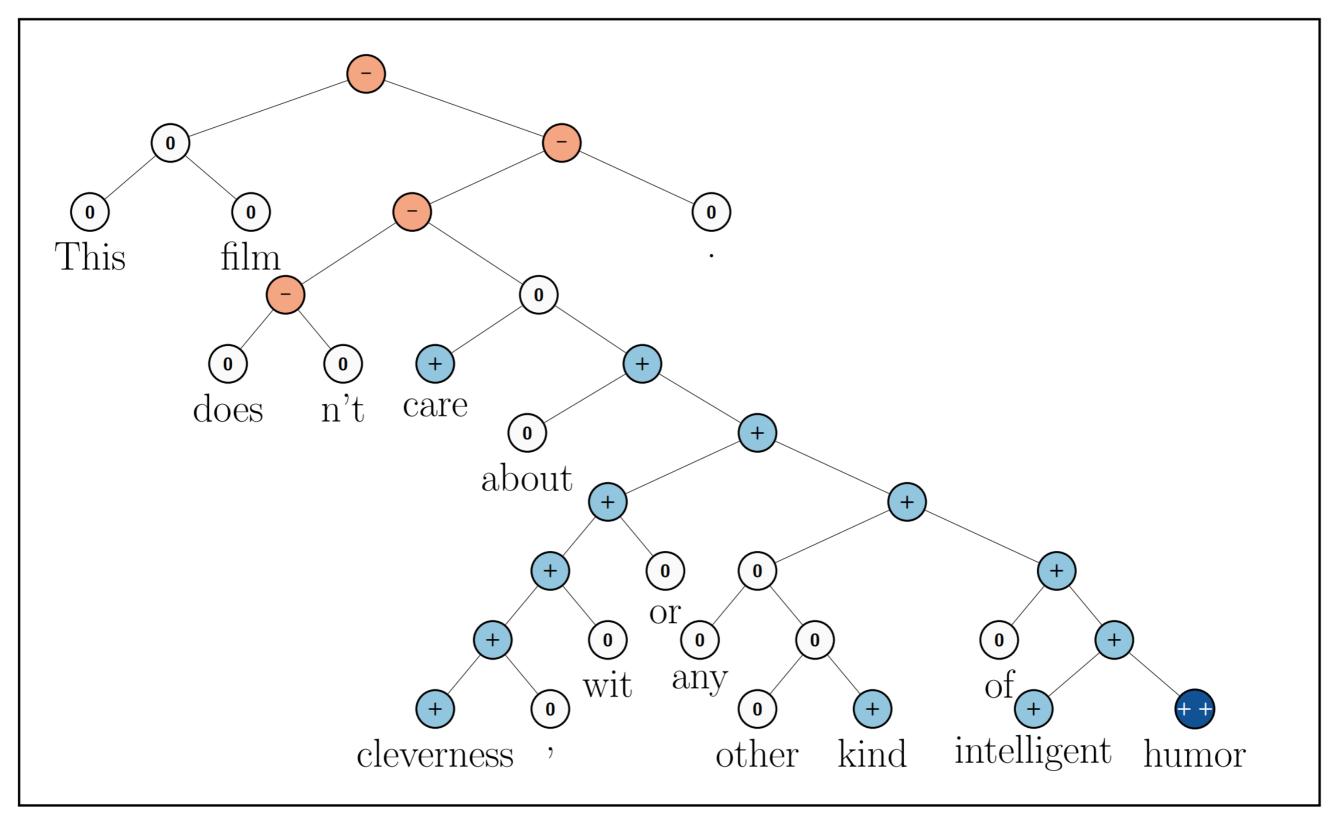
How to find sentiment from text?

Humans are good at this but computers are not!



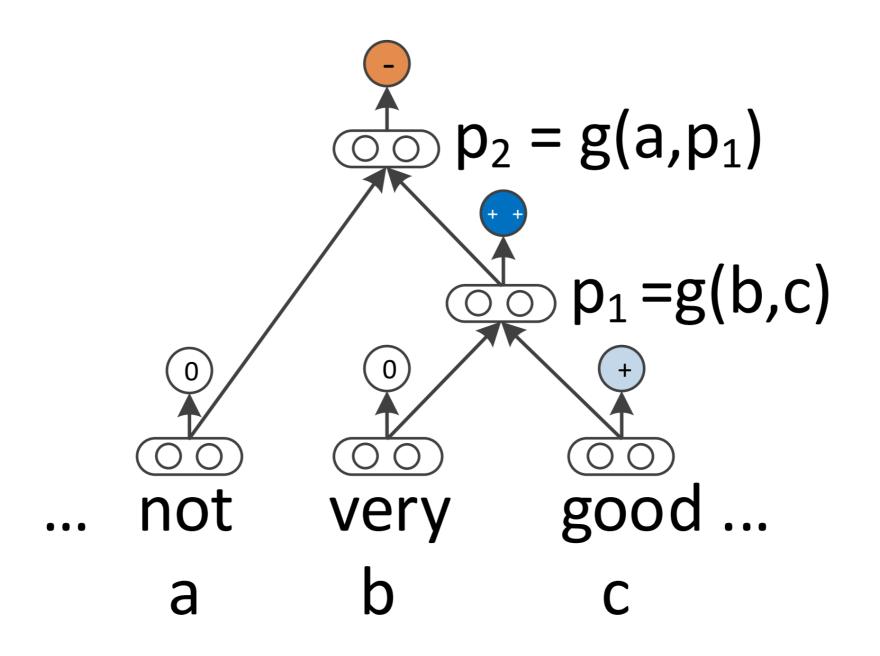
Supervised learning





Richard Socher, Alex Perelygin, Jean Wu, Jason Chuang, Christopher Manning, Andrew Ng and Christopher Potts: Recursive Deep Models for Semantic Compositionality Over a Sentiment Treebank

Deep recurrent neural networks





Turning analysis into an app



#oredev



- Interactive exploration of data & incorporation into larger applications
- Static typing helps
- Type providers for easy data access
- RProvider allows calling R functions



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