

# Practical session: String kernels

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In this session you will

- Learn how to use string kernels with the R package `kernlab`
- Use string kernels to predict protein subcellular localization

## 1 Basic string kernels

`kernlab` implements several string kernels, including the spectrum and various substring kernels. They are created by the `stringdot` functions.

**Question 1** Look at the string kernel implemented by `help(stringdot)`. Check that you understand them.

To create a string kernel and test it on strings:

```
# We create a 2-spectrum kernel
sk <- stringdot(type="spectrum", length=2, normalized=FALSE)
```

```
# Compute the kernel between two words
sk('radar', 'abracadabra')
```

**Question 2** Compute the kernel between two words (e.g., `radar` and `abracadabra`), for different types of kernels and different parameters. Check that it does what you want.

## 2 Application: text classification

As a toy application, let us show how string kernels can be used to manipulate texts. We load a small dataset of news from two newsgroups or the Reuters dataset

```
data(reuters)
y <- rlabels
x <- reuters
```

We can then use the string kernels on `x` using the classical syntax of `kernlab` to run kernel methods.

**Question 3** For different string kernels and different parameters, visualize the `Reuters` dataset by kernel PCA, and test the performance of a SVM to predict the newsgroup. Which kernel performs the best between spectrum, boundrange and exponential?

## 3 Application: Protein subcellular localization prediction

As a second application, we try to predict the subcellular localization of a protein from its aminoacid sequence.

**Question 4** Download a set of protein sequence with subcellular localization information: [http://www.psort.org/dataset/dataset1\\_0.txt](http://www.psort.org/dataset/dataset1_0.txt).

Now we need to read the aminoacid sequences and the subcellular localization in R. We use the `read.fasta` function of the `seqinr` package to read the file in FASTA format.

```

# Read data in FASTA format
protdata <- read.fasta("dataset1_0.txt",seqtype="AA",as.string=TRUE)

length(protdata)

# To speed up computation, we will only work on a subset of 100 randomly selected proteins
protdata <- protdata[sample(length(protdata),100)]

# Save it to a file for future use if needed
write.fasta(protdata,names=names(protdata),file.out="smalldataset.fa")

# Extract protein localization information
annotation <- getName(protdata)

# We get the location information by parsing the annotation as follows
extractlocationfromannotation <- function(s){strsplit(s,'|',fixed=TRUE)[[1]][3]}
loc <- unlist(lapply(annotation,extractlocationfromannotation))

# Extract the protein sequences
x <- unlist(getSequence(protdata,as.string=TRUE),recursive=FALSE)

# Focus on inner and outer membrane integral membrane proteins
y <- factor((loc=="Inner") | (loc=="Outer"))

```

**Question 5** Test SVM with spectrum kernel ( $k = 1, 2, 3$ ) and exponential kernel. Which works best?