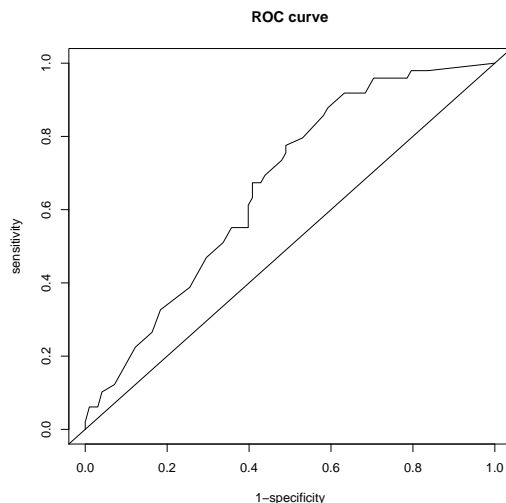


		Truth		
		Significant	Null	
Test	Significant	True Positive	False Positive	P*
	Null	False Negative	True Negative	N*
		P	N	

- type I error = FP
- type II error = FN
- sensitivity = power = true positive rate (TPR) =  $TP / P = TP / (TP+FN)$
- false positive rate (FPR) =  $FP / N = FP / (FP + TN)$
- specificity =  $1 - FPR = TN / (FP + TN)$
- accuracy (acc) =  $(TP+TN) / (P+N)$
- positive predictive value (PPV) = precision =  $TP / (TP + FP)$
- negative predictive value (NPV) =  $TN / (TN + FN)$
- false discovery rate =  $1 - PPV = FP / (FP + TP)$



Below is the code for creating ROC curves in R:

```
install.packages("ROCR")
library(ROCR)
smok.pred <- prediction(fitted(smok.log),lung.c)
smok.perf <- performance(smok.pred,measure="tpr",x.measure="fpr")
plot(smok.perf,xlab="1-specificity",ylab="sensitivity",main="ROC curve")
abline(a=0,b=1)
```

Note that R has many options within the `performance` function. I've listed only a few of them below. For more see:

`?performance`

- `acc`: Accuracy.  $P(\hat{Y} = Y)$ . Estimated as:  $(TP+TN)/(P+N)$ .
- `err`: Error rate.  $P(\hat{Y} \neq Y)$ . Estimated as:  $(FP+FN)/(P+N)$ .
- `fpr`: False positive rate.  $P(\hat{Y} = + \mid Y = -)$ . Estimated as:  $FP/N$ .
- `tpr`: True positive rate.  $P(\hat{Y} = + \mid Y = +)$ . Estimated as:  $TP/P$ .
- `sens`: Sensitivity. Same as `tpr`.
- `fnr`: False negative rate.  $P(\hat{Y} = - \mid Y = +)$ . Estimated as:  $FN/P$ .
- `tnr`: True negative rate.  $P(\hat{Y} = - \mid Y = -)$ . Estimated as:  $TN/N$ .
- `spec`: Specificity. Same as `tnr`.
- `ppv`: Positive predictive value.  $P(Y = + \mid \hat{Y} = +)$ . Estimated as:  $TP/(TP+FP)$ .
- `prec`: Precision. Same as `ppv`.
- `npv`: Negative predictive value.  $P(Y = - \mid \hat{Y} = -)$ . Estimated as:  $TN/(TN+FN)$ .
- `rpp`: Rate of positive predictions.  $P(\hat{Y} = +)$ . Estimated as:  $(TP+FP)/(TP+FP+TN+FN)$ .
- `rnp`: Rate of negative predictions.  $P(\hat{Y} = -)$ . Estimated as:  $(TN+FN)/(TP+FP+TN+FN)$ .
- `odds`: Odds ratio.  $(TP*TN)/(FN*FP)$ . Note that odds ratio produces `Inf` or `NA` values for all cutoffs corresponding to  $FN=0$  or  $FP=0$ . This can substantially decrease the plotted cutoff region.
- `auc`: Area under the ROC curve. This is equal to the value of the Wilcoxon-Mann-Whitney test statistic and also the probability that the classifier will score a randomly drawn positive sample higher than a randomly drawn negative sample. Since the output of `auc` is cutoff-independent, this measure cannot be combined with other measures into a parametric curve. The partial area under the ROC curve up to a given false positive rate can be calculated by passing the optional parameter `fpr.stop=0.5` (or any other value between 0 and 1) to `performance`.