

Introduction

Pulmonary neuroendocrine tumors (NETs) represent 20% of all lung cancers and include **carcinoids** (typical (TC) and atypical (AC)) and **neuroendocrine carcinomas (small cells (SCLC) and large cells (LCNEC))**. They are commonly diagnosed late in the course of the disease mostly due to the late onset of symptoms and/or the intrinsic aggressive evolution of SCLC and LCNEC (1).

A characteristic of cancer is a **major reprogramming of cellular energy metabolism** to support cell growth and proliferation (2). Recently, **metabolites** have been considered reliable **biomarkers** (3), allowing the development of a minimally invasive routine blood test that can be used for screening as well as the monitoring of the disease evolution for patients.

Methods

Our study included a total of 120 plasma samples with biopsy-confirmed of NETs patients (breakdown of the neuroendocrine neoplasms: 50 carcinoids, 40 SCLC, 30 LCNEC), 227 of controls and 466 NSCLC patients (Figure 1). Here, a targeted, quantitative mass spectrometry (MS) - based metabolomics approach was used to analyze the plasma samples using a combination of direct injection (DI) MS and reverse-phase high performance liquid chromatography (HPLC) tandem mass spectrometry (MS/MS). The sample set was split into a training and a testing set (Figure 2). Metabolites concentration, clinical data, and smoking history were used to determine the optimal panel of biomarkers and optimal logistic regression models.

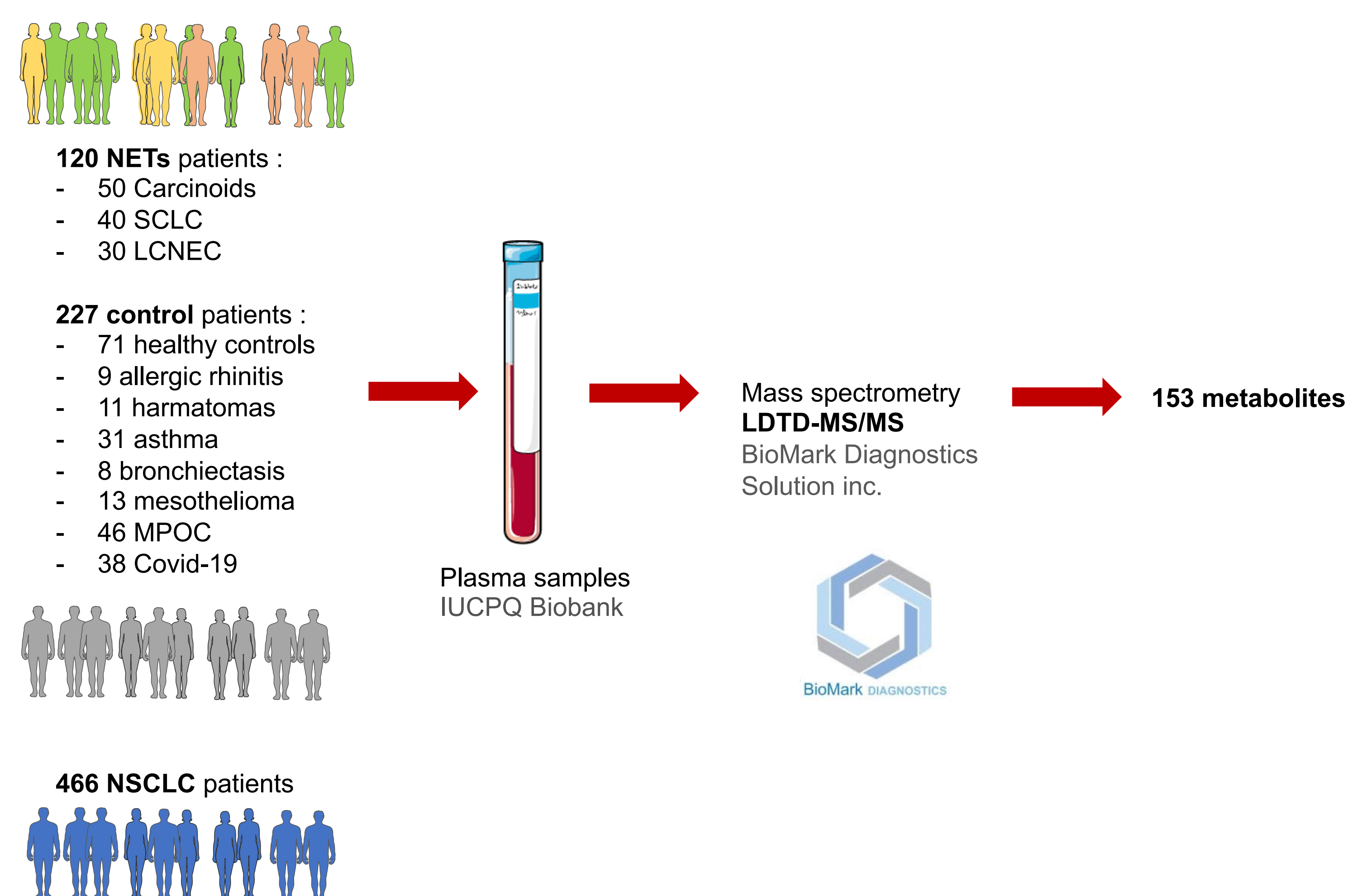


Figure 1: Methodological procedure leading to the measurement of plasma concentrations of 153 metabolites.

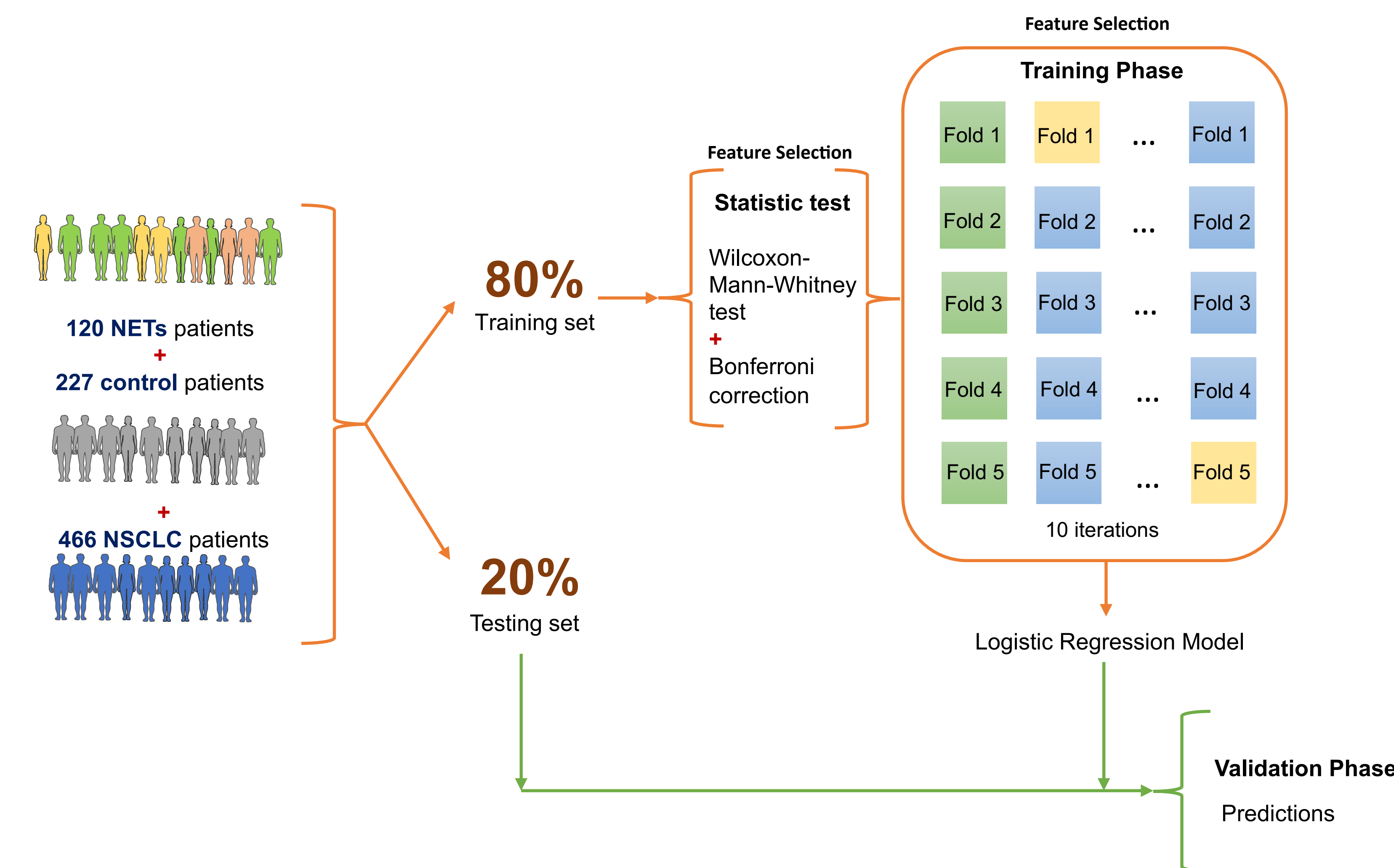


Figure 2: Study design. Separation of the cohort into training and testing sets. The training set is used for statistical tests, followed by cross validation to obtain a logistic regression model. The model is used as a prediction model on the testing set.

Results

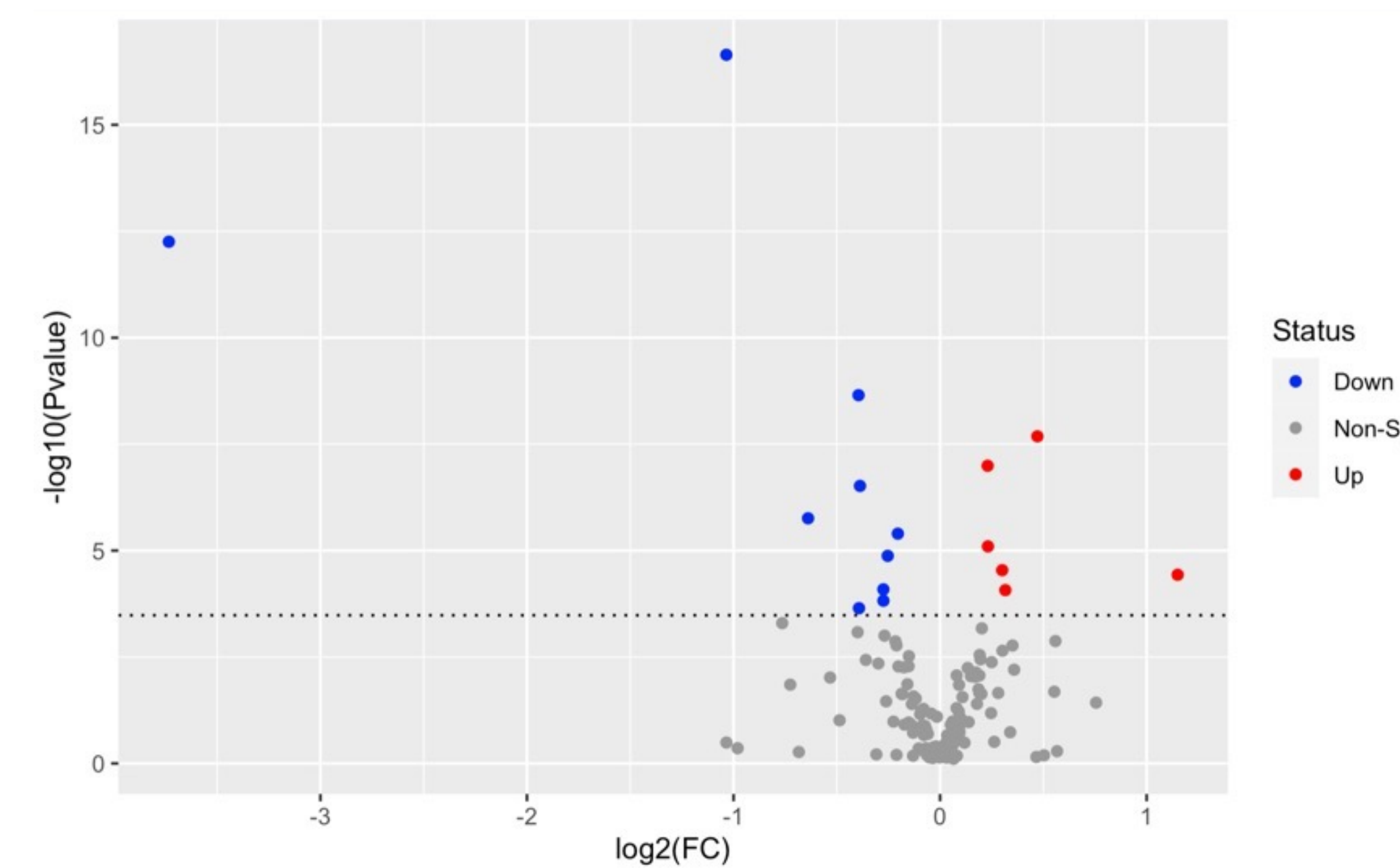


Figure 3: Difference in metabolite concentrations between lung neuroendocrine tumors and control patients. A Wilcoxon Mann Whitney test followed by a Bonferroni correction showed 10 and 6 metabolites with significantly decrease and increase concentration, respectively, in pulmonary neuroendocrine tumors.

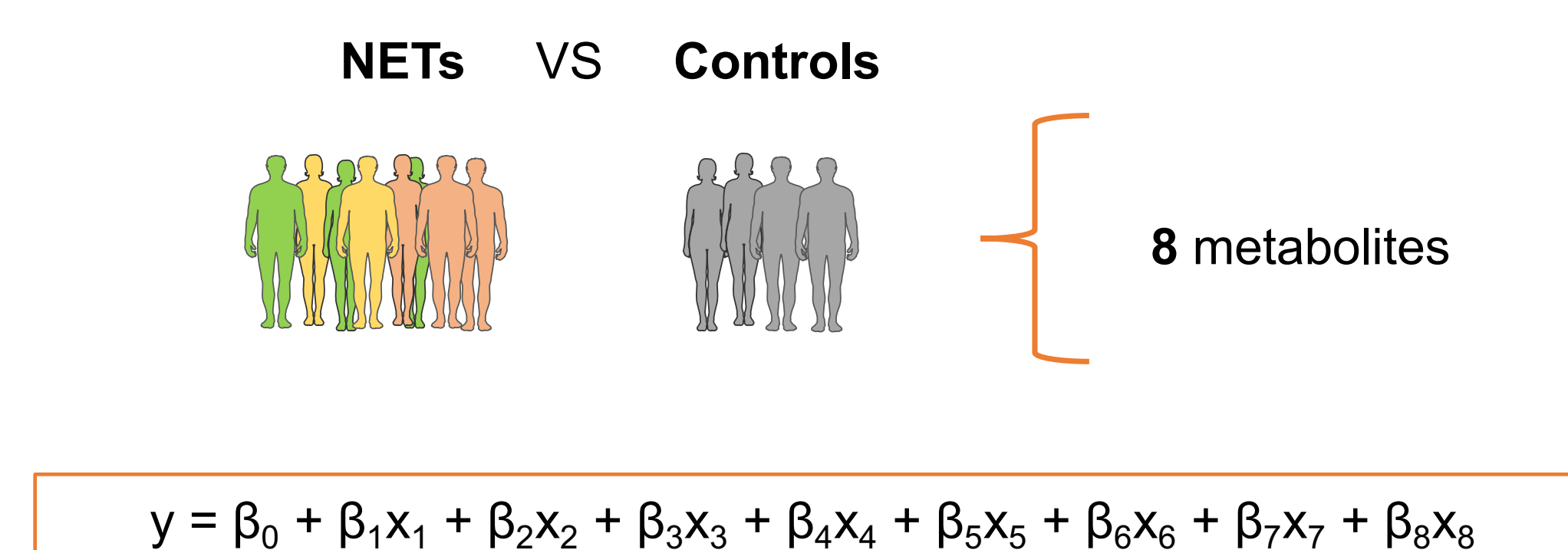


Figure 4: Logistic regression model constructed with 8 metabolites to discriminate lung neuroendocrine tumors from controls.

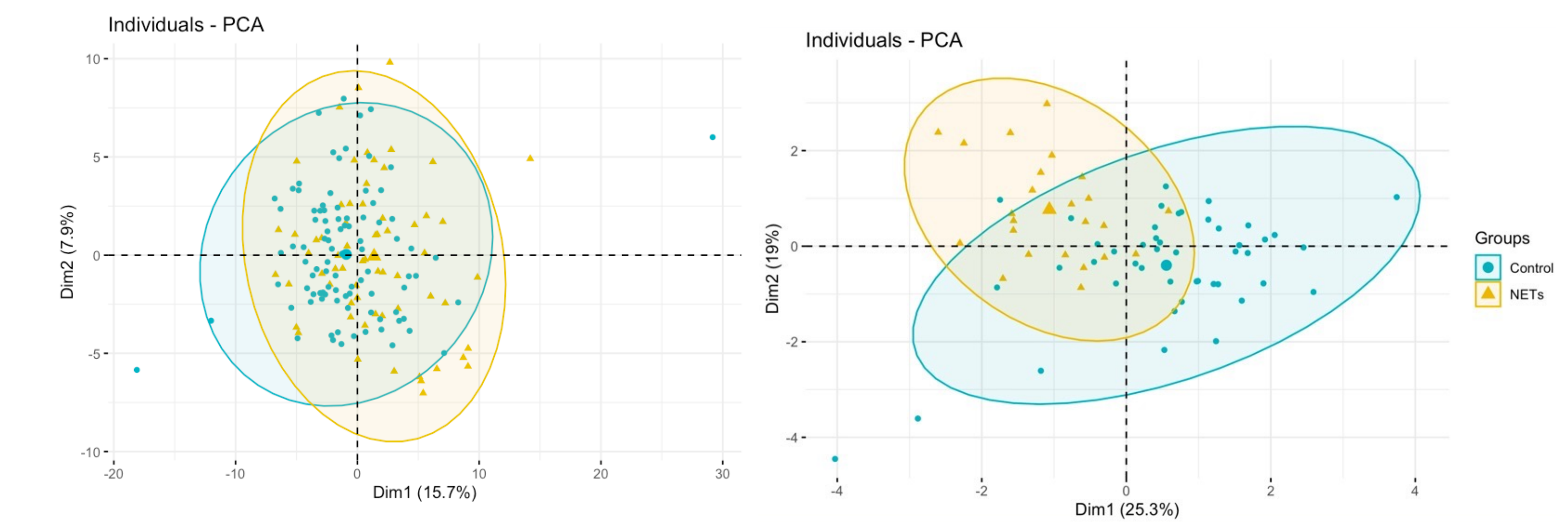


Figure 5: Contribution of metabolite panel reduction in distinguishing neuroendocrine tumors vs control group. Principal component analysis (PCA) where the first two dimensions explain 23.6% of the variance then 44.3% with the use of 153 metabolites and the panel of 8 metabolic biomarkers, respectively.

Layer 1 Cancer	Layer 2 NETs	Layer 3 Carcinoids, SCLC, LCNEC
10 metabolites NETs+NSCLC VS Controls AUC = 0.8293	8 metabolites NETs VS Controls AUC = 0.9143	0 metabolite Carcinoid VS SCLC
	3 metabolites Carcinoid VS Controls AUC = 0.8393	0 metabolite SCLC VS LCNEC
6 metabolites Carcinoid VS Controls AUC = 0.953	1 metabolite SCLC VS Controls AUC = 0.8519	2 metabolites LCNEC VS Carcinoid AUC = 0.6875
	7 metabolites Carcinoid VS Controls AUC = 0.9032	2 metabolites Carcinoid VS LCNEC AUC = 0.833
3 metabolites SCLC VS NSCLC AUC = 0.8333	8 metabolites SC+LC VS Controls AUC = 0.933	0 metabolite SC VS LC+carci
	6 metabolites Carcinoid VS NSCLC AUC = 0.9231	1 metabolite LCNEC VS SC+carci AUC = 0.7083
3 metabolites SCLC VS NSCLC AUC = 0.8333	9 metabolites Carcinoid VS NSCLC AUC = 0.8482	6 metabolites SC+LC VS NSCLC AUC = 0.8241
	3 metabolites LCNEC VS NSCLC AUC = 0.94	5 metabolites LC+Carci VS NSCLC AUC = 0.8364

Figure 6: Summary of established metabolites panels. A Bonferroni-corrected Wilcoxon Mann Whitney test was followed by a logistic regression model construction. A cross validation was performed. The accuracy reflects the performance of the binary class prediction model on the testing set.

Conclusion

- We were able to **detect neuroendocrine tumors from plasma samples** with good performance (**AUC = 0.91** for NETs vs controls).
- NETs do show a **reprogramming of their metabolism** reflected by the presence of a panel of **distinct metabolic biomarkers**. It appears that **NET subtypes** can be distinguished from each other and from **NSCLC**.
- We believe that **multi-metabolites panels** could allow the implementation of a **routine screening test for NETs** and aid in **monitoring clinical evolution of neuroendocrine carcinomas**. Moreover, due to the non-specificity of the symptoms of NET patients at early stage, we believe that this test may support **early diagnosis**.