What is...hyperplane separation?

Or: Cutting data into bits

Data clusters



► Say we want to separate data clusters

• Linear strategy Find a hyperplane separating the clusters

► For this video we ignore finding an optimal cutting hyperplane

Ok, this sometimes fails



- Problem Circle clusters cannot be separated using hyperplanes
- Problem Overlapping (non-convex) clusters cannot be separated using hyperplanes
- Question In what generality can we separate using hyperplanes?

A more abstract setting



- ▶ The problem with our two subsets from before is that they are not convex
- ► Convex = it contains all line segments between its points
- ► Convexity makes sense in any real topological vector space

 $A, B \subset X$ nonempty and convex and disjoint, say A is compact and B closed, then:

A, B can be separated by a hyperplane



▶ In this version X only needs to be a real topological vector space

- A picture for $X = \mathbb{R}^2$ is above
- ► There are proofs that **construct** an "optimal" hyperplane

The Hahn–Banach theorem

Continuous extension theorem [edit]

The Hahn-Banach theorem can be used to guarantee the existence of continuous linear extensions of continuous linear functionals.

Hahn-Banach continuous extension theorem^(1,4) — Every continuous linear functional *f* defined on a vector subspace *M* of a (real or complex) locally convex topological vector space *X* has a continuous linear extension *F* to all of *X*. If in addition *X* is a normed space, then this extension can be chosen so that its dual norm is equal to that of *f*.

Banach: In category-theoretic terms, the underlying field of the vector space is an injective object in the category of locally convex vector spaces.

On a normed (or seminormed) space, a linear extension F of a bounded linear functional f is said to be norm-preserving if it has the same dual norm as the original functional: $\|F\| = \|f\|$. Because of this terminology, the second part of the above theorem is sometimes referred to as the "norm-preserving" version of the Hahn-Banach theorem.¹⁵¹ Explicitly:

Norm-preserving Hahn-Banach continuous extension theorem^[15] — Every continuous linear functional f defined on a vector subspace M of a (real or complex) normed space X has a continuous linear extension F to all of X that satisfies ||f| = |F|.

- ► There are two versions of the Hahn–Banach theorem from functional analysis: analytic and geometric
 - Analytic Bounded linear functionals defined on a vector subspace extend to the whole space
 - Geometric Similar to the one from before
 - Surprise They are equivalent

Wikipedia on Hahn–Banach:

Thank you for your attention!

I hope that was of some help.