A key result on the ERM algorithm, proved in the previous lecture, was that

$$P(\hat{f}_n) \leq L^*(\mathcal{F}) + 4ER_n(\mathcal{F}(Z^n)) + \sqrt{\frac{2\log(1/\delta)}{n}}$$

with probability at least $1 - \delta$. The quantity $R_n(\mathcal{F}(Z^n))$ appearing on the right-hand side of the above bound is the Rademacher average of the random set

$$\mathcal{F}(Z^n) = \{ (f(Z_1), \ldots, f(Z_n)) : f \in \mathcal{F} \},$$

often referred to as the projection of $\mathcal{F}$ onto the sample $Z^n$. From this we see that a sufficient condition for the ERM algorithm to produce near-optimal hypotheses with high probability is that the expected Rademacher average $E R_n(\mathcal{F}(Z^n)) = \tilde{O}(1/pn)$, where the $\tilde{O}(\cdot)$ notation indicates that the bound holds up to polylogarithmic factors in $n$, i.e., there exists some positive polynomial function $p(\cdot)$ such that

$$E R_n(\mathcal{F}(Z^n)) \leq O\left(\sqrt{\frac{p(\log n)}{n}}\right).$$

Hence, a lot of effort in statistical learning theory is devoted to obtaining tight bounds on $E R_n(\mathcal{F}(Z^n))$.

One way to guarantee an $O(1/\sqrt{n})$ bound on $E R_n$ is if the “effective size” of the random set $\mathcal{F}(Z^n)$ is finite and grows polynomially with $n$. Then the Finite Class Lemma will tell us that

$$R_n(\mathcal{F}(Z^n)) = O\left(\sqrt{\frac{\log n}{n}}\right).$$

In general, a reasonable notion of “effective size” is captured by various covering numbers (see, e.g., the lecture notes by Mendelson [Men03] or the recent monograph by Talagrand [Tal05] for detailed expositions of the relevant theory). In this lecture, we will look at a simple combinatorial notion of effective size for classes of binary-valued functions. This particular notion has originated with the work of Vapnik and Chervonenkis [VC71], and was historically the first such notion to be introduced into statistical learning theory. It is now known as the Vapnik–Chervonenkis (or VC) dimension.

## 1 Vapnik–Chervonenkis dimension: definition

**Definition 1.** Let $\mathcal{C}$ be a class of (measurable) subsets of some space $Z$. We say that a finite set $S = \{z_1, \ldots, z_n\} \subseteq Z$ is shattered by $\mathcal{C}$ if for every subset $S' \subseteq S$ there exists some $C \in \mathcal{C}$ such that $S' = S \cap C$. 


In other words, \( S = \{z_1, \ldots, z_n\} \) is shattered by \( \mathcal{C} \) if for any binary \( n \)-tuple \( b = (b_1, \ldots, b_n) \in \{0, 1\}^n \) there exists some \( C \in \mathcal{C} \) such that

\[
\left\{1_{\{z_i \in C\}}, \ldots, 1_{\{z_n \in C\}}\right\} = b
\]
or, equivalently, if

\[
\left\{\left\{1_{\{z_i \in C\}}, \ldots, 1_{\{z_n \in C\}}\right\} : C \in \mathcal{C}\right\} = \{0, 1\}^n,
\]
where we consider any two \( C_1, C_2 \in \mathcal{C} \) as equivalent if \( 1_{\{z_i \in C_1\}} = 1_{\{z_i \in C_2\}} \) for all \( 1 \leq i \leq n \).

**Definition 2.** The Vapnik–Chervonenkis dimension (or the VC dimension) of \( \mathcal{C} \) is

\[
V(\mathcal{C}) \triangleq \max \left\{ n \in \mathbb{N} : \exists S \subseteq Z \text{ such that } |S| = n \text{ and } S \text{ is shattered by } \mathcal{C} \right\}.
\]

If \( V(\mathcal{C}) < \infty \), we say that \( \mathcal{C} \) is a VC class (of sets).

We can express the VC dimension in terms of shatter coefficients of \( \mathcal{C} \): Let

\[
\mathbb{S}_n(\mathcal{C}) \triangleq \sup_{S \subseteq Z, |S| = n} |\{S \cap C : C \in \mathcal{C}\}|
\]
de note the \( n \)th shatter coefficient of \( \mathcal{C} \), where for each fixed \( S \) we consider any two \( C_1, C_2 \in \mathcal{C} \) as equivalent if \( S \cap C_1 = S \cap C_2 \). Then

\[
V(\mathcal{C}) = \max \left\{ n \in \mathbb{N} : \mathbb{S}_n(\mathcal{C}) = 2^n \right\}.
\]

The VC dimension \( V(\mathcal{C}) \) may be infinite, but it is always well-defined. This follows from the following lemma:

**Lemma 1.** If \( \mathbb{S}_n(\mathcal{C}) < 2^n \), then \( \mathbb{S}_m(\mathcal{C}) < 2^m \) for all \( m > n \).

**Proof.** Suppose \( \mathbb{S}_n(\mathcal{C}) < 2^n \). Consider any \( m > n \). We will suppose that \( \mathbb{S}_m(\mathcal{C}) = 2^m \) and derive a contradiction. By our assumption that \( \mathbb{S}_m(\mathcal{F}) = 2^m \), there exists \( S = \{z_1, \ldots, z_m\} \in Z^m \), such that for every binary \( n \)-tuple \( b = (b_1, \ldots, b_n) \) we can find some \( C \in \mathcal{C} \) satisfying

\[
\left\{1_{\{z_1 \in C\}}, \ldots, 1_{\{z_n \in C\}}, 1_{\{z_{n+1} \in C\}}, \ldots, 1_{\{z_m \in C\}}\right\} = (b_1, \ldots, b_n, 0, \ldots, 0).
\]

From (1) it immediately follows that

\[
\left\{1_{\{z_1 \in C\}}, \ldots, 1_{\{z_n \in C\}}\right\} = (b_1, \ldots, b_n).
\]

Since \( b = (b_1, \ldots, b_n) \) was arbitrary, we see from (2) that \( \mathbb{S}_n(\mathcal{C}) = 2^n \). This contradicts our assumption that \( \mathbb{S}_n(\mathcal{C}) < 2^n \), so we conclude that \( \mathbb{S}_m(\mathcal{C}) < 2^m \) whenever \( m > n \) and \( \mathbb{S}_n(\mathcal{F}) < 2^n \). \( \square \)

There is a one-to-one correspondence between binary-valued functions \( f : Z \to \{0, 1\} \) and subsets of \( Z \):

\[
\forall f : Z \to \{0, 1\} \text{ let } C_f \triangleq \{z : f(z) = 1\} \quad \forall C \subseteq Z \text{ let } f_C \triangleq 1_{\{C\}}.
\]

Thus, we can extend the concept of shattering, as well as the definition of the VC dimension, to any class \( \mathcal{F} \) of functions \( f : Z \to \{0, 1\} \):

\[
\forall f : Z \to \{0, 1\} \text{ let } C_f \triangleq \{z : f(z) = 1\} \quad \forall C \subseteq Z \text{ let } f_C \triangleq 1_{\{C\}}.
\]
Definition 3. Let \( \mathcal{F} \) be a class of functions \( f : \mathbb{Z} \to \{0, 1\} \). We say that a finite set \( S = \{z_1, \ldots, z_n\} \subset \mathbb{Z} \) is shattered by \( \mathcal{F} \) if it is shattered by the class

\[
\mathcal{C}_\mathcal{F} \triangleq \{1_{\{f = 1\}} : f \in \mathcal{F}\},
\]

where \( 1_{\{f = 1\}} \) is the indicator function of the set \( C_f \triangleq \{z \in \mathbb{Z} : f(z) = 1\} \). The nth shatter coefficient of \( \mathcal{F} \) is \( \mathbb{S}_n(\mathcal{F}) = \mathbb{S}_n(\mathcal{C}_\mathcal{F}) \), and the VC dimension of \( \mathcal{F} \) is defined as \( V(\mathcal{F}) = V(\mathcal{C}_\mathcal{F}) \).

In light of these definitions, we can equivalently speak of the VC dimension of a class of sets or a class of binary-valued functions.

2 Examples of Vapnik–Chervonenkis classes

2.1 Semi-infinite intervals

Let \( Z = \mathbb{R} \) and take \( \mathcal{C} \) to be the class of all intervals of the form \((-\infty, t] \) as \( t \) varies over \( \mathbb{R} \). We will prove that \( V(\mathcal{C}) = 1 \). In view of Lemma 1, it suffices to show that (1) any one-point set \( S = \{a\} \) is shattered by \( \mathcal{C} \), and (2) no two-point set \( S = \{a, b\} \) is shattered by \( \mathcal{C} \).

Given \( S = \{a\} \), choose any \( t_1 < a \) and \( t_2 > a \). Then \((-\infty, t_1] \cap S = \emptyset \) and \((-\infty, t_2] \cap S = S \). Thus, \( S \) is shattered by \( \mathcal{C} \). This holds for every one-point set \( S \), and therefore we have proved (1). To prove (2), let \( S = \{a, b\} \) and suppose, without loss of generality, that \( a < b \). Then there exists no \( t \in \mathbb{R} \) such that \((-\infty, t] \cap S = \{b\} \). This follows from the fact that if \( b \in (-\infty, t] \cap S \), then \( t \geq b \). Since \( b > a \), we must have \( t > a \), so that \( a \in (-\infty, t] \cap S \) as well. Since \( a \) and \( b \) are arbitrary, we see that no two-point subset of \( \mathbb{R} \) can be shattered by \( \mathcal{C} \).

2.2 Closed intervals

Again, let \( Z = \mathbb{R} \) and take \( \mathcal{C} \) to be the class of all intervals of the form \([s, t] \) for all \( s, t \in \mathbb{R} \). Then \( V(\mathcal{C}) = 2 \). To see this, we will show that (1) any two point set \( S = \{a, b\} \) can be shattered by \( \mathcal{C} \) and that (2) no three-point set \( S = \{a, b, c\} \) can be shattered by \( \mathcal{C} \).

For (1), let \( S = \{a, b\} \) and suppose, without loss of generality, that \( a < b \). Choose four points \( t_1, t_2, t_3, t_4 \in \mathbb{R} \) such that \( t_1 < t_2 < a < t_3 < b < t_4 \). There are four subsets of \( S \): \( \emptyset, \{a\}, \{b\}, \) and \( \{a, b\} = S \). Then

\[
[t_1, t_2] \cap S = \emptyset, \quad [t_2, t_3] \cap S = \{a\}, \quad [t_3, t_4] \cap S = \{b\}, \quad [t_1, t_4] \cap S = S.
\]

Hence, \( S \) is shattered by \( \mathcal{C} \). This holds for every two-point set in \( \mathbb{R} \), which proves (1). To prove (2), let \( S = \{a, b, c\} \) be an arbitrary three-point set with \( a < b < c \). Then the intersection of any \([t_1, t_2] \in \mathcal{C} \) with \( S \) containing \( a \) and \( c \) must necessarily contain \( b \) as well. This shows that no three-point set can be shattered by \( \mathcal{C} \), so by Lemma 1 we conclude that \( V(\mathcal{C}) = 2 \).

2.3 Closed halfspaces

Let \( Z = \mathbb{R}^2 \), and let \( \mathcal{C} \) consist of all closed halfspaces, i.e., sets of the form

\[
[z = (z_1, z_2) \in \mathbb{R}^2 : w_1 z_1 + w_2 z_2 \geq b]
\]

for all choices of \( w_1, w_2, b \in \mathbb{R} \) such that \((w_1, w_2) \neq (0, 0)\). Then \( V(\mathcal{C}) = 3 \).
To see that $S_3(\mathcal{C}) = 2^3 = 8$, it suffices to consider any set $S = \{z_1, z_2, z_3\}$ of three non-collinear points. Then it is not hard to see that for any $S' \subseteq S$ it is possible to choose a closed halfspace $C \in \mathcal{C}$ that would contain $S'$, but not $S$. To see that $S_4(\mathcal{C}) < 2^4$, we must look at all four-point sets $S = \{z_1, z_2, z_3, z_4\}$. There are two cases to consider:

1. One point in $S$ lies in the convex hull of the other three. Without loss of generality, let’s suppose that $z_1 \in \text{conv}(S')$ with $S' = \{z_2, z_3, z_4\}$. Then there is no $C \in \mathcal{C}$ such that $C \cap S = S'$. The reason for this is that every $C \in \mathcal{C}$ is a convex set. Hence, if $S' \subset C$, then any point in $\text{conv}(S')$ is contained in $C$ as well.

2. No point in $S$ is in the convex hull of the remaining points. This case, when $S$ is an affinely independent set, is shown in Figure 1. Let us partition $S$ into two disjoint subsets, $S_1$ and $S_2$, each consisting of “opposite” points. In the figure, $S_1 = \{z_1, z_3\}$ and $S_2 = \{z_2, z_4\}$. Then it is easy to see that there is no halfspace $C \in \mathcal{C}$ whose boundary could separate $S_1$ from its complement $S_2$. This is, in fact, the (in)famous “XOR counterexample” of Minsky and Papert [MP69], which has demonstrated the impossibility of universal concept learning by one-layer perceptrons.

Since any four-point set in $\mathbb{R}^2$ falls under one of these two cases, we have shown that no such set can be shattered by $\mathcal{C}$. Hence, $V(\mathcal{C}) = 3$.

More generally, if $Z = \mathbb{R}^d$ and $\mathcal{C}$ is the class of all closed halfspaces

$$\left\{ z \in \mathbb{R}^d : \sum_{j=1}^{d} w_j z_j \geq b \right\}$$

for all $w = (w_1, \ldots, w_d) \in \mathbb{R}^d$ such that at least one of the $w_j$’s is nonzero and all $b \in \mathbb{R}$, then $V(\mathcal{C}) = d + 1$ [WD81]; we will see a proof of this fact shortly.

### 2.4 Axis-parallel rectangles

Let $Z = \mathbb{R}^2$, and let $\mathcal{C}$ consist of all “axis-parallel” rectangles, i.e., sets of the form $C = [a_1, b_1] \times [a_2, b_2]$ for all $a_1, b_1, a_2, b_2 \in \mathbb{R}$. Then $V(\mathcal{C}) = 4$. 

![Figure 1: Impossibility of shattering an affinely independent four-point set in $\mathbb{R}^2$ by closed halfspaces.](image-url)
First we exhibit a four-point set $S = \{z_1, z_2, z_3, z_4\}$ that is shattered by $\mathcal{C}$. It suffices to take $z_1 = (-2, -1), z_2 = (1, -2), z_3 = (2, 1), z_4 = (-1, 2)$. To show that no five-point set is shattered by $\mathcal{C}$, consider an arbitrary $S = \{z_1, z_2, z_3, z_4, z_5\}$. Of these, pick any one point with the smallest first coordinate and any one point with the largest first coordinate, and likewise for the second coordinate (refer to Figure 2), for a total of at most four. Let $S' \subseteq S$ denote the set consisting of these points; in Figure 2, $S' = \{z_1, z_2, z_3, z_4\}$. Then it is easy to see that any $C \in \mathcal{C}$ that contains the points in $S'$ must contain all the points in $S \setminus S'$ as well. Hence, no five-point set in $\mathbb{R}^2$ can be shattered by $\mathcal{C}$, so $V(\mathcal{C}) = 5$.

The same argument also works for axis-parallel rectangles in $\mathbb{R}^d$, i.e., all sets of the form $C = [a_1, b_1] \times [a_2, b_2] \times \ldots \times [a_d, b_d]$, leading to the conclusion that the VC dimension of the set of all axis-parallel rectangles in $\mathbb{R}^d$ is equal to $2d$.

2.5 Sets determined by finite-dimensional function spaces

The following result is due to Dudley [Dud78]. Let $Z$ be arbitrary, and let $\mathcal{G}$ be an $m$-dimensional linear space of functions $g : Z \to \mathbb{R}$, which means that each $g \in \mathcal{G}$ has a unique representation of the form

$$g = \sum_{j=1}^{m} c_j \psi_j,$$

where $\psi_1, \ldots, \psi_m : Z \to \mathbb{R}$ form a fixed linearly independent set and $c_1, \ldots, c_m$ are real coefficients. Consider the class

$$\mathcal{C} = \{\{z \in Z : g(z) \geq 0\} : g \in \mathcal{G}\}.$$

Then $V(\mathcal{C}) \leq m$.

To prove this, we need to show that no set of $m + 1$ points in $Z$ can be shattered by $\mathcal{C}$. To that end, let us fix $m + 1$ arbitrary points $z_1, \ldots, z_{m+1} \in Z$ and consider the mapping $L : \mathcal{G} \to \mathbb{R}^{m+1}$ defined by

$$L(g) \triangleq \{g(z_1), \ldots, g(z_{m+1})\}.$$

It is easy to see that because $\mathcal{G}$ is a linear space, $L$ is a linear mapping, i.e., for any $g_1, g_2 \in \mathcal{G}$ and any $c_1, c_2 \in \mathbb{R}$ we have $L(c_1 g_1 + c_2 g_2) = c_1 L(g_1) + c_2 L(g_2)$. Since $\dim \mathcal{G} = m$, the image of $\mathcal{G}$ under $L$, i.e., the set

$$L(\mathcal{G}) = \{\{g(z_1), \ldots, g(z_{m+1})\} \in \mathbb{R}^{m+1} : g \in \mathcal{G}\},$$

Figure 2: Impossibility of shattering a five-point set by axis-parallel rectangles.
is a linear subspace of $\mathbb{R}^{m+1}$ of dimension at most $m$. This means that there exists some nonzero vector $v = (v_1, \ldots, v_{m+1}) \in \mathbb{R}^{m+1}$ orthogonal to $L(\mathcal{G})$, i.e., for every $g \in \mathcal{G}$

$$v_1 g(z_1) + \ldots + v_{m+1} g(z_{m+1}) = 0. \quad (3)$$

Without loss of generality, we may assume that at least one component of $v$ is strictly negative (otherwise we can take $-v$ instead of $v$ and still get (3)). Hence, we can rearrange the equality in (3) as

$$\sum_{i : v_i \geq 0} v_i g(z_i) = - \sum_{i : v_i < 0} v_i g(z_i), \quad \forall g \in \mathcal{G}. \quad (4)$$

Now let us suppose that $\mathbb{S}_{m+1}(\mathcal{C}) = 2^{m+1}$ and derive a contradiction. Consider a binary $(m+1)$-tuple $b = (b_1, \ldots, b_{m+1}) \in \{0, 1\}^{m+1}$, where $b_j = 1$ if and only if $v_j \geq 0$, and 0 otherwise. Since we assumed that $\mathbb{S}_{m+1}(\mathcal{C}) = 2^{m+1}$, there exists some $g \in \mathcal{G}$ such that

$$\{1|g(z_i)\geq0\}, \ldots, 1|g(z_{m+1})\geq0\} = b.$$

By our definition of $b$, this means that the left-hand side of (4) is nonnegative, while the right-hand side is negative, which is a contradiction. Hence, $\mathbb{S}_{m+1}(\mathcal{C}) < 2^{m+1}$, so $V(\mathcal{C}) \leq m$.

This result can be used to bound the VC dimension of many classes of sets:

- Let $\mathcal{C}$ be the class of all closed halfspaces in $\mathbb{R}^d$. Then any $C \in \mathcal{C}$ can be represented in the form $C = \{z : g(z) \geq 0\}$ for $g(z) = \langle w, z \rangle - b$ with some nonzero $w \in \mathbb{R}^d$ and $b \in \mathbb{R}$. The set $\mathcal{G}$ of all such affine functions on $\mathbb{R}^d$ is a linear space of dimension $d + 1$, so by the above result we have $V(\mathcal{C}) \leq d + 1$. In fact, we know that this holds with equality [WD81]. This can also be seen from the following result, due to Cover [Cov65]: Let $\mathcal{G}$ be the linear space of functions spanned by functions $\psi_1, \ldots, \psi_m$, and let $\{z_1, \ldots, z_n\} \subset Z$ be such that the vectors $\Psi(z_i) = (\psi_1(z_i), \ldots, \psi_m(z_i)), 1 \leq i \leq n$, form a linearly independent set. Then for the class of sets $\mathcal{C} = \{z : \psi(z) \geq 0 : z \in Z\}$ we have

$$|\{z \in \mathcal{C} : C \in \mathcal{C}\}| = \sum_{i=0}^{m-1} \binom{n-1}{i}.$$ 

The conditions needed for Cover’s result are seen to hold for indicators of halfspaces, so letting $n = m = d + 1$ we see that $\mathbb{S}_d(\mathcal{C}) = \sum_{i=0}^{d} \binom{d}{i} = 2^d$. Hence, $V(\mathcal{C}) = d + 1$.

- Let $\mathcal{C}$ be the class of all closed balls in $\mathbb{R}^d$, i.e., sets of the form

$$C = \{z \in \mathbb{R}^d : \|z - x\|^2 \leq r^2\},$$

where $x \in \mathbb{R}^d$ is the center of $C$ and $r \in \mathbb{R}^+$ is its radius. Then we can write $C = \{z : g(z) \geq 0\}$, where

$$g(z) = r^2 - \|z - x\|^2 = r^2 - \sum_{j=1}^{d} |z_j - x_j|^2. \quad (5)$$

Expanding the second expression for $g$ in (5), we get

$$g(z) = r^2 - \sum_{j=1}^{d} x_j^2 + 2 \sum_{j=1}^{d} x_j z_j - \sum_{j=1}^{d} z_j^2,$$

which can be written in the form $g(z) = \sum_{k=1}^{d+2} c_k \psi_k(z)$, where $\psi_1(z) = 1, \psi_k(z) = z_k$ for $k = 2, \ldots, d + 1$, and $\psi_{d+2} = \sum_{j=1}^{d} z_j^2$. It can be shown that the functions $\{\psi_k\}_{k=1}^{d+2}$ are linearly independent. Hence, $V(\mathcal{C}) \leq d + 2$. This bound, however, is not tight; as shown by Dudley [Dud79], the class of closed balls in $\mathbb{R}^d$ has VC dimension $d + 1$. 

6
2.6 VC dimension vs. number of parameters

Looking back at all these examples, one may get the impression that the VC dimension of a set of binary-valued functions is just the number of parameters. This is not the case. Consider the following one-parameter family of functions:

\[ g_\theta(z) \triangleq \sin(\theta z), \quad \theta \in \mathbb{R}. \]

However, the class of sets

\[ \mathcal{C} = \left\{ \{z \in \mathbb{R} : g_\theta(z) \geq 0 \} : \theta \in \mathbb{R} \right\} \]

has infinite VC dimension. Indeed, for any \( n \), any collection of numbers \( z_1, \ldots, z_n \in \mathbb{R} \), and any binary string \( b \in \{0, 1\}^n \), one can always find some \( \theta \in \mathbb{R} \) such that

\[ \text{sgn}(\sin(\theta z_i)) = \begin{cases} +1, & \text{if } b_i = 1 \\ -1, & \text{if } b_i = 0 \end{cases}. \]

3 Growth of shatter coefficients: the Sauer–Shelah lemma

The importance of VC classes in learning theory arises from the fact that, as \( n \) tends to infinity, the fraction of subsets of any \( \{z_1, \ldots, z_n\} \subset \mathbb{Z} \) that are shattered by a given VC class \( \mathcal{C} \) tends to zero. We will prove this fact in this section by deriving a sharp bound on the shatter coefficients \( S_n(\mathcal{C}) \) of a VC class \( \mathcal{C} \). This bound have been (re)discovered at least three times, first in a weak form by Vapnik and Chervonenkis [VC71] in 1971, then independently and in different contexts by Sauer [Sau72] and Shelah [She72] in 1972. In strict accordance with Stigler’s law of eponymy\(^1\), it is known in the statistical learning literature as the Sauer–Shelah lemma.

Before we state and prove this result, we will collect some preliminaries and set up some notation. Given integers \( n, d \geq 1 \), let

\[ \phi(n, d) \triangleq \begin{cases} \sum_{i=0}^{d} \binom{n}{i}, & \text{if } n > d \\ 2^n, & \text{if } n \leq d \end{cases} \]

If we adopt the convention that \( \binom{n}{i} = 0 \) for \( i > n \), we can write

\[ \phi(n, d) = \sum_{i=0}^{d} \binom{n}{i} \]

for all \( n, d \geq 1 \). We will find the following recursive relation useful:

**Lemma 2.**

\[ \phi(n, d) = \phi(n - 1, d) + \phi(n - 1, d - 1). \]

**Proof.** We have

\[ \binom{n-1}{i-1} + \binom{n-1}{i} = \frac{(n-1)!}{(i-1)!(n-i)!} + \frac{(n-1)!}{i!(n-i-1)!}. \]

\(^1\)“No scientific discovery is named after its original discoverer” (http://en.wikipedia.org/wiki/Stigler’s_law_of_eponymy)
Multiplying both sides by \(i!(n-i)!\), we obtain
\[
i!(n-i)! \left[ \binom{n-1}{i-1} + \binom{n-1}{i} \right] = i(n-1)! + (n-i)(n-1)! = n! \]
Hence,
\[
\binom{n-1}{i-1} + \binom{n-1}{i} = \frac{n!}{i!(n-i)!} = \binom{n}{i}. \tag{6}
\]
Using the definition of \(\phi(n,d)\), as well as (6), we get
\[
\phi(n,d) = \sum_{i=0}^{d} \binom{n}{i} = 1 + \sum_{i=1}^{d} \binom{n-1}{i} = \sum_{i=1}^{d} \binom{n-1}{i-1} + \sum_{i=1}^{d} \binom{n-1}{i} = \phi(n-1,d) + \phi(n-1,d-1)
\]
and the lemma is proved. \(\square\)

Now for the actual result:

**Theorem 1** (Sauer–Shelah lemma). Let \(\mathcal{C}\) be a class of subsets of some space \(Z\) with \(V(\mathcal{C}) = d < \infty\). Then for all \(n\),

\[
\mathbb{S}_n(\mathcal{C}) \leq \phi(n,d). \tag{7}
\]

**Proof.** There are several different proofs in the literature; we will use an inductive argument following Blumer et al. [BEHW89].

We can assume, without loss of generality, that \(n > d\), for otherwise \(\mathbb{S}_n(\mathcal{C}) = 2^n = \phi(n,d)\). For an arbitrary finite set \(S \subset Z\), let

\[
\mathbb{S}(S,\mathcal{C}) \triangleq |\{S \cap C : C \in \mathcal{C}\}|,
\]

where, as before, we count only the distinct sets of the form \(S \cap C\). By definition, \(\mathbb{S}_n(\mathcal{C}) = \sup_{S:|S|\leq n} \mathbb{S}(S,\mathcal{C})\). Thus, it suffices the prove the following: For any \(S \subset Z\) with \(|S| = n > d\), \(\mathbb{S}(S,\mathcal{C}) \leq \phi(n,d)\).

For the purpose of computing \(\mathbb{S}(S,\mathcal{C})\), any two \(C_1, C_2 \in \mathcal{C}\) such that \(S \cap C_1 = S \cap C_2\) are deemed equivalent. Hence, let

\[
\mathcal{A} \triangleq \{A \subseteq S : A = S \cap C \text{ for some } C \in \mathcal{C}\}.
\]

Then we may write
\[
\mathbb{S}(S,\mathcal{C}) = |\{S \cap C : C \in \mathcal{C}\}| = |\{A \subseteq S : A = S \cap C \text{ for some } C \in \mathcal{C}\}| = |\mathcal{A}|.
\]

Moreover, it is easy to see that \(V(\mathcal{A}) \leq V(\mathcal{C}) = d\).

Thus, the desired result is equivalent to saying that if \(\mathcal{A}\) is a collection of subsets of an \(n\)-element set \(S\) (which we may, without loss of generality, take to be \([n] \triangleq \{1, \ldots, n\}\) with \(V(\mathcal{A}) \leq d < n\), then \(|\mathcal{A}| \leq \phi(n,d)\). We will prove this statement by “double induction” on \(n\) and \(d\). First of all, the statement (7) holds for all \(n \geq 1\) and \(d = 0\). Indeed, if \(V(\mathcal{A}) = 0\), then \(|\mathcal{A}| = 1 \leq 2^n\). Now assume that (7) holds for all \(n\) and all \(\mathcal{A}\) with \(V(\mathcal{A}) \leq d - 1\), and for all integers up to \(n - 1\) and all \(\mathcal{A}\) with \(V(\mathcal{A}) \leq d\). Now let \(S = [n]\), and let \(\mathcal{A}\) be a collection of subsets of \([n]\) with \(V(\mathcal{A}) = d < n\). We will show that \(|\mathcal{A}| \leq \phi(n,d)\).
To prove this claim, let us choose an arbitrary \( i \in S \) and define
\[
\mathcal{A} \setminus i \triangleq \{ A \setminus \{ i \} : A \in \mathcal{A} \}
\]
\[
\mathcal{A}_i \triangleq \{ A \in \mathcal{A} : i \not\in A, A \cup \{ i \} \in \mathcal{A} \}
\]
Observe that both \( \mathcal{A} \setminus i \) and \( \mathcal{A}_i \) are classes of subsets of \( S \setminus \{ i \} \). Moreover, since \( A \) and \( A \cup \{ i \} \) map to the same element of \( \mathcal{A} \setminus i \), while \( |\mathcal{A}_i| \) is the number of pairs of sets in \( \mathcal{A} \) that map into the same set in \( \mathcal{A} \setminus i \), we have
\[
|\mathcal{A}| = |\mathcal{A} \setminus i| + |\mathcal{A}_i|.
\]
(8)
Since \( \mathcal{A} \setminus i \subseteq \mathcal{A} \), we have \( V(\mathcal{A} \setminus i) \leq V(\mathcal{A}) \leq d \). Also, every set in \( \mathcal{A} \setminus i \) is a subset of \( S \setminus \{ i \} \), which has cardinality \( n - 1 \). Therefore, by the inductive hypothesis \( |\mathcal{A} \setminus i| \leq \phi(n - 1, d) \). Next, we show that \( V(\mathcal{A}_i) \leq d - 1 \). Suppose, to the contrary, that \( V(\mathcal{A}_i) = d \). Then there must exist some \( T \subseteq S \setminus \{ i \} \) with \( |T| = d \) that is shattered by \( \mathcal{A}_i \). But then \( T \cup \{ i \} \) is shattered by \( \mathcal{A} \). To see this, given any \( T' \subseteq T \) choose some \( A \in \mathcal{A}_i \) such that \( T \cap A = T' \) (this is possible since \( T \) is shattered by \( \mathcal{A}_i \)). But then \( A \cup \{ i \} \in \mathcal{A} \) (by definition of \( \mathcal{A}_i \)), and
\[
(T \cup \{ i \}) \cap (A \cup \{ i \}) = (T \cap A) \cup \{ i \} = T' \cup \{ i \}.
\]
Since this is possible for an arbitrary \( T' \subseteq T \), we conclude that \( T \cup \{ i \} \) is shattered by \( \mathcal{A} \). Now, since \( T \subseteq S \setminus \{ i \} \), we must have \( i \not\in T \), so \( |T \cup \{ i \}| = |T| + 1 = d + 1 \), which means that there exists a \( (d + 1) \)-element subset of \( S = [n] \) that is shattered by \( \mathcal{A} \). But this contradicts our assumption that \( V(\mathcal{A}) \leq d \). Hence, \( V(\mathcal{A}_i) \leq d - 1 \). Since \( \mathcal{A}_i \) is a collection of subsets of \( S \setminus \{ i \} \), we must have \( |\mathcal{A}_i| \leq \phi(n - 1, d - 1) \) by the inductive hypothesis. Hence, from (8) and from Lemma 2 we have
\[
|\mathcal{A}| = |\mathcal{A} \setminus i| + |\mathcal{A}_i| \leq \phi(n - 1, d) + \phi(n - 1, d - 1) = \phi(n, d).
\]
This completes the induction argument and proves (7). \( \square \)

**Corollary 1.** If \( \mathcal{C} \) is a collection of sets with \( V(\mathcal{C}) \leq d < \infty \), then
\[
\mathcal{S}_n(\mathcal{C}) \leq (n + 1)^d.
\]
Moreover, if \( n \geq d \), then
\[
\mathcal{S}_n(\mathcal{C}) \leq \left(\frac{en}{d}\right)^d,
\]
where \( e \) is the base of the natural logarithm.

**Proof.** For the first bound, write
\[
\phi(n, d) = \sum_{i=0}^{d} \binom{n}{i} = \frac{n!}{i!(n-i)!} \leq \sum_{i=1}^{d} \frac{n^i}{i!} \leq \sum_{i=0}^{d} \frac{n^i d!}{i!(d-i)!} = \sum_{i=0}^{d} \binom{d}{i} \binom{n}{i} = (n + 1)^d,
\]
where the last step uses the binomial theorem. On the other hand, if \( d/n \leq 1 \), then
\[
\left(\frac{d}{n}\right)^d \phi(n, d) = \left(\frac{d}{n}\right)^d \sum_{i=0}^{d} \binom{n}{i} \leq \sum_{i=1}^{n} \left(\frac{d}{n}\right)^i \binom{n}{i} \leq \sum_{i=1}^{n} \left(1 + \frac{d}{n}\right)^i \binom{n}{i} = \left(1 + \frac{d}{n}\right)^n \leq e^d,
\]
where we again used the binomial theorem. Dividing both sides by \( (d/n)^d \), we get the second bound. \( \square \)
Let $\mathcal{C}$ be a VC class of subsets of some space $Z$. From the above corollary we see that

$$\limsup_{n \to \infty} \frac{S_n(\mathcal{C})}{2^n} \leq \lim_{n \to \infty} \frac{(n+1)^{V(\mathcal{C})}}{2^n} = 0.$$ 

In other words, as $n$ becomes large, the fraction of subsets of an arbitrary $n$-element set $\{z_1, \ldots, z_n\} \subset Z$ that are shattered by $\mathcal{C}$ becomes negligible. Moreover, combining the bounds of the corollary with the Finite Class Lemma for Rademacher averages, we get the following:

**Theorem 2.** Let $\mathcal{F}$ be a VC class of binary-valued functions $f : Z \to \{0, 1\}$ on some space $Z$. Let $Z^n$ be an i.i.d. sample of size $n$ drawn according to an arbitrary probability distribution $P \in \mathcal{P}(Z)$. Then

$$\mathbb{E} R_n(\mathcal{F}(Z^n)) \leq 2 \sqrt{\frac{V(\mathcal{F}) \log(n+1)}{n}}.$$ 

A more refined chaining technique \cite{Dud78} can be used to remove the logarithm in the above bound:

**Theorem 3.** There exists an absolute constant $C > 0$, such that under the conditions of the preceding theorem

$$\mathbb{E} R_n(\mathcal{F}(Z^n)) \leq C \sqrt{\frac{V(\mathcal{F})}{n}}.$$ 

**References**


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