

1 The Orthogonal Vectors Conjecture

In this chapter we have used the 3SUM conjecture as a hardness assumption to obtain quadratic lower bounds. There is one other candidate for a hardness assumption to obtain quadratic lower bounds:

The Orthogonal Vectors Conjecture

Problem 1 *Orthogonal Vectors (OV)*

INSTANCE : \mathbf{n} vectors in $\{0, 1\}^{\mathbf{d}}$ where $\mathbf{d} = O(\log \mathbf{n})$.

QUESTION : Do two of the vectors have an inner product that is 0 mod 2?

A naive algorithm for OV solves it in time $O(\mathbf{n}^2 \mathbf{d})$ by trying all possible pairs. Abboud et al. [2] obtained the following slight improvement.

Theorem 1 *There is a randomized algorithm of OV that runs in time $O(\mathbf{n}^{2-\Omega(\frac{1}{\log(\frac{\mathbf{d}}{\mathbf{n}})})})$.*

There are no known algorithms for the problem that run in time $\mathbf{n}^{2-\epsilon}$ for some $\epsilon > 0$. This leads to the following conjecture, due to Williams [11]. See also Abboud et al. [3], Backurs et al. [4], and Abboud et al. [1]

Conjecture 1 The Orthogonal Vectors Conjecture (OVC) *For all $\epsilon > 0$, there is a $c \geq 1$ such that OV cannot be solved in time $\mathbf{n}^{2-\epsilon}$ on instances with $\mathbf{d} = c \log(\mathbf{n})$.*

We now have several conjectures with rather concrete bounds in them: ETH, SETH, 3SUM, and now OVC. Clearly $\text{SETH} \implies \text{ETH}$. Are any other implications known? Yes. Williams [11] showed the following.

Theorem 2 $\text{SETH} \implies \text{OVC}$.

The lack of any subquadratic algorithm for OV, and Theorem 2, are evidence for OVC. In addition, OVC holds in several restricted computational models. Kane & Williams [9] show:

1. OV has branching complexity $\tilde{\Theta}(\mathbf{n} \cdot \min(\mathbf{n}, 2^{\mathbf{d}}))$ for all sufficiently large \mathbf{n}, \mathbf{d} . (Recall that $\tilde{\Theta}(f(\mathbf{n}))$ means that we ignore log factors.)
2. OV has Boolean formula complexity $\tilde{\Theta}(\mathbf{n} \cdot \min(\mathbf{n}, 2^{\mathbf{d}}))$ over all complete bases of $O(1)$ fan-in.

3. OV requires $\tilde{\Theta}(n \cdot \min(n, 2^d))$ wires, in formulas comprised of gates computing arbitrary symmetric functions of unbounded fan-in.

1.1 What Does OVC Imply and Vice Versa

Theorem 3 *Assume OVC. Then the following problems do not have subquadratic algorithms.*

1. *(Backurs & Indyk [4]) Edit Distance: Given 2 strings \mathbf{x}, \mathbf{y} how many times do you need to delete or insert or replace a letter from either so that at the end the resulting strings are the same. (There are many variants depending on what operations are allowed.)*
2. *(Bringmann [6]) Frechet Distance: This is a measure of similarity between two curves that takes into account the location and ordering of the points on the curve. The formal definition is rather long so we omit it.*
3. *(Backurs & Indyk [5]) Regular Expression Matching: Given a regular expression \mathbf{p} and a string \mathbf{t} , does \mathbf{p} generate some substring of \mathbf{t} .*
4. *(Roditty & V. Williams [10]) Approximating the diameter of a graph: See Definition ??.*
5. *(Burchin et al. [7]) Curve Simplification: This has to do with finding a polygonal curve that is close to the origina. The formal definition is rather long so we omit it.*

While the above results show that many problems are subquadratic assuming OV is subquadratic, this does not necessarily imply that they are *equivalent* to OV. Hence Chen & Williams [8] study equivalences between OV and different problems. They showed the following.

Theorem 4 *Each of the following problems is subquadratic-equivalent to OV.*

1. *Min-IP: Given n blue vectors in $\{0, 1\}^d$, and n red vectors in $\{0, 1\}^d$, find the red-blue pair of vectors with minimum inner product.*
2. *Max-IP: Given n blue vectors in $\{0, 1\}^d$, and n red vectors in $\{0, 1\}^d$, find the red-blue pair of vectors with maximum inner product.*

3. *Equals-IP*: Given n blue vectors in $\{0, 1\}^d$, and n red vectors in $\{0, 1\}^d$, and an integer k , find a red-blue pair of vectors with inner product k , or report that none exists.
4. *Red-Blue-Closest Pair*: Let $p \in [1, 2]$ and $d = n^{o(1)}$. Approximating the ℓ_p -closest red-blue pair among n red points and n blue points in \mathbb{R}^d .

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