# **The Method of Multiplicities**

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Based on joint works with:

- V. Guruswami '98
- S. Saraf '08
- Z. Dvir, S. Kopparty, S. Saraf '09

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## Kakeya Sets

- K ⊂ F<sup>n</sup> is a Kakeya set if it has a line in every direction.
  - I.e.,  $\forall y \in F^n \exists x \in F^n$  s.t.  $\{x + t.y | t \in F\} \subset K$
  - F is a field (could be Reals, Rationals, Finite).
- Our Interest:
  - $F = F_q$  (finite field of cardinality q).
  - Lower bounds.
  - Simple/Obvious:  $q^{n/2} \le K \le q^n$
  - Do better? Mostly open till [Dvir 2008].

#### **Randomness Mergers**

- General primitive useful in the context of manipulating randomness.
  - Given: k (possibly dependent) random variables X<sub>1</sub> ... X<sub>k</sub>, such that one is uniform over its domain,
  - Add: small seed S (Additional randomness)
  - Output: a uniform random variable Y.

#### **Merger Analysis Problem**

 Merger(X<sub>1</sub>,...,X<sub>k</sub>; s) = f(s), where X<sub>1</sub>, ..., X<sub>k</sub> ∈ F<sub>q</sub><sup>n</sup>; s ∈ F<sub>q</sub> and f is deg. k-1 function mapping F → F<sup>n</sup> s.t. f(i) = X<sub>i</sub>.
 (f is the curve through X<sub>1</sub>,...,X<sub>k</sub>)

- Question: For what choices of q, n, k is Merger's output close to uniform?
- Arises from [DvirWigderson '08].
  - Statistical high-deg. version of Kakeya problem.

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#### List-decoding of Reed-Solomon codes

- Given L polynomials P<sub>1</sub>,...,P<sub>L</sub> of degree d; and sets S<sub>1</sub>,...,S<sub>L</sub> ⊂ F × F s.t.
  - $|S_i| = t$ ■  $S_i \subset \{(x, P_i(x)) | x \in F\}$
  - How small can n = |S| be, where  $S = \bigcup_i S_i$ ?
- Problem arises in "List-decoding of RS codes"
  - Algebraic analysis from [S. '96, GuruswamiS'98] basis of decoding algorithms.

#### What is common?

- Given a set in F<sub>q</sub><sup>n</sup> with nice algebraic properties, want to understand its size.
  - Kakeya Problem:
    - The Kakeya Set.
  - Merger Problem:
    - Any set  $T \subset F^n$  that contains  $\epsilon$ -fraction of points on  $\epsilon$ -fraction of merger curves.
    - If T small, then output is non-uniform; else output is uniform.
  - List-decoding problem:
     The union of the sets.

#### List-decoding analysis [S '96]

• Can Show:  $t > n/L + dL \Rightarrow (y - P_i(x)) | Q$ 

 Conclude: n ≥ L (t - dL).
 (Can be proved combinatorially also; using inclusion-exclusion)
 If L > t/(2d), yield n ≥ t²/(4d)

## Kakeya Set analysis [Dvir '08]

- Find Q(x\_1,...,x\_n) \ne 0 s.t.
  - Total deg. of Q < q (let deg. = d)</p>

• Q(x) = 0 for every  $x \in K$ . (exists if  $K < q^n/n!$ )

- Prove that homogenous deg. d part of Q vanishes on y, if there exists a line in direction y that is contained in K.
  - Line  $L \subset K \Rightarrow Q|_{L} = 0$ .
  - Highest degree coefficient of Q|<sub>L</sub> is homogenous part of Q evaluated at y.
- Conclude: homogenous part of Q = 0. ><.</p>
- Yields |K| \geq q^n/n!.

# Improved L-D. Analysis [G.+S. '98]

- Can we improve on the inclusion-exclusion bound? Working when t < dL?</p>
- Idea: Try fitting a polynomial Q that passes through each point with "multiplicity" 2.
  - Can find with deg\_y < L, deg\_x < 3n/L.</p>
  - If 2t > 3n/L + dL then (y-P\_i(x)) | Q.
  - Yields n ≥ (L/3).(2t dL)
  - If L>t/d, then  $n \ge t^2/(3d)$ .
- Optimizing Q; letting mult.  $\rightarrow \infty$ , get  $n \ge t^2/d$

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#### Aside: Is the factor of 2 important?

- Results in some improvement in [GS] (allowed us to improve list-decoding for codes of high rate) ...
- But crucial to subsequent work
  - [Guruswami-Rudra] construction of rateoptimal codes: Couldn't afford to lose this factor of 2 (or any constant > 1).

# Multiplicity = ?

- Over reals: f(x,y,z) has root of multiplicity m at (a,b,c) if every partial derivative of order up to m-1 vanishes at 0.
- Over finite fields?
  - Derivatives don't work; but "Hasse derivatives" do. What are these? Later...
  - There are {m + n choose n} such derivatives, for n-variate polynomials;

Each is a linear function of coefficients of f.

# Multiplicities in Kakeya [Saraf,S '08]

- Back to K ⊂ F<sup>n</sup>. Fit Q that vanishes often?
  - Works!
  - Can find Q ≠ 0 of individual degree < q, that vanishes at each point with multiplicity n, provided |K| 4<sup>n</sup> < q<sup>n</sup>
  - $\mathbf{Q}_{\mathsf{L}} \text{ is of degree} < qn.$
  - But it vanishes with multiplicity n at q points!
  - So it is identically zero ⇒ its highest degree coeff. is zero. ><</p>
- Conclude: |K| ≥ (q/4)<sup>n</sup>

# **Comparing the bounds**

- Simple:  $|K| \ge q^{n/2}$
- [Dvir]: |K| ≥ q<sup>n</sup>/n!
- [SS]: |K| ≥ q<sup>n</sup>/4<sup>n</sup>
- [SS] improves Simple even when q (large) constant and n → ∞ (in particular, allows q < n)</li>
- [MockenhauptTao, Dvir]:  $\exists K \text{ s.t. } |K| \leq q^n/2^{n-1} + O(q^{n-1})$
- Can we do even better?
- Improve Merger Analysis?

#### **Concerns from Merger Analysis**

# Recall Merger (X<sub>1</sub>,...,X<sub>k</sub>; s) = f(s), where X<sub>1</sub>, ..., X<sub>k</sub> ∈ F<sub>q</sub><sup>n</sup>; s ∈ F<sub>q</sub> and f is deg. k-1 curve s.t. f(i) = X<sub>i</sub>. [DW08] Say X<sub>1</sub> random; Let K be such that *ε* fraction of choices of X<sub>1</sub>,...,X<sub>k</sub> lead to "bad" curves such that *ε* fraction of s's such that Merger outputs value in K with high probability.

- Build low-deg. poly Q vanishing on K; Prove for "bad" curves, Q vanishes on curve; and so Q vanishes on e-fraction of X<sub>1</sub>'s (and so e-fraction of domain).
- Apply Schwartz-Zippel. ><</p>

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#### **Concerns from Merger Analysis**

- [DW] Analysis: Works only if q > n.
  - So seed length =  $\log_2 q > \log_2 n$
  - Not good enough for setting where k = O(1), and  $n \to \infty$ .
  - Would like seed length to be O(log k)).
- Multiplicty technique: Seems to allow q < n.</p>
  - But doesn't seem to help ...
  - Degrees of polynomials at most qn;
  - Limits multiplicities.

# General obstacle in multiplicity method

- Can't force polynomial Q to vanish with too high a multiplicity. Gives no benefit.
- E.g. Kakeya problem: Why stop at mult = n?
  - Most we can hope from Q is that it vanishes on all of q<sup>n</sup>;
  - Once this happens, Q = 0, if its degree is < q in each variable.
  - So Q|\_L is of degree at most qn, so mult n suffices. Using larger multiplicity can't help!
  - Or can it?

# **Extended method of multiplicities**

- In Kakeya context):
  - Perhaps Q can be shown to vanish with high multiplicity at each point in F<sup>n</sup>.
     (Technical question: How?)
  - Perhaps vanishing of Q with high multiplicity at each point shows higher degree polynomials (deg > q in each variable) are identically zero?
     Needed: An extension of Schwartz-Zippel.)

# **Multiplicities?**

- Q(X<sub>1</sub>,...,X<sub>n</sub>) has zero of mult. m at a = (a<sub>1</sub>,...,a<sub>n</sub>) if all (Hasse) derivatives of order < m vanish.</p>
- Hasse derivative = ?
  - Formally defined in terms of coefficients of Q, various multinomial coefficients and a.
  - But really ...
    - The i = (i1,..., in)th derivative is the coefficient of z<sub>1</sub><sup>i1</sup>...z<sub>n</sub><sup>in</sup> in Q(z + a).
  - Even better ... coeff. of z<sup>i</sup> in Q(z+x)
    - (defines ith derivative Q<sub>i</sub> as a function of x; can evaluate at x = a).

## **Key Properties**

- Each derivative is a linear function of coefficients of Q. [Used in [GS'98], [SS'09].] (Q+R)<sub>i</sub> = Q<sub>i</sub> + R<sub>i</sub>
- Q has zero of mult m at a, and S is a curve that passes through a, then Q|<sub>S</sub> has zero of mult m at a. [Used for lines in prior work.]
- Q<sub>i</sub> is a polynomial of degree deg(Q) ∑<sub>j</sub> i<sub>i</sub> (not used in prior works)
- $(Q_i)_j \neq Q_{i+j}$ , but  $Q_{i+j}(a) = 0 \Rightarrow (Q_i)_j(a) = 0$
- Q vanishes with mult m at a  $\Rightarrow Q_i$  vanishes with mult m -  $\sum_j i_i$  at a.

# Propagating multiplicities (in Kakeya)

- Find Q that vanishes with mult m on K
- For every i of order m/2, Q\_i vanishes with mult m/2 on K.
- Conclude: Q, as well as all derivatives of Q of order m/2 vanish on F<sup>n</sup>

 $\Rightarrow$  Q vanishes with multiplicity m/2 on F<sup>n</sup>

Next Question: When is a polynomial (of deg > qn, or even q<sup>n</sup>) that vanishes with high multiplicity on q<sup>n</sup> identically zero?

# Vanishing of high-degree polynomials

- Mult(Q,a) = multiplicity of zeroes of Q at a.
- I(Q,a) = 1 if mult(Q,a) > 0 and 0 o.w. = min{1, mult(Q,a)}
- Schwartz-Zippel: for any S ⊂ F
  ∑ I(Q,a) ≤ d. |S|<sup>n-1</sup> where sum is over a ∈ S<sup>n</sup>
- Can we replace I with mult above? Would strengthen S-Z, and be useful in our case.
- [DKSS '09]: Yes ... (simple inductive proof ... that I can't remember)

#### **Back to Kakeya**

- Find Q of degree d vanishing on K with mult m. (can do if (m/n)<sup>n</sup> |K| < (d/n)<sup>n</sup> ⇔ d<sup>n</sup> > m<sup>n</sup> |K| )
- Conclude Q vanishes on F<sup>n</sup> with mult. m/2.
- Apply Extended-Schwartz-Zippel to conclude

(m/2) q<sup>n</sup> < d q<sup>n-1</sup>

$$\Leftrightarrow$$
 (m/2)<sup>n</sup> q<sup>n</sup> < d<sup>n</sup> = m<sup>n</sup> |K|

- Conclude: |K| ≥ (q/2)<sup>n</sup>
- Tight to within 2+o(1) factor!

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#### **Consequences for Mergers**

- Can analyze [DW] merger when q very small, n,k growing;
  - Analysis similar, more calculations.
  - Yields: Seed length log q (independent of n, k).
- By combining it with every other ingredient in extractor construction:
  - Get extractors to extract k o(k) bits of randomness from (n,k) sources using O(log n) seed (for the first time).

# Conclusions

- Method of multiplicities
  - Extends power of algebraic techniques beyond "low-degree" polynomials.
  - Key ingredient: Extended Schwartz-Zippel lemma.
  - Gives applications to
    - Kakeya Sets: Near tight bounds
    - Extractors: State of the art constructions
    - RS List-decoding: Reproves known bounds.
- Open:
  - Other applications? Why does it work?

# **Thank You**

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