# Linear-algebraic pseudorandomness: Subspace Designs \& Dimension Expanders 

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Simons workshop on "Proving and Using Pseudorandomness" March 8, 2017

Based on a body of work, with
Chaoping Xing, Swastik Kopparty, Michael Forbes, Chen Yuan

## Linear-algebraic pseudorandomness

Aim to understand the linear-algebraic analogs of fundamental Boolean pseudorandom objects, with rank of subspaces playing the role of size of subsets.

## Examples

Rank-metric codes, Dimension expanders, subspace-evasive sets, rank-preserving condensers, subspace designs, etc.

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## Examples

Rank-metric codes, Dimension expanders, subspace-evasive sets, rank-preserving condensers, subspace designs, etc.

Motivation: Intrinsic interest + diverse applications (to Ramsey graphs, list decoding, affine extractors, polynomial identity testing, network coding, space-time codes, ...)

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Fix a vector space $\mathbb{F}^{n}$ over a field $\mathbb{F}$.

## Dimension expanders

A collection of $d$ linear maps $A_{1}, A_{2}, \ldots, A_{d}: \mathbb{F}^{n} \rightarrow \mathbb{F}^{n}$ is said to be an $(b, \alpha)$-dimension expander if for all subspaces $V$ of $\mathbb{F}^{n}$ of dimension $\leqslant b$,

$$
\operatorname{dim}\left(\sum_{i=1}^{d} A_{i}(V)\right) \geqslant(1+\alpha) \operatorname{dim}(V)
$$

- $d$ is the "degree" of the dim. expander, and $\alpha$ the "expansion factor."


## Constructing dimension expanders

( $b, \alpha$ )-dimension expander: $\forall V, \operatorname{dim}(V) \leqslant b$, $\operatorname{dim}\left(\sum_{i=1}^{d} A_{i}(V)\right) \geqslant(1+\alpha) \operatorname{dim}(V)$.

## Random constructions

Easy to construct probabilistically. For large $n$, w.h.p.

- A collection of 10 random maps is an $\left(\frac{n}{2}, \frac{1}{2}\right)$-dim. expander.
- A collection of $d$ random maps is an $\left(\frac{n}{2 d}, d-O(1)\right)$-dim. expander with high probability ("lossless" expansion).


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## Challenge

Explicit constructions (i.e., deterministic poly $(n)$ time construction of the maps $A_{i}$ ).

- Say of $O(1)$ degree $(\Omega(n), \Omega(1))$-dimension expanders.

We'll return to dimension expanders, but let's first talk about "subspace designs," our main topic.

## Plan

## Subspace designs:

- Why we defined them?
- Definition
- How to construct them?
- Applications in linear-algebraic pseudorandomness


## Subspace designs: Original Motivation

Reducing the output list size in list decoding algorithms for (variants of) Reed-Solomon and Algebraic-Geometric codes.

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## Reed-Solomon codes

(mapping $k$ symbols to $n$ symbols over field $\mathbb{F},|\mathbb{F}| \geqslant n$ ):

$$
f \in \mathbb{F}[X]_{<k} \mapsto\left(f\left(a_{1}\right), f\left(a_{2}\right), \ldots, f\left(a_{n}\right)\right),
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for $n$ distinct elements $a_{i} \in \mathbb{F}$.

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for $n$ distinct elements $a_{i} \in \mathbb{F}$.

Distance of the code $=n-k+1 \Longrightarrow$ even if $(n-k) / 2$ worst-case errors occur, one can recover the original polynomial unambiguously.

- Plus, efficient algorithms to do this
[Peterson'60,Berlekamp'68,Massey'69,...,Welch-Berlekamp'85,...]
For larger number of errors, can resort to list decoding.


## List decoding RS codes

Reed-Solomon codes can be list decoded up to $n-\sqrt{k n}$ errors, which always exceeds $(n-k) / 2$ [G.-Sudan'99]

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- $2 x$ improvement over unambiguous decoding.

Explicit such codes are also known

- Folded Reed-Solomon codes of [G.-Rudra'08] and follow-ups.
- Couple of such explicit code families motivated definition of subspace designs


## Reed-Solomon codes with evaluation points in a sub-field

Code maps

$$
f \in \mathbb{F}_{q^{m}}[X]_{<k} \mapsto\left(f\left(a_{1}\right), f\left(a_{2}\right), \ldots, f\left(a_{n}\right)\right) \in\left(\mathbb{F}_{q^{m}}\right)^{n},
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## Theorem (G.-Xing'13)

Linear-algebraic algorithm that given $r \in\left(\mathbb{F}_{q^{m}}\right)^{n}$, list decodes it up to radius $\frac{s}{s+1}(n-k)$, pinning down all candidate message polynomials $f(X)=f_{0}+f_{1} X+\cdots+f_{k-1} X^{k-1}$ to an $\mathbb{F}_{q}$-subspace of form:

$$
f_{i} \in W+A_{i}\left(f_{0}, \ldots, f_{i-1}\right), \quad i=0,1, \ldots, k-1
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for some $\mathbb{F}_{q}$-subspace $W \subset \mathbb{F}_{q^{m}}$ of dim. $s-1$, and $\mathbb{F}_{q}$-affine fns $A_{i}$.

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for some $\mathbb{F}_{q^{-}}$-subspace $W \subset \mathbb{F}_{q^{m}}$ of dim. $s-1$, and $\mathbb{F}_{q}$-affine fns $A_{i}$.

- Each $f_{i}$ belongs to affine shift of the same $(s-1)$-dimensional $W$
- \# solutions $=q^{(s-1) k} \ll q^{m k}$; exponential unless $s=1$ (unique decoding)
- Trade-off between decoding radius and list size by increasing $s$.


## Pruning the list

We have $f_{i} \in W+A_{i}\left(f_{0}, f_{1}, \ldots, f_{i-1}\right), i=0,1, \ldots, k-1 .\left(^{*}\right)$

## Pruning via "subspace design"

- Suppose we pre-code messages so that $f_{i} \in H_{i}$, where the $H_{i}$ 's are $\mathbb{F}_{q^{-}}$subspaces of $\mathbb{F}_{q^{m}}$.


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## Pruning via "subspace design"

- Suppose we pre-code messages so that $f_{i} \in H_{i}$, where the $H_{i}$ 's are $\mathbb{F}_{q^{-}}$-subspaces of $\mathbb{F}_{q^{m}}$.
- Dimension of solutions to $\left(^{*}\right)$ and $f_{i} \in H_{i}, \forall i$, becomes

$$
\sum_{i=0}^{k-1} \operatorname{dim}\left(W \cap H_{i}\right) .
$$

- Insist this is small (so in particular $W$ intersects few $H_{i}$ non-trivially), and also $\operatorname{dim}\left(H_{i}\right)=(1-\varepsilon) m$ to incur only minor loss in rate.


## Subspace Designs

Fix a vector space $\mathbb{F}_{q}^{m}$, and desired co-dimension $\varepsilon m$ of subspaces.

## Definition

A collection of subspaces $H_{1}, H_{2}, \ldots, H_{M} \subseteq \mathbb{F}_{q}^{m}$ (each of co-dimension $\varepsilon m$ ) is said to be an ( $s, \ell$ )-subspace design if for every s-dimensional subspace $W$ of $\mathbb{F}_{q}^{m}$,

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- Implies $W \cap H_{i} \neq\{0\}$ for at most $\ell$ subspaces: $(s, \ell)$-weak subspace design.
- Would like a large collection with small intersection bound $\ell$


## Existence of subspace designs

## Theorem (Probabilistic method) <br> For all fields $\mathbb{F}_{q}$ and $s \leqslant \varepsilon m / 2$, there is an $(s, 2 s / \varepsilon)$-subspace design with $q^{\Omega(\varepsilon m)}$ subspaces of $\mathbb{F}_{q}^{m}$ of co-dimension $\varepsilon m$. (A random collection has the subspace design property w.h.p.)

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List decoding application: Using such a subspace design for pre-coding will reduce dimension of solution space to $O\left(1 / \varepsilon^{2}\right)$ for list decoding up to radius $(1-\varepsilon)(n-k)$.

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## Goal

Explicit construction of subspace designs with similar parameters.

## Explicit subspace designs

## Theorem (Polynomials based construction (G.-Kopparty'13))

For $s \leqslant \varepsilon m / 4$ and $q>m$, an explicit collection of $q^{\Omega(\varepsilon m / s)}$ subspaces of co-dimension $\varepsilon m$ that form an $\left(s, \frac{2 s}{\varepsilon}\right)$-subspace design.

Almost matches probabilistic construction for large fields.

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Using extension fields and an $\mathbb{F}_{q}$-linear map to express elements of $\mathbb{F}_{q^{r}}$ as vectors in $\mathbb{F}_{q}^{r}$, can get construction of $(s, 2 s / \varepsilon)$-weak subspace design for all fields $\mathbb{F}_{q}$.

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$\Rightarrow$ These results give explicit optimal rate codes for list decoding over fixed alphabets and in the rank metric [G.-Xing'13, G.-Wang-Xing'15]. (The large collection is more important than strongness of subspace design for these applications.)

## Small field construction

The strongness of subspace design is, however, crucial for its application to dimension expanders (coming later).

## Cyclotomic function field based const. [G.-Xing-Yuan'16]

For $s \leqslant \varepsilon m / 4$, an explicit collection of $q^{\Omega(\varepsilon m / s)}$ subspaces of co-dimension $\varepsilon m$ that form an $\left(s, \frac{2 s\left[\log _{q} m\right\rceil}{\varepsilon}\right)$-subspace design.
(Leads to logarithmic degree dimension expanders for all fields.)

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## Open

Explicit $\omega(1)$-sized ( $s, O(s)$ )-subspace design of dimension $m / 2$ subspaces over any field $\mathbb{F}_{q}$.
(Would yield explicit constant degree dimension expanders.)

## Polynomial based subspace design construction

## Theorem <br> For parameters satisfying $s<t<m<q$, a construction of $\Omega\left(q^{r} / r\right)$ subspaces of $\mathbb{F}_{q}^{m}$ of co-dimension rt that form an $\left(s, \frac{(m-1) s}{r(t-s+1)}\right)$-subspace design.

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Taking $t=2 s$ and $r=\frac{\varepsilon m}{2 s}$ yields $(s, 2 s / \varepsilon)$-subspace design of co-dimension $\varepsilon m$ subspaces.

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Taking $t=2 s$ and $r=\frac{\varepsilon m}{2 s}$ yields $(s, 2 s / \varepsilon)$-subspace design of co-dimension $\varepsilon m$ subspaces.
Illustrate above theorem with 3 simplifications:
(1) Fix $r=1$
(2) Show weak subspace design property
(3) Assume char $\left(\mathbb{F}_{q}\right)>m$

## Theorem (Polynomial based subspace design, simplified)

Explicit ( $\left.s, \frac{(m-1) s}{t-s+1}\right)$-weak subspace design with $q$ co-dimension $t$ subspaces of $\mathbb{F}_{q}^{m}$, when $\operatorname{char}\left(\mathbb{F}_{q}\right)>m$.

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Warm-up: $s=1$ case
Further let $t=1$. Want $q$ subspaces of $\mathbb{F}_{q}^{m}$ of co-dimension 1 s.t. each nonzero $p \in \mathbb{F}_{q}^{m}$ is in at most $m-1$ of the subspaces.

- Identify $\mathbb{F}_{q}^{m}$ with $\mathbb{F}_{q}[X]_{<m}$.


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$s=1, t<m$ arbitrary:
- Define $H_{\alpha}=\left\{p \in \mathbb{F}_{q}[X]_{<m} \mid \operatorname{mult}(p, \alpha) \geqslant t\right\}$.
- A nonzero degree $<m$ polynomial has at most $(m-1) / t$ roots with multiplicity $t$.


## Polynomial based subspace design

## Theorem

For $s<t<m<\operatorname{char}\left(\mathbb{F}_{q}\right)$, the subspaces $H_{\alpha}=\left\{p \in \mathbb{F}_{q}[X]_{<m} \mid p(\alpha)=p^{\prime}(\alpha)=\cdots=p^{(t-1)}(\alpha)=0\right\}, \alpha \in \mathbb{F}_{q}$, form a $\left(s, \frac{(m-1) s}{t-s+1}\right)$-weak subspace design.

Proof sketch on board.

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Removing the 3 simplifications:
(1) General $r$ : Pick root points $\alpha \in \mathbb{F}_{q^{r}}$. (Co-dimension becomes $r$ t.)

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Removing the 3 simplifications:
(1) General $r$ : Pick root points $\alpha \in \mathbb{F}_{q^{r}}$. (Co-dimension becomes $r$.)
(2) Strong subspace design property: more careful analysis.
(3) Working with $q>m$ rather than $\operatorname{char}\left(\mathbb{F}_{q}\right)>m$ :

- $t$ structured roots instead of $t$ multiple roots.
- $H_{\alpha}=\left\{p \in \mathbb{F}_{q}[X]_{<m} \mid p(\alpha)=p(\alpha \gamma)=\cdots=p\left(\alpha \gamma^{t-1}\right)=0\right\}$ (where $\gamma$ is a primitive element of $\mathbb{F}_{q}$ ).


## Plan

## Subspace designs:

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- How to construct them?
- Applications in linear-algebraic pseudorandomness


## Subspace designs as rank condensers

Suppose $H_{i}=\operatorname{ker}\left(E_{i}\right)$ for condensing map $E_{i}: \mathbb{F}^{m} \rightarrow \mathbb{F}^{\varepsilon m}$.

- In our construction, the $E_{i}$ 's were polynomial evaluation maps (underlying folded Reed-Solomon/derivative codes).

Note $\operatorname{dim}\left(W \cap H_{i}\right)=\operatorname{dim}(W)-\operatorname{dim}\left(E_{i} W\right)$.

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## Lossless rank condenser

So $(s, \ell)$-weak subspace design property $\Longrightarrow$ for every s-dimensional $W, \operatorname{dim}\left(E_{i} W\right)=\operatorname{dim}(W)$ for all but $\ell$ maps. (So if size of subspace design is $>\ell$, at least one map preserves rank.)

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## Lossy rank condenser

$(s, \ell)$-subspace design property $\Longrightarrow$ for every $s$-dimensional $W$, $\operatorname{dim}\left(E_{i} W\right)<(1-\delta) \operatorname{dim}(W)$ for less than $\frac{\ell}{\delta s}$ maps. (So if size of subspace design is $\geqslant \frac{\ell}{\delta s}$, at least one map preserves rank up to $(1-\delta)$ factor.)

## Dimension expander via subspace designs

Fix a vector space $\mathbb{F}^{n}$ over a field $\mathbb{F}$.

## Dimension expanders

A collection of $d$ linear maps $A_{1}, A_{2}, \ldots, A_{d}: \mathbb{F}^{n} \rightarrow \mathbb{F}^{n}$ is said to be an $(b, \alpha)$-dimension expander if for all subspaces $V$ of $\mathbb{F}^{n}$ of dimension $\leqslant b$,

$$
\operatorname{dim}\left(\sum_{i=1}^{d} A_{i}(V)\right) \geqslant(1+\alpha) \operatorname{dim}(V)
$$

- $d$ is the "degree" of the dim. expander, and $\alpha$ the "expansion factor."


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- Tensoring: let $T_{1}(v)=(v, 0) \& T_{2}(v)=(0, v)$ be maps from $\mathbb{F}^{n} \rightarrow \mathbb{F}^{2 n}$. (These trivially double the rank using twice the ambient dimension.)


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- Condensing: Let $m=2 n$, and take a subspace design of $\frac{m}{2}$-dimensional subspaces in $\mathbb{F}^{m}$ with associated maps
$E_{1}, E_{2}, \ldots, E_{M}: \mathbb{F}^{2 n} \rightarrow \mathbb{F}^{n}$.
- Use the $2 M$ maps $E_{j} \circ T_{i}$ for dimension expansion.


## Analysis

Tensor-then-condense: $\mathbb{F}^{n} \xrightarrow{\text { tensor }} \mathbb{F}^{n} \otimes \mathbb{F}^{2}=\mathbb{F}^{2 n} \xrightarrow{\text { condense }} \mathbb{F}^{n}$

- Suppose (kernels of) condensing maps $E_{1}, E_{2}, \ldots, E_{M}: \mathbb{F}^{2 n} \rightarrow \mathbb{F}^{n}$ form a $(s, c s)$-subspace design.
- (Lossy condensing): If $M \geqslant 3 c$, for any $s$-dimensional subspace of $\mathbb{F}^{2 n}$, at least one $E_{j}$ has output rank $\frac{2 s}{3}$.
- Composition $E_{j} \circ T_{i}$ gives an $\left(\frac{s}{2}, \frac{1}{3}\right)$-dim. expander of degree $6 c$.


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## Consequences

(1) Polynomials based subspace design $\Rightarrow$ constant degree $\left(\Omega(n), \frac{1}{3}\right)$-dimension expander over $\mathbb{F}_{q}$ when $q \geqslant \Omega(n)$.

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(2) Cyclotomic function field based subspace design $\Rightarrow O(\log n)$ degree $\left(\frac{n}{\log \log n}, \frac{1}{3}\right)$-dim. expander over arbitrary finite fields.

## Dimension expanders: Prior (better) constructions

All guarantee expansion of subspaces of dimension up to $\Omega(n)$.
(1) [Lubotzky-Zelmanov'08] Construction for fields of characteristic zero (using property T of groups). Constant degree and expansion.

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- Construction via monotone expanders.
(3) [Dvir-Wigderson'10]: monotone expanders (and hence dimension expanders) of $\log ^{(c)} n$ degree.


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Our construction: Avoids reduction to monotone expanders; works entirely within linear-algebraic setting, where expansion should be easier rather than harder than graph vertex expansion.

## Degree vs expansion

Lossless expansion: Probabilistic construction with d linear maps achieves dimension expansion factor $d-O(1)$.

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## Challenge

Can one explicitly achieve dimension expansion $\Omega(d)$ ? Or even lossless expansion of $(1-\varepsilon) d$ ?

## Two-source rank condensers [Forbes-G. 15]

## Two-source condenser for rank $r$

We would like a (bilinear) map $f: \mathbb{F}^{n} \times \mathbb{F}^{n} \rightarrow \mathbb{F}^{m}$ such that for all subsets $A, B \subseteq \mathbb{F}^{n}$ with $\mathrm{rk}(A), \mathrm{rk}(B) \leqslant r, \mathrm{rk}(f(A \times B))$ is large:

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## Derandomizing tensor product

- $f(x, y)=x \otimes y$ is lossless with $m=n^{2}$.
- Would like smaller output.


## Lossless two-source rank condenser

## Lemma (Equivalence to rank-metric codes)

A bilinear map $f(x, y)=\left\langle x^{\top} E_{1} y, x^{\top} E_{2} y, \ldots, x^{\top} E_{m} y\right\rangle$ is a lossless two-source condenser for rank $r$ if and only if
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## Condensers with optimal output length

Gabidulin construction (analog of Reed-Solomon codes with linearized polynomials) gives distance $r+1$ rank-metric codes with $m=n r$, and this is best possible (for finite fields).

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Condense-then-tensor approach: Use subspace design to condense to $\mathbb{F}^{2 r}$ while preserving rank, and then tensor. Naively leads to output length $O\left(n r^{2}\right)$, but can eliminate linear dependencies to achieve output length $m=O(n r)$.

## Lossy two-source rank condensers

A random bilinear map $f: \mathbb{F}^{n} \times \mathbb{F}^{n} \rightarrow \mathbb{F}^{m}$ is a lossy 2-source condenser for rank $r$ when $m=C \cdot\left(n+r^{2}\right)$ for sufficiently large constant $C$.

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## Challenge

Give an explicit construction with $m=O(n)$ (for $r \ll \sqrt{n}$ ).

Condenser-then-tensor approach achieves $m=O(n r)$, which doesn't beat the bound for lossless condenser.

## Summary

- Emerging theory of pseudorandom objects dealing with rank of subspaces
- Subpace design a useful construct in this web of connections.
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Many open questions, such as:
(1) Better/optimal subspace designs over small fields; would lead to constant degree dimension expanders for all fields.
(2) Explicit lossy two-source rank condensers
(3) Construction of subspace evasive sets with polynomial intersection size.

