# Boolean function analysis: beyond the hypercube 

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## What is Boolean function analysis?

## Dimension-independent properties of functions $\{0,1\}^{n} \rightarrow\{0,1\}$

Many applications to combinatorics and computational complexity

## Motivating example: Erdős-Ko-Rado theorem

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Boolean almost degree 1 function is almost a dictator.

## Classical Boolean function analysis

## Fundamental theorem

Every function $f:\{ \pm 1\}^{n} \rightarrow \mathbb{R}$ has unique expansion as multilinear polynomial, the Fourier expansion:

$$
f\left(x_{1}, \ldots, x_{n}\right)=\sum_{S \subseteq[n]} \hat{f}(S) x_{S}, \quad \text { where } x_{S}=\prod_{i \in S} x_{i}
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Dictator: function depending on one coordinate. $d$-Junta: function depending on $d$ coordinates. $\operatorname{deg} f \leq d$ iff $f$ is linear combination of $d$-juntas.

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## Boolean almost degree 1 functions

## Refined question

Suppose $f:\{ \pm 1\}^{n} \rightarrow\{ \pm 1\}$ satisfies

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\underset{x \sim\{ \pm 1\}^{n}}{\mathbb{E}}\left[(f(x)-g(x))^{2}\right]=\epsilon
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for some $g:\{ \pm 1\}^{n} \rightarrow \mathbb{R}$ of degree 1 .
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## Friedgut-Kalai-Naor (FKN) theorem

Suppose $f:\{ \pm 1\}^{n} \rightarrow\{ \pm 1\}$ satisfies $\left\|f^{>1}\right\|^{2}=\epsilon$. Then

$$
\operatorname{Pr}[f \neq h]=O(\epsilon) \text { for some } h \in\left\{ \pm 1, \pm x_{1}, \ldots, \pm x_{n}\right\} .
$$

## Boolean function analysis on the slice

The slice or Johnson scheme is

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\binom{[n]}{k}=\left\{\left(x_{1}, \ldots, x_{n}\right) \in\{0,1\}^{n}: \sum_{i=1}^{n} x_{i}=k\right\}
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## Fundamental theorem (Dunkl)

Every function $f:\binom{[n]}{k} \rightarrow \mathbb{R}$ has unique expansion as multilinear polynomial $P$ of degree $\leq \min (k, n-k)$ such that

$$
\sum_{i=1}^{n} \frac{\partial P}{\partial x_{i}}=0
$$

Examples: $1,\left(x_{1}-x_{2}\right),\left(x_{1}-x_{2}\right)\left(x_{3}-x_{4}\right), \ldots$

## Degree of functions on the slice

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Degree of $f=$ degree of unique expansion.

Dictator theorem holds (except for trivial cases).
FKN theorem holds for $0 \ll k / n \ll 1$.

## Erdős-Ko-Rado theorem

Spectral argument of Lovász
Let $k=p n, p<1 / 2$.
If $\mathcal{F} \subset\binom{[n]}{k}$ is intersecting and $\mathcal{F}$ is not too small then

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|\mathcal{F}| \leq\binom{ n-1}{k-1}\left(1-C\left\|1_{\mathcal{F}}^{>1}\right\|^{2}\right)
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Dictator theorem: $\mathcal{F}$ is a star.
(3) $|\mathcal{F}|=(1-\epsilon)\binom{n-1}{k-1} \Longrightarrow\left\|1_{\mathcal{F}}^{>1}\right\|^{2}=O(\epsilon)$.

FKN theorem: $\mathcal{F}$ is $O(\epsilon)$-close to a star.

## FKN theorem for small $k$ ?

Let $p:=k / n=o(1)$ and $\epsilon \gg p^{2}$.
Consider $g:\binom{[n]}{k} \rightarrow \mathbb{R}$ defined as

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g:=x_{1}+\cdots+x_{\sqrt{\epsilon} / p}
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This shows that

- $\operatorname{Pr}[g=0] \approx 1-\sqrt{\epsilon}$.
- $\operatorname{Pr}[g=1] \approx \sqrt{\epsilon}-\epsilon$.
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Therefore

$$
g \stackrel{O(\epsilon)}{\approx} f:=x_{1} \vee \cdots \vee x_{\sqrt{\epsilon} / p}
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## FKN theorem for small $k$

FKN theorem on the slice ( F .)
Let $p:=k / n \leq 1 / 2$.
If $f:\binom{[n]}{k} \rightarrow\{0,1\}$ satisfies $\left\|f^{>1}\right\|^{2}=\epsilon$ then either $f$ or $1-f$ is $O(\epsilon)$-close to a disjunction of $m$ variables, where

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## Dictator theorem on the slice

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## Degree

$\operatorname{deg} f \leq d$ if $f$ can be written as degree $d$ polynomial in $x_{i j}$. $\operatorname{deg} f \leq d$ if $f$ is linear combination of indicators of events

$$
\pi\left(i_{1}\right)=j_{1}, \ldots, \pi\left(i_{d}\right)=j_{d} .
$$

## Boolean degree 1 functions on $S_{n}$

What are dictators in $S_{n}$ ?
Suppose $f: S_{n} \rightarrow\{0,1\}$ has degree 1 , i.e.,

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f=\sum_{i=1}^{n} \sum_{j=1}^{n} a_{i j} x_{i j}
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Two entries are mutually exclusive if on same row or column.
Set of entries is mutually exclusive if all on a single row or column. Conclusion: $f$ is sum of entries on a single row or column.

## Boolean (almost) degree 1 functions on $S_{n}$

## Dictator theorem (EFP)

If $f: S_{n} \rightarrow\{0,1\}$ has degree 1 then
$f$ depends on some $\pi(i)$ or on some $\pi^{-1}(j)$ ("dictator").

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FKN theorem for sparse functions (EFF1)
If $f: S_{n} \rightarrow\{0,1\}$ is close to degree 1 and $\mathbb{E}[f]=c / n$ then $f$ is close to sum of $c$ entries $x_{i j}$.

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FKN theorem for balanced functions (EFF2)
If $f: S_{n} \rightarrow\{0,1\}$ is close to degree 1 and $\mathbb{E}[f] \approx 1 / 2$ then $f$ is close to a dictator.

## What about higher degrees?

Higher-degree analog of dictator theorem
Suppose $f:\{0,1\}^{n} \rightarrow\{0,1\}$ has degree $d$.
On how many coordinates can $f$ depend?

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## Surprising example

Following function has degree $d$, depends on $\Omega\left(2^{d}\right)$ coordinates:

$$
f\left(x_{1}, \ldots, x_{d-1}, y_{0}, \ldots, y_{2^{d-1}-1}\right)=y_{x} .
$$

Can we do better?

## Boolean (almost) degree $d$ functions

Nisan-Szegedy theorem, CHS'18
If $f:\{0,1\}^{n} \rightarrow\{0,1\}$ has degree $d$ then
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## Analogs for slice and $S_{n}$

Nisan-Szegedy: known for slice (F.-Ihringer), unknown for $S_{n}$. Kindler-Safra: known for slice (FKMW,DFH,KK), known for sparse functions on $S_{n}$ (EFF3), unknown for balanced functions.

## Sparse juntas

Setting: $f:\binom{[n]}{k} \rightarrow\{0,1\}$, where $p:=k / n=o(1)$.
FKN theorem for sparse slice
If $f$ is close to degree 1 then

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f \text { or } 1-f \approx g:=x_{i_{1}}+\cdots+x_{i_{m}}, \quad m=O(1 / p)
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$g$ is sparse junta if on typical input, $O(1)$ monomials are non-zero, and $g \in\{0,1\}$.
$g$ is hereditarily sparse junta if $g$ is sparse junta even given $x_{i_{1}}=\cdots=x_{i_{\ell}}=1$ for $\ell=O(1)$.

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$f \approx$ degree $d \Longrightarrow f \approx$ degree $d$ hereditarily sparse junta.
Moreover, coefficients of sparse junta belong to some finite set.

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## Corollary

If $f$ is $\epsilon$-close to degree $d$ then $f$ is $O\left(\epsilon^{c_{d}}+p\right)$-close to constant.

## There's much more!

## Other results

Highlights:

- Sharp threshold theorems.
- Small set expansion.
- Invariance principle.


## Other domains

Highlights:

- Grassmann scheme.
- High-dimensional expanders.
- Locally testable codes.


## Sharp and coarse thresholds

$G(n, p)=$ Erdős-Rényi random graph on $n$ vertices, edge prob $p$.
Two examples

- $\operatorname{Pr}\left[G\left(n, \frac{c}{n}\right)\right.$ contains a triangle $] \longrightarrow 1-e^{-c^{3} / 6}$.
- $\operatorname{Pr}\left[G\left(n, \frac{\log n+c}{n}\right)\right.$ is connected $] \longrightarrow e^{-e^{-c}}$.


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## Swift threshold theorem (Friedgut-Kalai; Bourgain-Kalai)

Monotone graph properties have window size $\tilde{O}\left(\frac{1}{\log ^{2} n}\right)$.

## Invariance principle

Central limit theorem (Berry-Esséen)
If $x_{1}, \ldots, x_{n}$ are i.i.d. samples of $U(\{ \pm 1\})$ then

$$
\mu+a_{1} x_{1}+\cdots+a_{n} x_{n} \sim N\left(\mu, a_{1}^{2}+\cdots+a_{n}^{2}\right)
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## Invariance principle (Mossel-O'Donnell-Oleszkiewicz)

Same holds for degree $O(1)$ polynomials $\sum_{S} a_{S} x_{S}$ provided no variable is too influential: for all $i$,

$$
\sum_{S \ni i} a_{S}^{2} \ll \sum_{S \neq \emptyset} a_{S}^{2}
$$

## Grassmann scheme

> Johnson scheme
> $J(n, k)$ is set of subsets of $\{1, \ldots, n\}$ of size $k$.

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## Dictator theorem ( F .-Ihringer)

If $f: J_{2}(n, k) \rightarrow\{0,1\}$ has degree 1 then

$$
f \text { or } 1-f \in\{0,[x \in V],[y \perp V],[x \in V \vee y \perp V]\} \quad(x \not \perp y)
$$

Same object known as: Cameron-Liebler line class, tight set, completely regular strength 0 code of covering radius 1 .

## There's much more!

## Other results

Highlights:

- Sharp threshold theorems.
- Small set expansion.
- Invariance principle.


## Other domains

Highlights:

- Grassmann scheme.
- High-dimensional expanders.
- Locally testable codes.

