# Inverse moment problems on polyhedra and optimization

#### Dmitrii V. Pasechnik<sup>1</sup>

<sup>1</sup>School of Physical and Mathematical Sciences, NTU

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**joint work** with Nick Gravin (NTU/PDMI RAS), Jean B. Lasserre (LAAS), Sinai Robins (NTU), Boris Shapiro (Stockholm U.) and Michael Shapiro (Michigan State)

Moment	generating	functions

Parametrizing polyhedra

Non-constant density

Reconstructing

### Outline

#### Moment generating functions

- Introduction
- Fantappiè transformations
- Parametrizing non-convex polytopes by their vertices
- 3 Non-constant density
- 4 Reconstructing measures from Fantappié tranformation
  - Axial moments
  - Non-convex polytopes
  - Fantappié moment matrices?

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# Moment generating functions Introduction

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Introduction

### Moment generating functions - the interval

 $\mu_m^{\rho} := \int_P \mathbf{x}^m \rho(\mathbf{x}) d\mathbf{x}$  — the  $\mathbb{Z}_+ \ni m$ -th moment of  $\rho$  supported on  $P \subset \mathbb{R}^d$ . What is a "natural" generating function to encode  $\mu_m^{\rho}$ 's?

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$$F(u) = \int_{P} \frac{\rho(x)dx}{1 - \langle u, x \rangle} = \sum_{k \ge 0} \int_{P} \langle u, x \rangle^{k} \rho(x)dx = \sum_{m} {\binom{|m|}{m}} \mu_{m}^{\rho} u^{m}.$$

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Fantappiè transformations

### Fantappiè transformations, $ho\equiv 1$

Let 
$$F(u) = \int_P \frac{dx}{1 - \langle u, x \rangle} = \sum_m {\binom{|m|}{m}} \mu_m u^m$$
, and  $g(z) := g(z_1, \dots, z_d) = \prod_{\ell=1}^d (\sum_k z_k + \ell)$ .

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#### Definition

Fantappiè transformation ("rationalized" moment generating function) of  $P \subset \mathbb{R}^d$  is

$$\mathcal{F}_{P}(u) := g(u_{1}\frac{\partial}{\partial u_{1}}, \dots, u_{d}\frac{\partial}{\partial u_{d}}) \circ F(u)$$
  
=  $\int_{P} \frac{d!dx}{(1 - \langle u, x \rangle)^{d+1}} = \sum_{m} \frac{(|m| + d)!}{\prod_{j} m_{j}!} \mu_{m} u^{m}.$ 

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Fantappiè transformations

### Fantappiè transformation of a simplex

#### Example

Fantappiè transformation ("rationalized" moment generating function) of a simplex  $\Delta = \operatorname{conv}(v_1, \ldots, v_{d+1}) \subset \mathbb{R}^d$  is

$$\mathcal{F}_{\Delta}(u) = \int_{\Delta} rac{d! dx}{(1 - \langle u, x 
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This is known to be true in greater generality ( $\mathbb{C}$ -convexity), when  $\Delta$  is a simplex in  $\mathbb{C}P^{d-1}$ . Cf. e.g. Andersson-Passare-Sigurdsson (2004).

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#### Corollary

Let  $P \subset \mathbb{R}^d$  be a (non-convex) polytope, i.e. finite union of convex polytopes.

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Let  $P \subset \mathbb{R}^d$  be a (non-convex) polytope, i.e. finite union of convex polytopes. Then its Fantappiè transformation  $\mathcal{F}_P(u)$  is a rational function with denominator dividing  $\prod_{v \in V} (1 - \langle v, u \rangle)$ , where V is the set of vertices of a triangulation of P.

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Thus we got a valuation (a bit mysterios to us now)

constant measures supp. on  $\mathcal{P}(\mathbb{R}^d) \to \text{rational functions on } \mathbb{R}^d$ 

on the algbera  $\mathcal{P}(\mathbb{R}^d)$  of polyhedra.

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$$\mathcal{P}(\mathbb{R}^d) o$$
 meromorphic functions on  $\mathbb{R}^d$   
 $P \mapsto \int_P e^{\langle u, x 
angle} dx$ 

Fantappiè transformations

# Formulae for Fantappiè transformations, $\rho \equiv 1$

#### Theorem

The Fantappiè transformation of a simple polytope  $P \subset \mathbb{R}^d$  is

$$\begin{aligned} \mathcal{F}_{P}(u) &= (-1)^{d} \sum_{v \in V(P)} \frac{\left| \begin{array}{c} w_{1}(v) - v \\ \vdots \\ w_{d}(v) - v \end{array} \right|}{\prod_{j=1}^{d} \langle w_{j}(v), u \rangle} \cdot \frac{1}{1 - \langle v, u \rangle} \\ &= (-1)^{d} \sum_{v \in V(P)} \langle v, u \rangle^{d} \left| \begin{array}{c} w_{1}(v) - v \\ \vdots \\ w_{d}(v) - v \end{array} \right| \prod_{j=1}^{d} \langle w_{j}(v), u \rangle^{-1} \cdot \frac{1}{1 - \langle v, u \rangle} \end{aligned}$$

where  $w_1(v), \ldots, w_d(v)$  are generators of the vertex cone of  $v \in V(P)$ .

Reconstructing

#### Vertices of compact non-convex polyhedra

As we saw, the denominator of  $\mathcal{F}_P(u)$  divides  $\prod_{v \in V} (1 - \langle v, u \rangle)$ , where V is the set of vertices of a triangulation of P.

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#### Definition

A dissection of P is a finite collection  $\mathcal{T}$  of d-simplices  $T_i = \operatorname{conv}(v_{i0}, \ldots, v_{id})$  s.t, int  $T_i \cap \operatorname{int} T_j = \emptyset$ ,  $i \neq j$ , and  $P = \bigcup_i T_i$ .

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$$V(P) := \bigcap_{\mathcal{T} \in \mathcal{T}} V(\mathcal{T})$$

 ${\mathcal T}$  is a dissection of P

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Then we can take V := V(P). (For *P* convex it's the usual vertices.) More details here: Gravin-DP-B.&M.Shapiro (2012)

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# Parametrizing P by simplices from V(P)

#### Theorem

Assume that any d + 2 points in V(P) affinely span  $\mathbb{R}^d$ (non-degeneracy). Then the constant unit density measure [P] supported on P satisfies

$$[P] = \sum_{\{v_0, \dots, v_d\} \subset V(P)} a_{v_0 \dots v_d} [\operatorname{conv}(v_0, \dots, v_d)].$$
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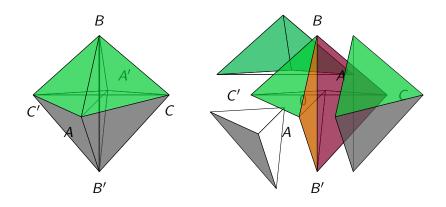
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Reconstructing

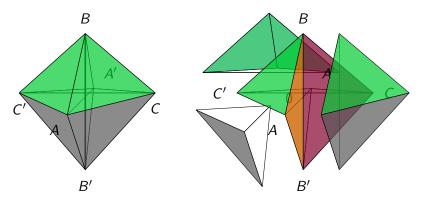
### Schönhardt polyhedron



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### Schönhardt polyhedron



To dissect, it needs an extra vertex in the interior.

# A glimpse of the proof

Apply Fantappiè transformation to both sides of (1)

$$\mathcal{F}_{P}(u) = \frac{P(u)}{\prod_{v \in P(V)} (1 - \langle u, v \rangle)}$$
  
(???) =  $\sum_{\Omega := \{v_0, \dots, v_d\} \subset V(P)} a_{\Omega} \frac{\operatorname{Vol}(\operatorname{conv}(\Omega))}{\prod_{v \in \Omega} (1 - \langle u, v \rangle)}.$ 

We would be done if we manage to show that P(u) lies in the vectorspace  $\Pi$  spanned by the products  $\Pi_{\Omega} = \frac{\prod_{v \in P(V)} (1 - \langle u, v \rangle)}{\prod_{v \in P(V)} (1 - \langle u, v \rangle)}$ , where  $\Omega := \{v_0, \ldots, v_d\} \subset V(P)$ . Non-degeneracy implies that  $\Pi_{\Omega}$ , s.t.  $v_0 \in \Omega$ , span  $\Pi$ . A bit of commutative algebra shows that dim  $\Pi$  coinsides with the dimnesion of full the space of polynomials in u of the appropriate degree, and the latter spanning set is a basis. 

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Reconstructing

# Fantappiè transformations, non-constant weight

Note that  $\rho$  can be "added" later.



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$$\frac{\partial^{|K|}}{\partial u^{K}} \circ \int_{P} \frac{d!dx}{(1 - \langle u, x \rangle)^{d+1}} = \int_{P} \frac{d!(d+1)^{|K|} x^{K} dx}{(1 - \langle u, x \rangle)^{d+1}} \\ = \sum_{m} \frac{(|m| + |K| + d)!}{\prod_{j} m_{j}!} \mu_{m}^{K} u^{m}.$$

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#### Corollary

The Fantappiè transformation  $\mathcal{F}^{\rho}_{P}(u)$  of an arbitrary (non-convex) polytope  $\mathcal{P}$  w.r.t. an arbitrary homogeneous polynomial weight  $\rho$  of degree  $\delta$  is a rational function with denominator  $\prod_{v \in V(P)} (1 - \langle v, u \rangle)^{\delta}.$ 

Non-constant densit

Reconstructing

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#### Inverse moment problems

#### Inverse moment problem: given (some) $\mu_m$ , recover $\rho$ and P.

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- specializing to univariate generating functions for axial moments Gravin-Lasserre-DP-Robins (2011)
- tackling  $\mathcal{F}^{\rho}_{P}(u)$  directly

Moment generating functions	Parametrizing polyhedra	Non-constant density	Reconstructing
Axial moments			
Outline			

- Introduction
- Fantappiè transformations
- Parametrizing non-convex polytopes by their vertices
- 3 Non-constant density

# Reconstructing measures from Fantappié tranformation Axial moments

- Non-convex polytopes
- Fantappié moment matrices?



Specialize to axial moments: pick several  $\mathbf{z} \in \mathbb{R}^d$ , and consider

$$\mu_j(\mathbf{z}) = \int_P \langle x, \mathbf{z} \rangle^j \rho(x) dx$$

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recover univariate rational generating functions

$$\Phi_{\mathbf{z}}(t) = \sum_{j} \frac{(j+d)!}{j!} \mu_j(\mathbf{z}) t^j = \sum_{j} c_j t^j.$$

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Reconstruct P, by finding the kernel of the (infinite) Hankel matrix  $H = (c_{i+j})_{0 \le i,j < \infty}$  from found, as denominators of  $\Phi_z(t)$ , projections of  $v \in Vert(P)$  to z. Use a variation of Prony method to solve the underlying nonlinear system.

Moment generating functions	Parametrizing polyhedra	Non-constant density	Reconstructing ○○●0○○○○
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# 4 Reconstructing measures from Fantappié tranformation

- Axial moments
- Non-convex polytopes
- Fantappié moment matrices?

Moment genera	ting	functions

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Non-convex polytopes

# Non-convex polytopes

Suppose we know V(P).



Parametrizing polyhedra

Non-constant density

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Non-convex polytopes

#### Non-convex polytopes

Suppose we know V(P). In Gravin-DP-B.&M.Shapiro (2012) we show that then  $\mathcal{F}_{P}^{\rho}(u)$  can be reconstructed from sufficiently many (depending on the degree of  $\rho$ ) moments.

Moment generating functions	Parametrizing polyhedra	Non-constant density	Reconstructing
Fantappié moment matrices?			
Outline			

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#### 4 Reconstructing measures from Fantappié tranformation

- Axial moments
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Parametrizing polyhedra

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Fantappié moment matrices?

#### Fantappié moment matrices

Let  $\mathcal{F}_P(u) = \sum_I c_I u^I$ , and  $A = (c_{I+J})_{I,J}$ , for a nice ordering of the monomial basis  $B = \{1, u^{I_1}, u^{I_2}, \dots\}$ .

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Fantappié moment matrices?

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#### Lemma

 $c \in \text{Ker } A$  iff for any  $u^K$  the Laurent series  $u^{-K} \mathcal{F}_P(u) \sum_{I} c_I u^{-I}$  has no free term.

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#### Corollary

Let  $\sum_{I} c_{I} u^{I} = u^{M} q(\frac{1}{u_{1}}, \dots, \frac{1}{u_{d}}) \in \mathbb{R}[u]$ , and  $u^{M}$  does not divide any monomial of p(u). Then  $c \in \text{Ker } A$ .

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Fantappié moment matrices?

#### Fantappié moment matrices—questions

#### Problem

How can we be sure that we found the generator(s) of the kernel, by looking at minors of A?

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Fantappié moment matrices?

## Fantappié moment matrices—questions

#### Problem

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How about nonlinear relations between moments? Can we find them? Can we use them?

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Fantappié moment matrices?

### Fantappié moment matrices—questions

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#### Problem

Relate A and the "usual" moment matrices.

Fantappié moment matrices?

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IMS Nov 2013/Jan 2014—announcement

A program on inverse moment problems has been announced: http://web.spms.ntu.edu.sg/~dima/IMS2013/

Parametrizing polyhedra

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Fantappié moment matrices?

# IMS Nov 2013/Jan 2014—announcement

A program on inverse moment problems has been announced: http://web.spms.ntu.edu.sg/~dima/IMS2013/ In particular a range of topics related to the present talk will be covered.