Discrete Mathematics & Computational Structures Lattice-Point Counting in Convex Polytopes (1) Frobenius' Coin-Exchange Problem

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Textbook

We follow the book:

• Matthias Beck and Sinai Robins, Computing the Continuous Discretely. Integer-Point Enumeration in Polyhedra. Undergraduate Texts in Mathematics. New York, Springer. 2007.

Overview

- The updated version is available at http://math.sfsu.edu/beck/ccd.html
- Japanese translation will be available soon

Overview	Overview Lecture Style Goal	Y. Okamoto (Tokyo Tech)	DMCS'09 (1)	2009-04-16 1 / 51	Y. Okamoto (Tokyo Tec	h) DMCS'09 (1)	2009-04-16
Lecture Style		Lecture Style	Overview		Goal	Overview	

- Spoken: in English or Japanese
- Slides: in English
- Report submission: in Japanese/English (up to you)
- Feedback
 - Submission of a piece of paper at the end of each lecture

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- Can be anonymous
- There might be a survey at the term end

Goal of the course

- Study an example of mathematical thoughts that are benefitial for algorithms design
- In this course, such an example = lattice-point counting in convex polytopes

Prerequisites

- Nothing in particular
- Other than a moderate familiarity with freshmen math (Calculus, Linear Algebra, Discrete Math)
- And eagerness to learn

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Evaluation

How to get a credit

Submission of exercise solutions

• Each lecture is accompanied with several exercises in the textbook

Overview

- Students should assign themselves to different exercises
- Assignment should be done at the wiki page of the course in the first-come-first-serve way
- Submission due: next lecture
- Wiki: http://www.is.titech.ac.jp/~okamoto/ cgi-bin/pukiwiki/index.php?DMCS09

Administration

- Course Webpage
 - http://www.is.titech.ac.jp/~okamoto/lect/2009/dmcs/

Overview

- Reachable from the CompView website (http://compview.titech.ac.jp/)
- This is in the Education Program for CompView
- Lecturer: Yoshio Okamoto
 - Email: okamoto at is.titech.ac.jp
 - Office: W904 in West 8th Bldg.
 - Int. Phone: 3871
 - Office hours: by appointment, or you can try your luck any time
- Remark: This lattice-point counting course will not be given next year; Could be discrete geometry, data structures, graph theory, extremal combinatorics, ..., I'm thinking

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	Introduction		
			The basic computational problems
 Introduction 			When a finite set Ω is given implicit
			• Decide whether $\Omega = \emptyset$
2 Frobenius' coin-exc	hange problem		 Find an element of Ω if it exist
Why use generat	•		• Count $ \Omega $
Two coins			• List all elements of Ω
	and a surprising formula		• Sample an element of Ω uniform
Sylvester's result	-		• Sample all cicilient of 32 dimon

Three and more coins

Oncluding remarks

- They have some relationship
- Counting is the most difficult in a certain sense

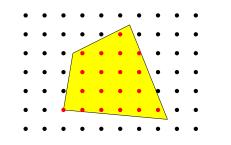
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A kind of the most general setting

One setting

 $\Omega = P \cap \mathbb{Z}^d$ where

- *P* a *d*-dimensional convex polyhedron (in the H-representation) (the terminology will be defined through the course)
- \mathbb{Z} is the set of integers



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A theoretical development

 $\Omega = P \cap \mathbb{Z}^d$

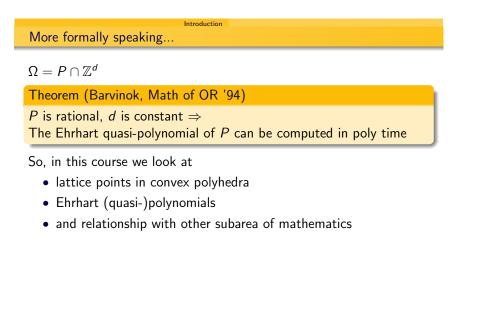
Theorem (Barvinok, Math of OR '94) P is rational, d is constant \Rightarrow $|P \cap \mathbb{Z}^d|$ can be computed in polynomial time

Introduction

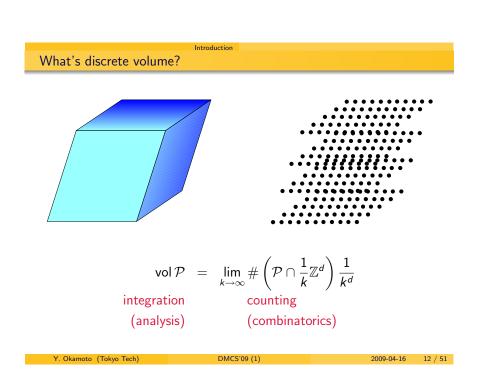
Implementations are also available

- LattE (Project led by De Loera) http://www.math.ucdavis.edu/~latte/
- LattE macchiato (Köppe) http://www.math.ucdavis.edu/~mkoppe/latte/
- barvinok (Verdoolaege) http://www.kotnet.org/~skimo/barvinok/

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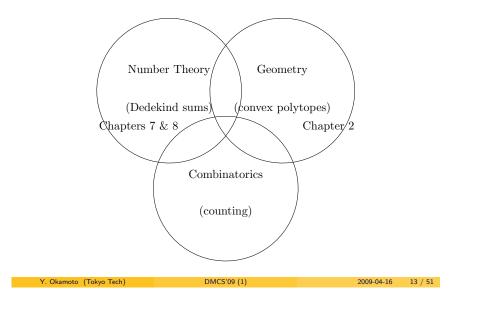


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2009-04-16 9 / 51

Lattice-point counting in convex polytopes



1 Introduction

Probenius' coin-exchange problem

Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

3 Concluding remarks

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Frobenius' coin-exchange problem Why use generating functions? A generating function of a sequence

Definition (Generating function) Given a sequence $\{a_k\}$, define its generating function as $F(z) = \sum_{k \ge 0} a_k z^k$ F(z) is a power series, but let's forget about the convergence for the moment

- Generating functions are quite useful for many reasons
- Generating functions are main objects we deal with in this course

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Frobenius' coin-exchange problem Why use generating functions? Example: Fibonacci sequence

Definition (Fibonacci sequence)

The Fibonacci sequence $\{f_k\}$ is defined as follows

- $f_0 = 0, f_1 = 1$
- $f_{k+2} = f_{k+1} + f_k$ for all $k \ge 0$

The first few numbers in the sequence are:

0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, 610, 987

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See http://www.research.att.com/~njas/sequences/

• Excellent source of integer sequences

2009-04-16

Frobenius' coin-exchange problem Why use generating functions? Discovery through the generating function

- F(z) the generating function for the Fibonacci sequence
- Then, by the recursion

$$\sum_{k\geq 0} f_{k+2} z^k = \sum_{k\geq 0} \left(f_{k+1} + f_k \right) z^k = \sum_{k\geq 0} f_{k+1} z^k + \sum_{k\geq 0} f_k z^k \quad (1)$$

• The LHS of (1) is

$$\sum_{k\geq 0} f_{k+2} z^k = \frac{1}{z^2} \sum_{k\geq 0} f_{k+2} z^{k+2} = \frac{1}{z^2} \sum_{k\geq 2} f_k z^k = \frac{1}{z^2} \left(F(z) - z \right)$$

• The RHS of (1) is

$$\sum_{k\geq 0} f_{k+1} z^k + \sum_{k\geq 0} f_k z^k = \frac{1}{z} \sum_{k\geq 0} f_{k+1} z^{k+1} + \sum_{k\geq 0} f_k z^k = \frac{1}{z} F(z) + F(z)$$

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2009-04-16 17 / 51

Frobenius' coin-exchange problem Why use generating functions? Discovery through the generating function (cont'd)

• \therefore (1) is rewritten as

$$\frac{1}{z^2}(F(z)-z)=\frac{1}{z}F(z)+F(z)$$

Equivalently,

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$$F(z)=\frac{z}{1-z-z^2}$$

• A fun to check (by a computer)

$$\frac{z}{1-z-z^2} = z + z^2 + 2z^3 + 3z^4 + 5z^5 + 8z^6 + 13z^7 + \cdots$$

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Frobenius' coin-exchange problem Why use generating functions? Discovery through the generating function (cont'd)

• A partial fraction expansion gives us

$$F(z) = \frac{z}{1 - z - z^2} = \frac{1/\sqrt{5}}{1 - \frac{1 + \sqrt{5}}{2}z} - \frac{1/\sqrt{5}}{1 - \frac{1 - \sqrt{5}}{2}z}$$
(2)

• Remember the geometric series

$$\sum_{k\geq 0} x^k = \frac{1}{1-x} \tag{3}$$

• Then, by setting
$$x = \frac{1+\sqrt{5}}{2}z$$
 and $x = \frac{1-\sqrt{5}}{2}z$ we have

$$F(z) = \frac{z}{1 - z - z^2}$$

= $\frac{1}{\sqrt{5}} \sum_{k \ge 0} \left(\frac{1 + \sqrt{5}}{2} z \right)^k - \frac{1}{\sqrt{5}} \sum_{k \ge 0} \left(\frac{1 - \sqrt{5}}{2} z \right)^k$

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Frobenius' coin-exchange problem Why use generating functions? Discovery through the generating function (cont'd)

• We have

$$F(z) = \frac{1}{\sqrt{5}} \sum_{k \ge 0} \left(\frac{1 + \sqrt{5}}{2} z \right)^k - \frac{1}{\sqrt{5}} \sum_{k \ge 0} \left(\frac{1 - \sqrt{5}}{2} z \right)^k$$
$$= \sum_{k \ge 0} \frac{1}{\sqrt{5}} \left(\left(\frac{1 + \sqrt{5}}{2} \right)^k - \left(\frac{1 - \sqrt{5}}{2} \right)^k \right) z^k$$

• Thus, we obtain a closed formula for the Fibonacci sequence

$$f_k = rac{1}{\sqrt{5}} \left(rac{1+\sqrt{5}}{2}
ight)^k - rac{1}{\sqrt{5}} \left(rac{1-\sqrt{5}}{2}
ight)^k$$

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2009-04-16 20 / 51

2009-04-16

18 / 51

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Frobenius' coin-exchange problem Why use generating functions? Usefulness of a generating function

• It gives a closed formula of a sequence

$$f_k = rac{1}{\sqrt{5}} \left(rac{1+\sqrt{5}}{2}
ight)^k - rac{1}{\sqrt{5}} \left(rac{1-\sqrt{5}}{2}
ight)^k$$

• It gives a short description of a sequence as a rational function

$$F(z)=\frac{z}{1-z-z^2}$$

Frobenius' coin-exchange problem Why use generating functions? Partial fraction expansion (in case you've never heard of that)

Theorem 1.1 (Partial fraction expansion)

Given any rational function

$$F(z):=\frac{p(z)}{\prod_{k=1}^m (z-a_k)^{e_k}}$$

where p is a polynomial of degree less than $e_1 + e_2 + \cdots + e_m$ and the a_k 's are distinct, there exists a decomposition

$$F(z) = \sum_{k=1}^{m} \left(\frac{c_{k,1}}{z - a_k} + \frac{c_{k,2}}{(z - a_k)^2} + \dots + \frac{c_{k,e_k}}{(z - a_k)^{e_k}} \right),$$

where $c_{k,i} \in \mathbb{C}$ are unique.

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Proof: Exercise 1.35		
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Frobenius' coin-exchange problem Two coins What if the new coin system is introduced

Imagine we only have 4-yen, 7-yen, 9-yen, and 34-yen coins

Which price can be paid without making any change?

Γ	1	X	6	X	11	 16	 21	
	2	×	7		12	 17	 22	
	3	\times	8		13	 18	 23	
	4		9		14	 19	 24	
	5	×	10	×	15	 20	 25	

Exercise 1.20

The coins are coprime \Rightarrow Only finitely many prices cannot be paid

Frobenius' coin-exchange problem, informally

Find the largest price that the coin system cannot allow us to pay

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Frobenius' coin-exchange problem Two coins

1 Introduction

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2 Frobenius' coin-exchange problem

Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

3 Concluding remarks



2009-04-16 21 / 51

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Two coinsFrobenius' coin-exchange problem $A = \{a_1, a_2, \dots, a_d\}$ a set of coprime positive integersDefinition (Representable integer)An integer n is representable by A if \exists non-negative integers m_1, m_2, \dots, m_d s.t. $n = m_1 a_1 + \dots + m_d a_d$ Definition (Frobenius number)

Frobenius' coin-exchange problem Two coins

When d = 2 the situation is well studied

Theorem 1.2
$a_1, a_2 \text{ coprime} \Rightarrow g(a_1, a_2) = a_1a_2 - a_1 - a_2$

• Quite simple

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• But such a simple formula cannot be expected for larger d

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We prove it in the next subsection

Frobenius' coin-exchange problem Two coins Sylvester's theorem	Frobenius' coin-exchange problem Two coins A tool: restricted partition function

2009-04-16 25 / 51

More is known when d = 2

Frobenius' coin-exchange problem

Determine g(A)

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Theorem 1.3 (Sylvester's theorem, 1884) $a_1, a_2 \text{ coprime} \Rightarrow \begin{array}{c} \text{exactly} \ \frac{(a_1 - 1)(a_2 - 1)}{2} \\ \text{representable} \end{array}$ integers are not

 $g(A) = \max$ number that's not representable by A

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Example:
$$a_1 = 3, a_2 = 7 (\rightsquigarrow a_1 a_2 - a_1 - a_2 = 11)$$

1	×	6		11	×	16	 21	
2	\times	7 8 9		12		17	 22	
3		8	\times	13		18	 23	
4	\times	9		14		19	 24	
5	×	10		15		20	 25	

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 $A = \{a_1, \dots, a_d\}$ a set of coprime positive integer

Definition (Restricted partition function)

$$p_A(n) := \# \left\{ (m_1, \ldots, m_d) \in \mathbb{Z}^d: egin{array}{c} ext{all } m_j \geq 0, \ m_1 a_1 + \cdots + m_d a_d = n \end{array}
ight\}$$

In words

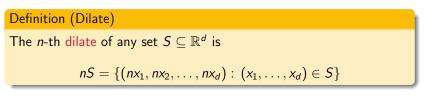
 $p_A(n) = \#$ representations of n by A

Note

 $g(A) = \max\{n \mid p_A(n) = 0\}$

2009-04-16 26 / 51

Frobenius' coin-exchange problem Two coins Restricted partition functions and polytopes



If we define

$$\mathcal{P} = \left\{ (x_1, \dots, x_d) \in \mathbb{R}^d : \text{ all } x_j \ge 0, \ x_1 a_1 + \dots + x_d a_d = 1 \right\} \quad (4)$$

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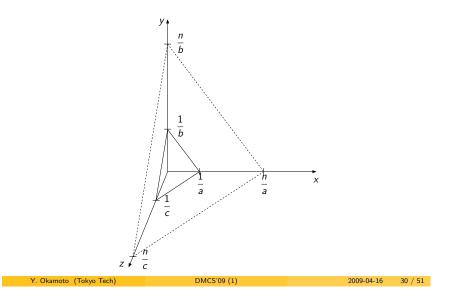
2009-04-16 29 / 51

then we see that

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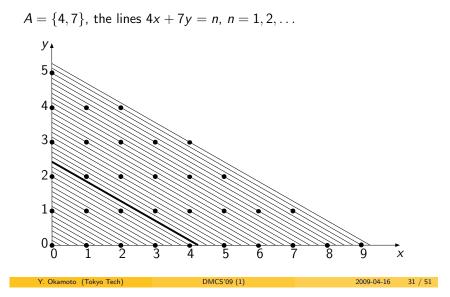
- \mathcal{P} is a polytope (defined in the next lecture), and
- $p_A(n) = \#(n\mathcal{P} \cap \mathbb{Z}^d)$





Frobenius' coin-exchange problem Partial fractions and a surprising formula

Frobenius' coin-exchange problem Two coins



- Introduction
- Probenius' coin-exchange problem
 - Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

3 Concluding remarks

Concentrate on the case d = 2, so let $A = \{a, b\}$ where a, b coprime

- Consider $p_{\{a,b\}}(n) = \# \{(k,l) \in \mathbb{Z}^2 : k, l \ge 0, ak + bl = n\}$
- Consider the product of the following two geometric series:

$$\left(\frac{1}{1-z^a}\right)\left(\frac{1}{1-z^b}\right) = \left(1+z^a+z^{2a}+\cdots\right)\left(1+z^b+z^{2b}+\cdots\right)$$
$$= \sum_{k\geq 0}\sum_{l\geq 0} z^{ak}z^{bl}$$
$$= \sum_{n\geq 0} p_{\{a,b\}}(n) z^n$$

• : this fn is the generating fn for the seq $(p_{\{a,b\}}(n))_{n=0}^{\infty}$ The idea is to study the compact function on the LHS!

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Frobenius' coin-exchange problem Partial fractions and a surprising formula Looking at the constant term by shifting

More convenient if we can look at the constant term after shifting

• Namely, $p_A(n)$ is the constant term of

$$f(z) := \frac{1}{(1-z^a)(1-z^b)z^n} = \sum_{k\geq 0} p_{\{a,b\}}(k) \, z^{k-n}$$

This is a Laurent series

- To obtain $p_A(n)$ we only need to "evaluate" f(z) at z = 0, but this is impossible since f(z) has terms with negative exponents
- We just need a contant term, so we subtract the terms with negative exponents from f(z) and evaluate it at z = 0
- (Or, we may use the residue theorem from complex analysis)

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Frobenius' coin-exchange problem Partial fractions and a surprising formula After a few minutes of computation...

We get

$$p_{\{a,b\}}(n) = \frac{1}{2a} + \frac{1}{2b} + \frac{n}{ab} + \frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1 - \xi_a^{kb})\xi_a^{kn}} + \frac{1}{b} \sum_{j=1}^{b-1} \frac{1}{(1 - \xi_b^{ja})\xi_b^{jn}}$$
(7)

where

$$\xi_a := e^{2\pi i/a} = \cos\frac{2\pi}{a} + i\sin\frac{2\pi}{a}$$

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is the a-th root of unity

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• Let's make it simpler and more understandable

Greatest-integer functions and fractional-part functions

Let $x \in \mathbb{R}$

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Definition (Greatest-integer function)

 $\lfloor x \rfloor = \max\{n \in \mathbb{Z} \mid n \le x\}$

Definition (Fractional-part function)

 $\{x\} = x - |x|$

Example:

2009-04-16 33 / 51

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2009-04-16

Frobenius' coin-exchange problem Partial fractions and a surprising formula With help of this notation

• When b = 1, the problem gets one-dimensional

$$p_{\{a,1\}}(n) = \# \{ (k,l) \in \mathbb{Z}^2 : k, l \ge 0, ak+l=n \}$$
$$= \# \{ k \in \mathbb{Z} : k \ge 0, ak \le n \}$$
$$= \# \{ k \in \mathbb{Z} : 0 \le k \le \frac{n}{a} \} = \left\lfloor \frac{n}{a} \right\rfloor + 1$$

• Therefore,

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$$\frac{1}{2a} + \frac{1}{2} + \frac{n}{a} + \frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1 - \xi_a^k) \xi_a^{kn}} = \left\lfloor \frac{n}{a} \right\rfloor + 1$$
$$\frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1 - \xi_a^k) \xi_a^{kn}} = -\left\{ \frac{n}{a} \right\} + \frac{1}{2} - \frac{1}{2a} \qquad (8)$$

2009-04-16 37 / 51

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Frobenius' coin-exchange problem Partial fractions and a surprising formula Geometric picture for two coins, again

$$A = \{4, 7\}, \text{ the lines } 4x + 7y = n, n = 1, 2, \dots$$

Frobenius' coin-exchange problem Partial fractions and a surprising formula Popoviciu's theorem

• Exercise 1.22

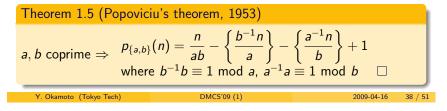
$$\frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1-\xi_a^{bk})\xi_a^{kn}} = \frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1-\xi_a^k)\xi_a^{b^{-1}kn}}$$
(9)

where b^{-1} is an integer s.t. $b^{-1}b\equiv 1 \mod a$

• Therefore

$$\frac{1}{a}\sum_{k=1}^{a-1}\frac{1}{(1-\xi_a^{bk})\xi_a^{kn}} = -\left\{\frac{b^{-1}n}{a}\right\} + \frac{1}{2} - \frac{1}{2a}$$
(10)

• Combining this with (7) gives the following theorem



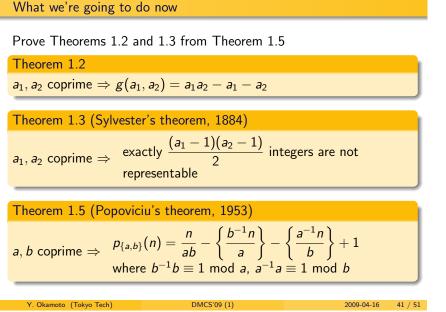
Frobenius' coin-exchange problem Sylvester's result

1 Introduction

- Probenius' coin-exchange problem
 - Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

3 Concluding remarks

Frobenius' coin-exchange problem Sylvester's result



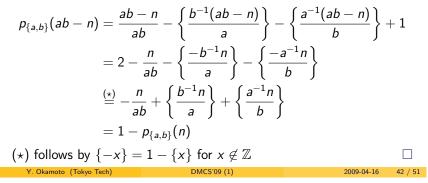
Frobenius' coin-exchange problem Svlvester's result We use a lemma

Lemma 1.6

a, b coprime, $n \in [1, ab-1]$, $a \not\mid n, b \not\mid n \Rightarrow$

$$p_{\{a,b\}}(n) + p_{\{a,b\}}(ab-n) = 1$$

Proof: Use Theorem 5



Frobenius' coin-exchange problem Svlvester's result Proof of Theorem 1.3

- Non-representable numbers all in [1, *ab*-1] (by Thm 1.2)
- $a|n \text{ or } b|n \Rightarrow n \text{ representable}$
- Otherwise, exactly one of n and ab-n is representable (Lem 1.6)
- ...

$$\#$$
 non-representable numbers $=$ $\frac{(ab-1)-(b-1)-(a-1)+0}{2}$ $=$ $\frac{(a-1)(b-1)}{2}$ \square

Frobenius' coin-exchange problem Svlvester's result Proof of Theorem 1.2

It suffices to prove the following two $p_{\{a,b\}}(ab-a-b) = 0$ (Exer 1.24 and Lem 1.6) $p_{\{a,b\}}(ab-a-b+n) > 0 \text{ for all } n > 0$

Proof of (2):

• Note
$$\left\{\frac{m}{a}\right\} \leq 1 - \frac{1}{a}$$
 for all $m \in \mathbb{Z}$

• Then

$$p_{\{a,b\}}(ab-a-b+n) \ge rac{ab-a-b+n}{ab} - \left(1-rac{1}{a}
ight) - \left(1-rac{1}{b}
ight) + 1$$
 $= rac{n}{ab} > 0$

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Frobenius' coin-exchange problem Three and more coins

1 Introduction

Probenius' coin-exchange problem

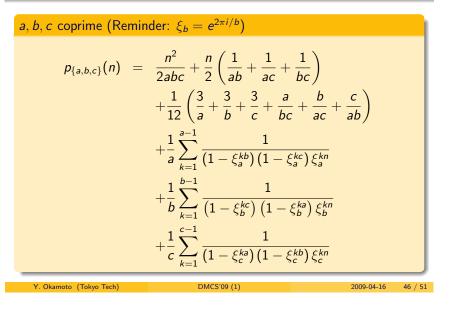
Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

Occurrent Concluding remarks

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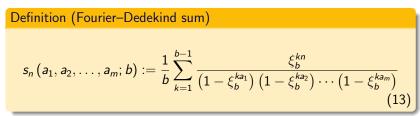
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Frobenius' coin-exchange problem Three and more coins
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Three coins



	Frobenius' coin-exchange problem	Three and more coins
Fourier-Dedek	kind sums	

Reminder: $\xi_b = e^{2\pi i/b}$



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- Generalizes Dedekind sums (defined in Chapter 7)
- Studied thoroughly (in Chapter 8)

Frobenius' coin-exchange problem	Three and more coins
Three coins, rewritten	

a, b, c coprime
$p_{\{a,b,c\}}(n) = \frac{n^2}{2abc} + \frac{n}{2}\left(\frac{1}{ab} + \frac{1}{ac} + \frac{1}{bc}\right)$
$+\frac{1}{12}\left(\frac{3}{a}+\frac{3}{b}+\frac{3}{c}+\frac{a}{bc}+\frac{b}{ac}+\frac{c}{ab}\right)$
$+s_{-n}(b,c;a) + s_{-n}(a,c;b) + s_{-n}(a,b;c)$

For the derivation, and the extension to more coins, see the textbook

Eq. (7) for two coins $p_{\{a,b\}}(n) = \frac{1}{2a} + \frac{1}{2b} + \frac{n}{ab} + \frac{1}{a} \sum_{k=1}^{a-1} \frac{1}{(1 - \xi_a^{kb})\xi_a^{kn}} + \frac{1}{b} \sum_{j=1}^{b-1} \frac{1}{(1 - \xi_b^{ja})\xi_b^{jn}} = \frac{1}{2a} + \frac{1}{2b} + \frac{n}{ab} + s_{-n}(b; a) + s_{-n}(a; b)$

Introduction

Probenius' coin-exchange problem

Why use generating functions? Two coins Partial fractions and a surprising formula Sylvester's result Three and more coins

3 Concluding remarks

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Concluding remarks

- Frobenius' coin-exchange problem to see the relation of
 - Combinatorics (generating functions)
 - Geometry (convex polytopes)
 - Number theory (Dedekind sums)
- Lots of problems still remain unsolved

<u>Literature</u>

• J.L. Ramírez-Alfonsín. *The Diophantine Frobenius Problem*. Oxford University Press, 2006.

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