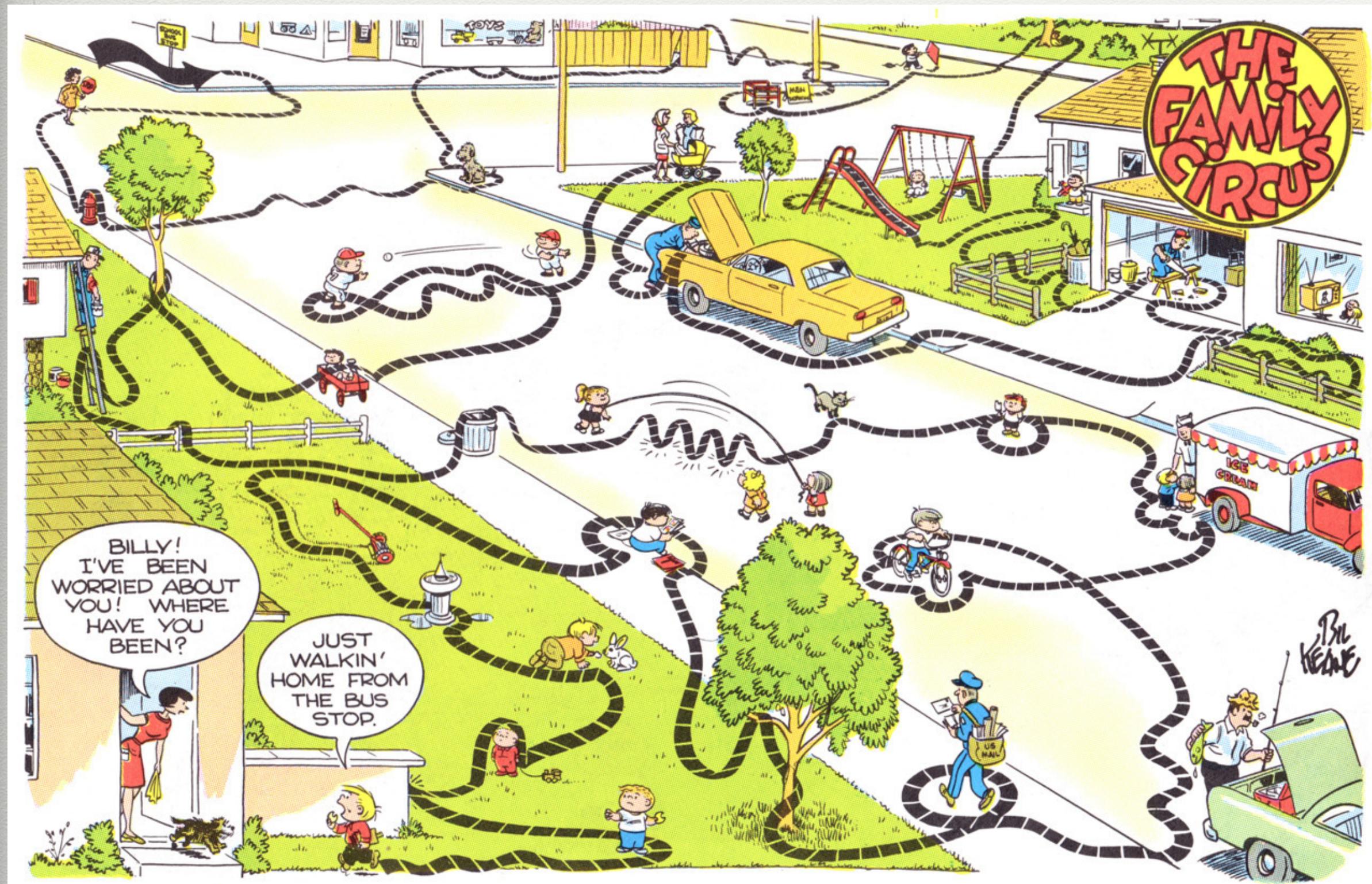


# LATTICE WALK CLASSIFICATION ALGEBRAIC, ANALYTIC, AND GEOMETRIC PERSPECTIVES

MARNI MISHNA  
CanaDAM  
May 28, 2021

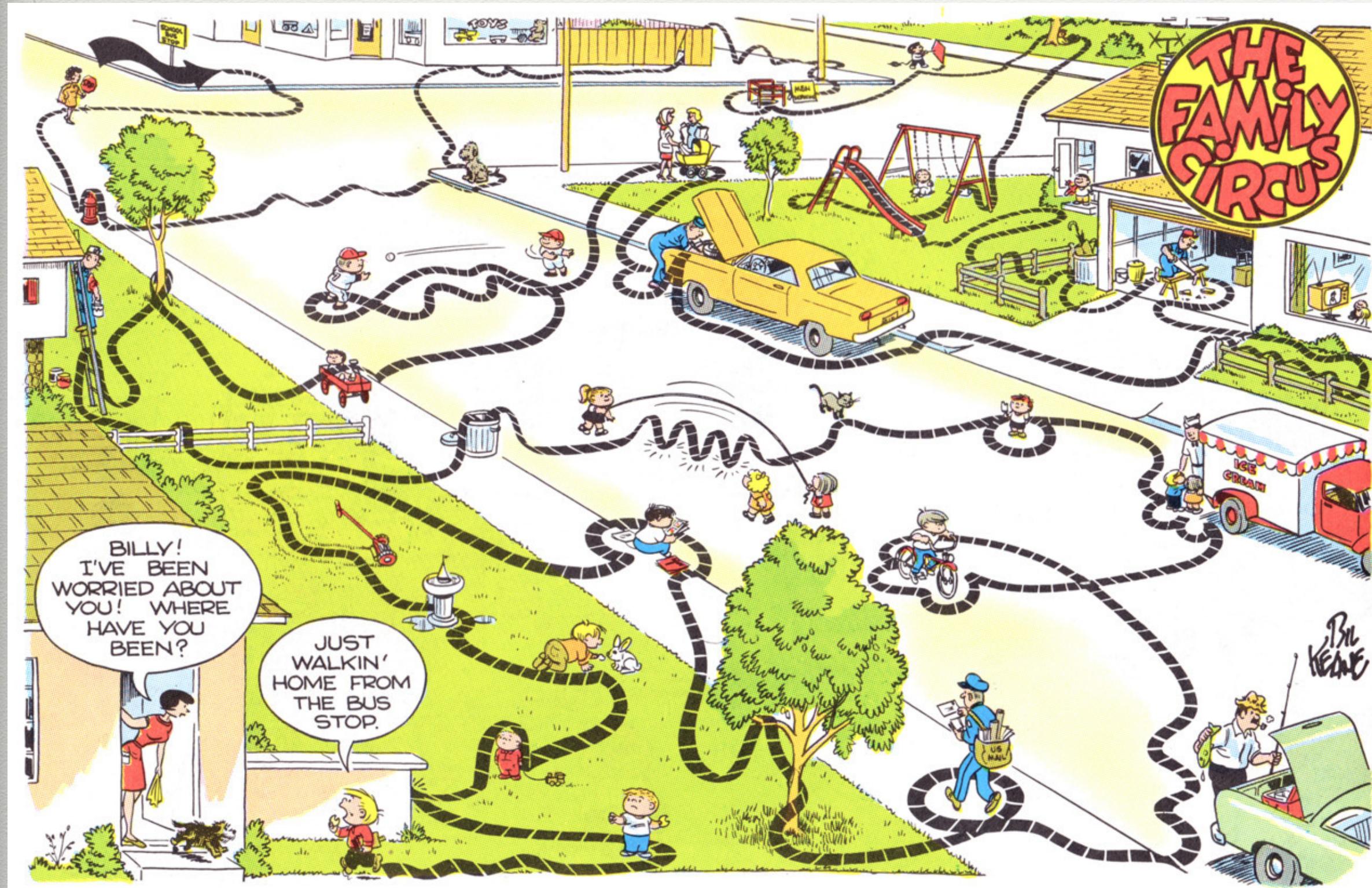
# I. LATTICE PATHS

# A WALK IS A SEQUENCE OF STEPS



Recall we consider fixed, finite sets of possible steps.  
+ constraints.  
+ non-uniform weighting/ probability for the steps.

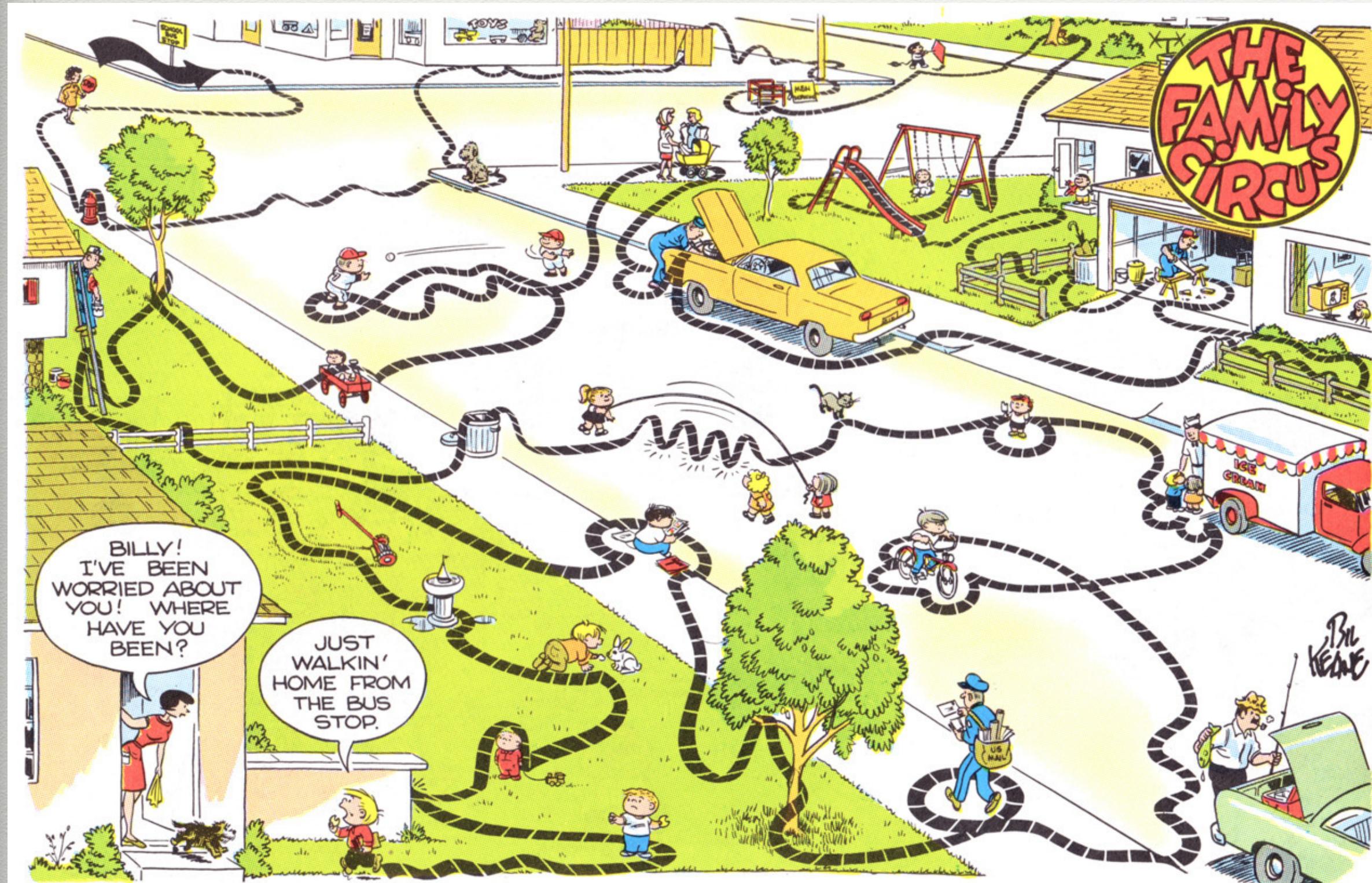
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**STRATEGY:**  
**ENCODE WALKS WITH MONOMIALS**

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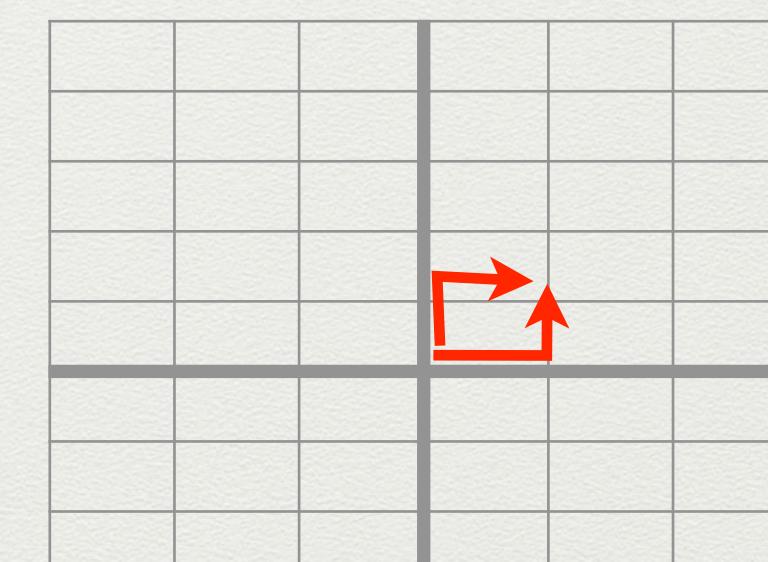
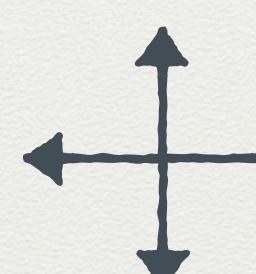


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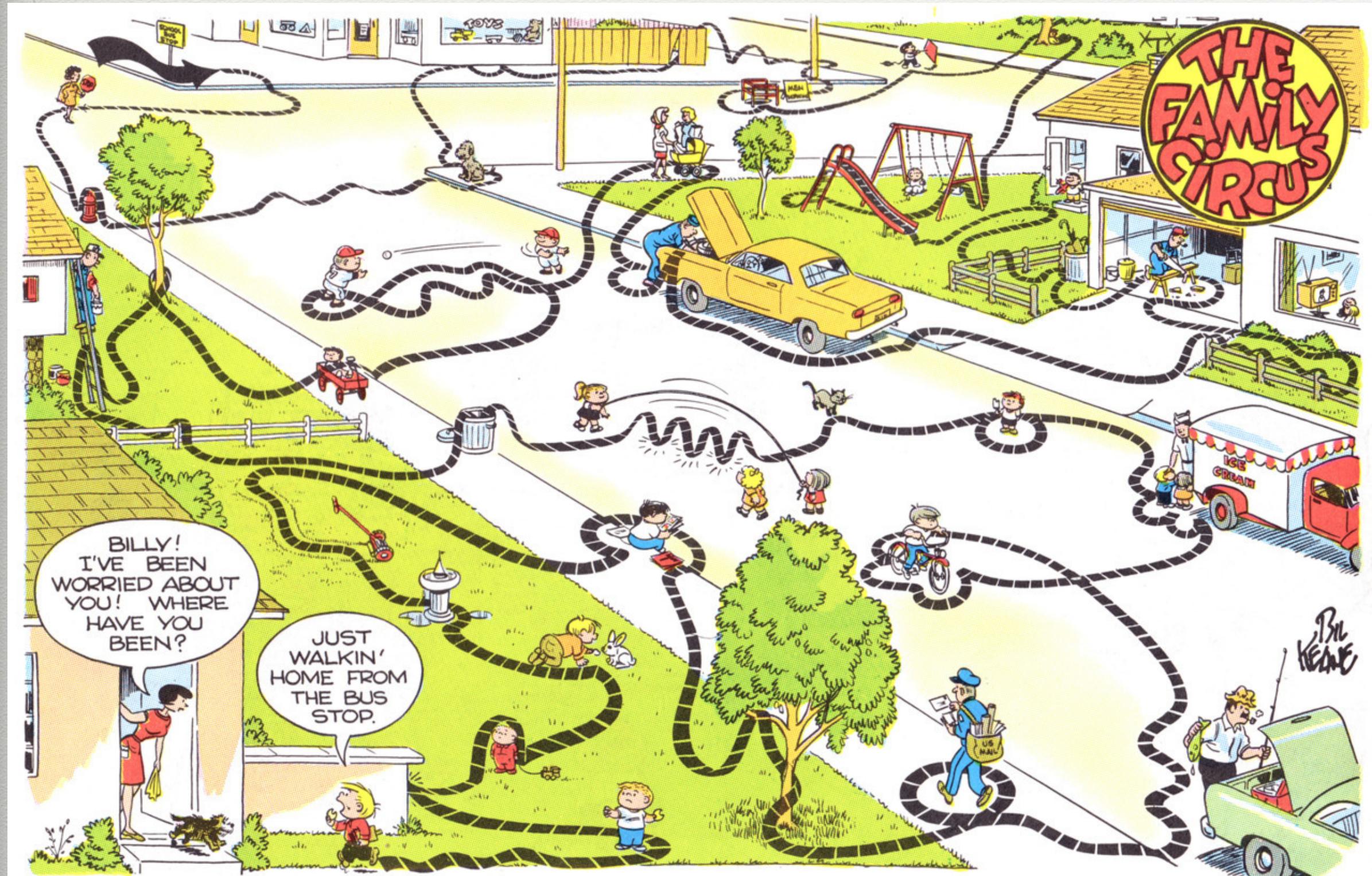
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$$(x + 1/x + y + 1/y) \times (x + 1/x + y + 1/y)$$

$$= x^2 + 1/x^2 + y^2 + 1/y^2 + 4 + 2xy + 2x/y + 2y/x + 2/xy$$



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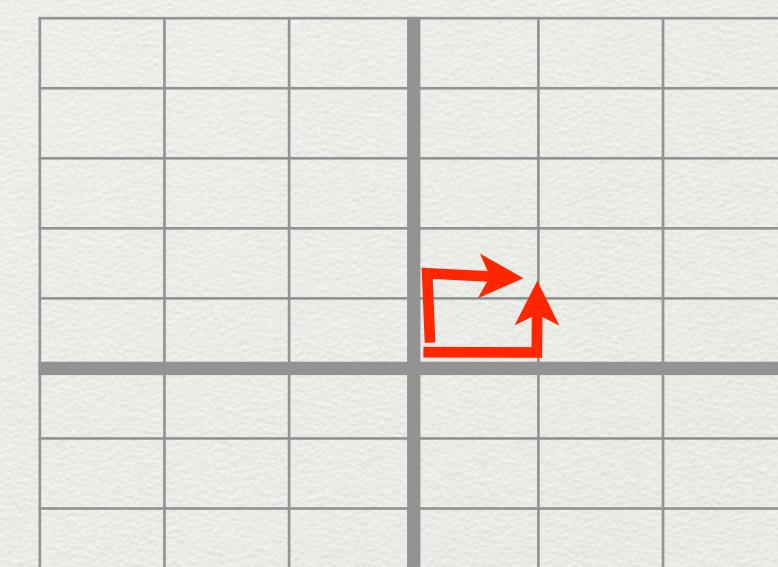


$$\frac{1}{1 - z(x + 1/x + y + 1/y)}$$

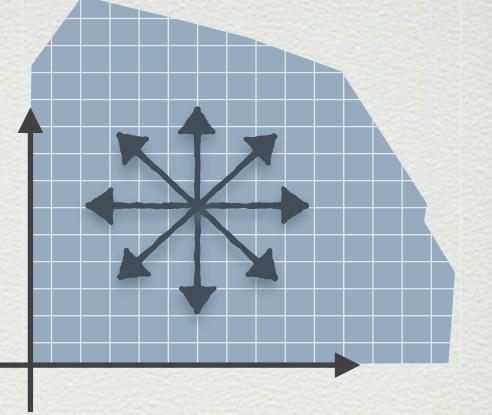
→ ← ↑ ↓  
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**STRATEGY:**  
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# CASE STUDY: SMALL STEP WALKS IN THE QUARTER PLANE



- Consider a set of vectors in  $\mathcal{S} \subseteq \{(i, j) \mid i, j \in \{0, 1, -1\}\} \setminus \{(0, 0)\}$ .

A walk stays in the quarter plane if each cumulative sum of steps is in  $\mathbb{N}^2$

- Of interest:

walks  $(0,0) \xrightarrow{n} (0,0)$  := #Walks of length n that start and end at  $(0,0)$

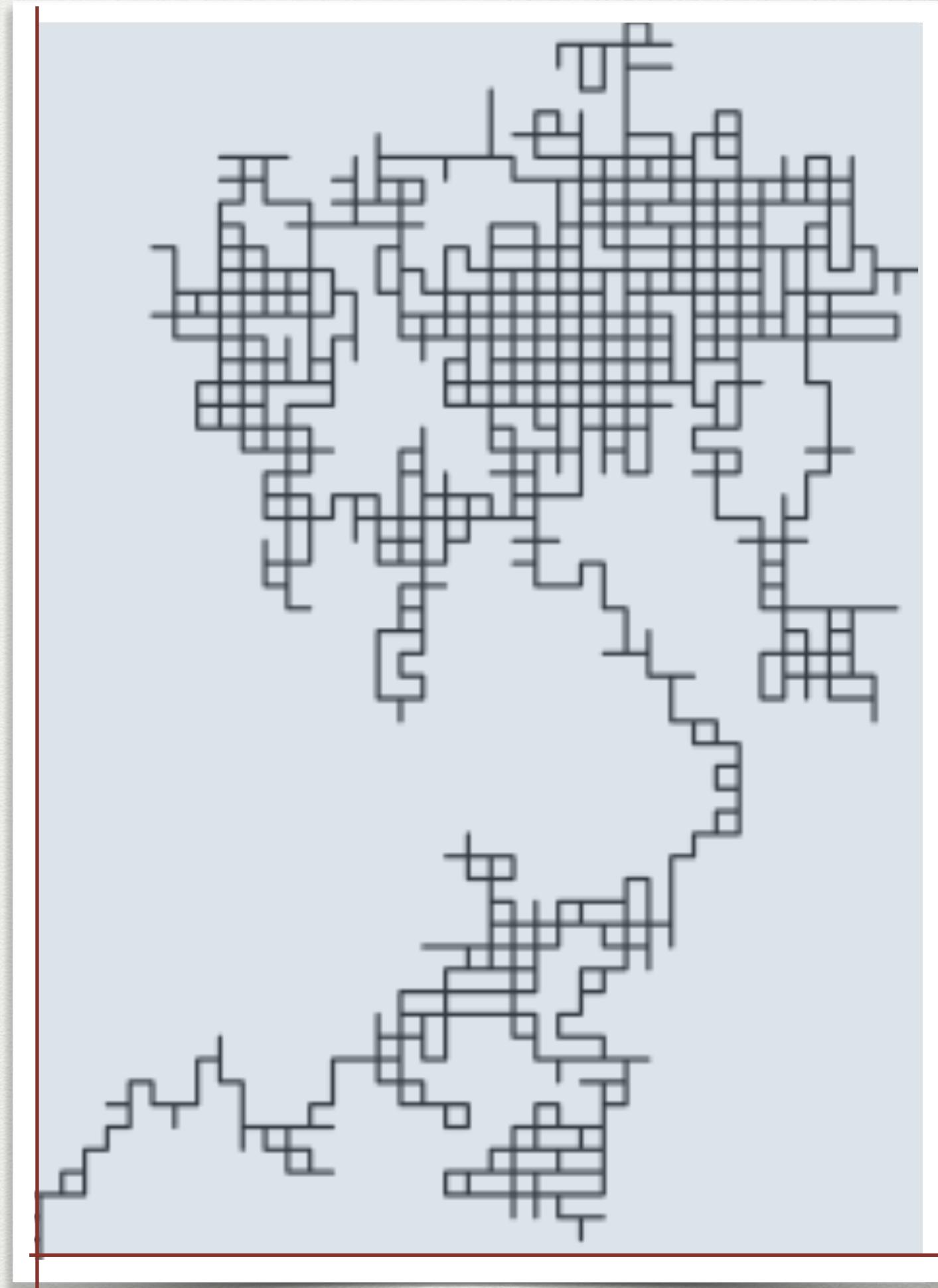
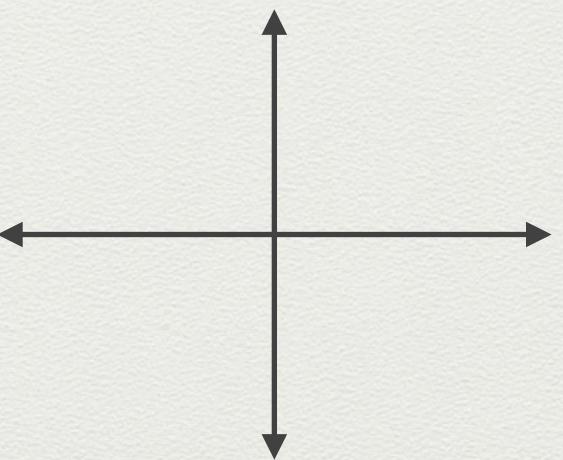
walks  $(0,0) \xrightarrow{n} (i,j)$  := #Walks of length n that start at  $(0,0)$  and end at  $(i,j)$

Total number of walks of length n

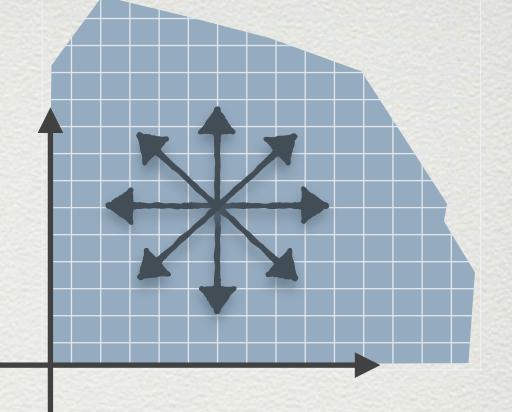
Is #walks to the point  $(i,j) > 0$ ?

Example: The Simple Walks

$$\mathcal{S} = \{(1,0), (-1,0), (0,1), (0, -1)\} = \{N, E, S, W\}$$



# CASE STUDY: SMALL STEP WALKS IN THE QUARTER PLANE



- $\mathcal{S} \subseteq \{(i,j) \mid i,j \in \{0,1,-1\}\} \setminus \{(0,0)\}$
  - Generating function marking endpoint and length:

$$Q(x, y; z) := \sum_{n \geq 0} \sum_{(i,j) \in \mathbb{N}^2} \text{walks } (0,0) \xrightarrow{n} (i,j) x^i y^j z^n \quad \in \mathbb{N}[x, y][[z]]$$

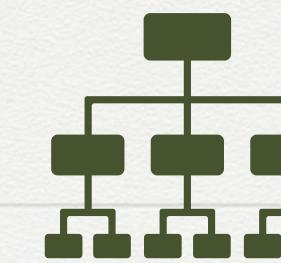
# REMARKABLE MULTI-FACETED EFFORT SINCE 2004

- Classify  $Q(x,y,z)$ . Classify  $Q(1,1,z)$

Histogram: Nature of  $Q(x,y;z)$

Category	Bin 1	Bin 2	Bin 3	Bin 4
Algebraic	*	*	*	*
D-finite	+	X	X	*
Differentially Algebraic	Y	Y	Y	+
D-Transcendental	X	X	X	X

# CLASSIFICATION VIA ENUMERATION



## LATTICE WALKS

bounding region  
symmetry of step sets  
underlying lattice



## FORMAL SERIES

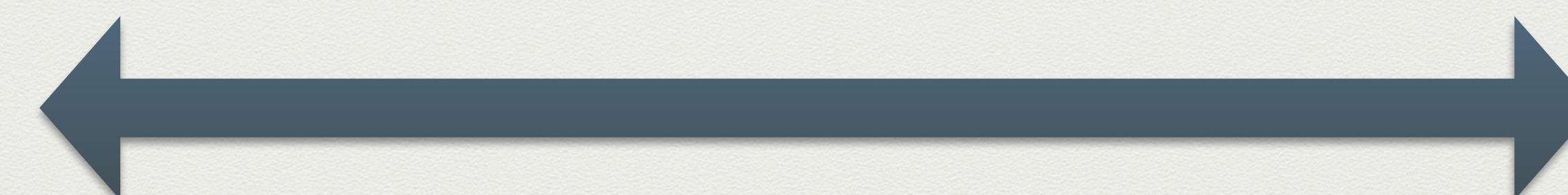
### ANALYTIC FUNCTIONS

Rational functions

Algebraic functions

Solutions of linear ODEs

Solutions of non-linear ODEs



THERE IS A TWO WAY FLOW OF INFORMATION

# TODAY: WALKS WITH D-FINITE GENERATING FUNCTIONS

Transcendence established via asymptotics

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Today we explore a core combinatorial source.

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“Almost anything is non-holonomic unless it is holonomic by design” - Flajolet Gerhold Salvy

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Today we explore a core combinatorial source.
- D-finite functions are a signal of structure.  
“Almost anything is non-holonomic unless it is holonomic by design” - Flajolet Gerhold Salvy
- Next goal: Combinatorial understanding of..
  - Models with algebraic GF that aren’t defined by an algebraic grammar; Transcendence established via asymptotics
  - Models with non-D-finite generating function that are differentiably algebraic.

# DIAGONAL EXTRACTIONS

- Taylor Series Expansion  $\frac{1}{1-x-y-z} = \sum \binom{i+j+k}{ijk} x^i y^j z^k$
- Consider the central diagonal  $F(z) = \text{Diag} \frac{1}{1-x-y-z} = \text{Diag} \sum \binom{i+j+k}{i,j,k} x^i y^j z^k = \sum \binom{3n}{n,n,n} z^n$
- In this case, we can compute asymptotics  $\binom{3n}{n n n} \sim \kappa 27^n n^{-1}$  hence  $F(z)$  is transcendental
- The diagonal of a multivariate rational function is D-finite. We can explicitly construct algebraic functions as diagonals.
- Related operations:  
**CT (constant term)**  $CT_{x,y}(x + 3 + y + y^2)t = 3t$       **Positive extraction**  $[x^{>0}y^{>0}](x + 2/x + 3 + 4y^2)t \Big|_{x=y=1} = 5t$
- Longstanding open question: Do all combinatorial D-finite functions arise this way? (Modulo some suitable conditions...)

## II. WALKS IN ALGEBRA

# WALKS ARE NATURAL IN ALGEBRAIC CONTEXTS

Walks are sequences of steps

Many algebraic objects are products of generators

We can answer questions about the number of ways  
something can be expressed as a product of generators...

... with constraints on intermediary products



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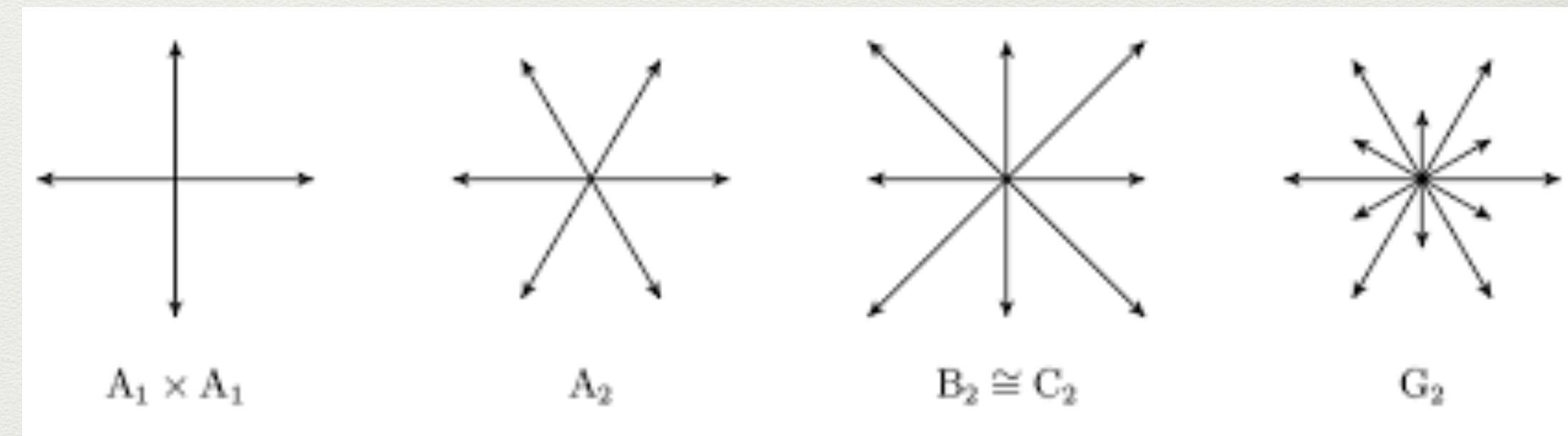
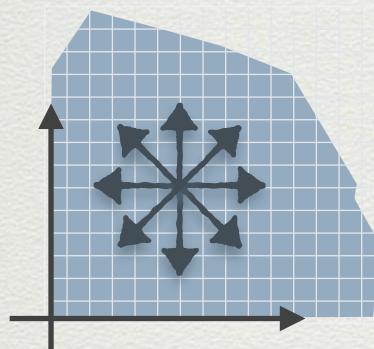
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# ROOT SYSTEMS

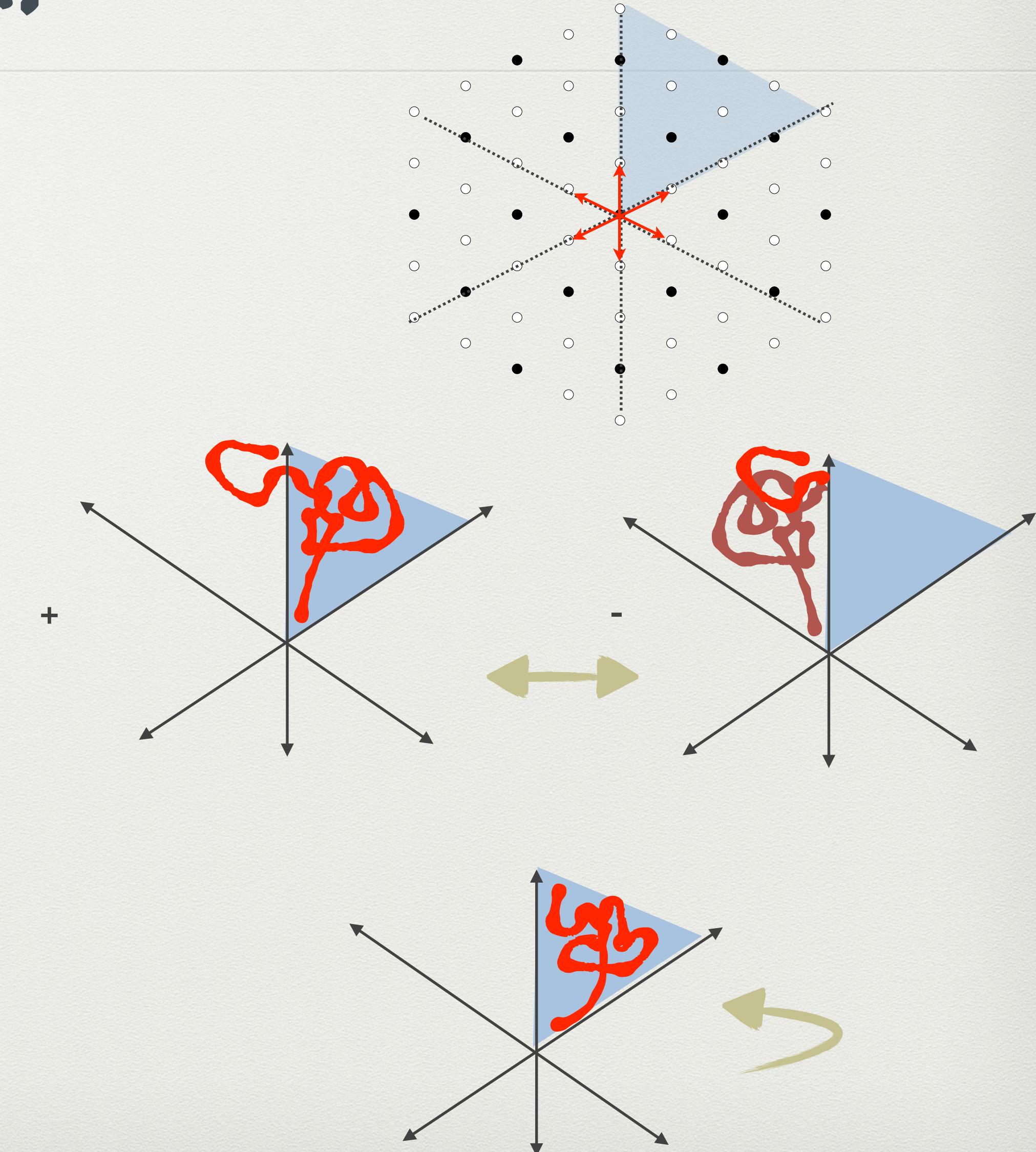
- A root system  $R$  is a configuration of vectors in a Euclidean space satisfying **certain geometrical properties**:
  - If you consider the line perpendicular to any root, say  $\beta$ , then reflection in that line sends any other root, say  $\alpha$ , to another root. Moreover, the root to which it is sent equals  $\alpha + n\beta$ , where  $n$  is an integer.
  - They are classified and are central to Lie Algebra.
  - Use them to define a lattice, with a primary Weyl chamber. We can count walks on this lattice that are restricted to the Weyl chamber. The reflections form a group.
    - $A_1 \times A_1$ : models symmetric across both axes
    - $A_2$ : “Tandem” and “Double Tandem” models
    - $B_2$ : Gouyou-Beauchamps



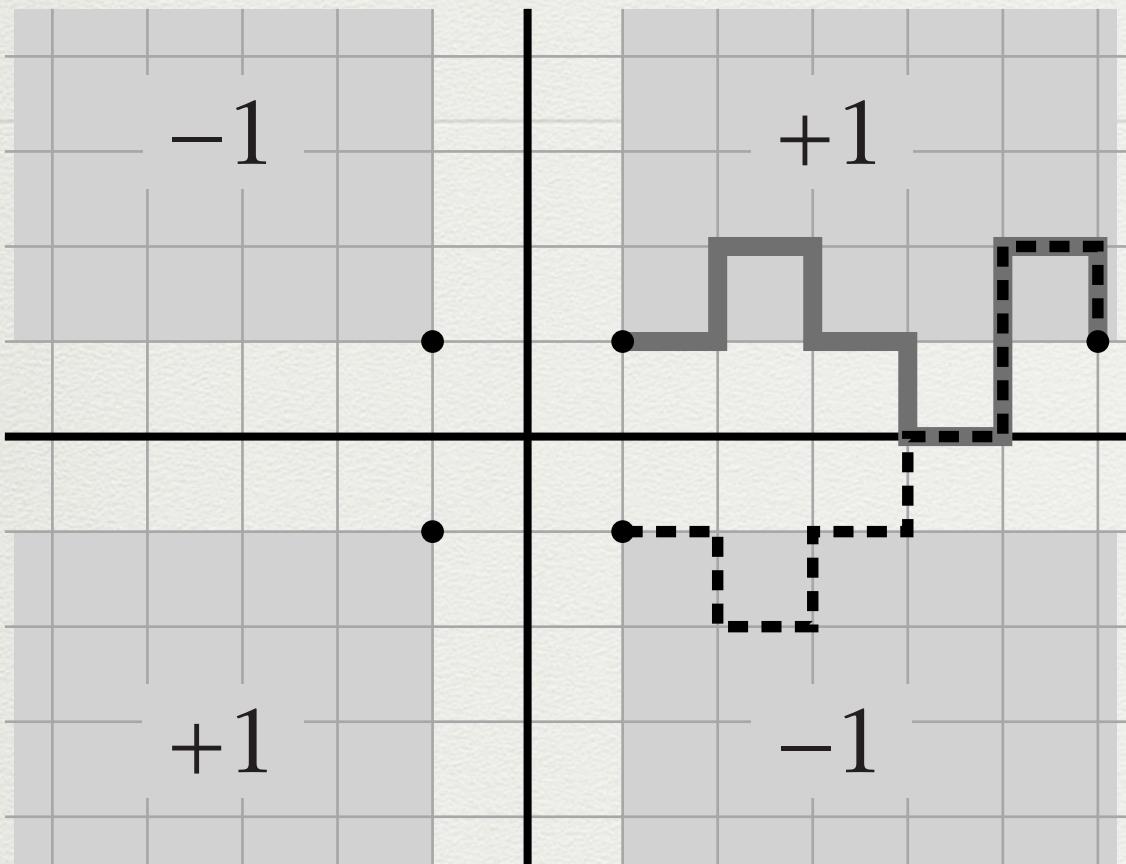
Rank 2 systems

# REFLECTABLE WALKS RESTRICTED TO A WEYL CHAMBER.

- Consider a step sets stable fixed by the reflection group, and steps that **do not** permit to jump over boundaries
- **Reflection principle** ~ A sign reversing involution.
- Two walks are paired using the first time they hit a wall. Walks that never hit a wall are fixed by the map.
- Underlying: Weyl character formula



# SIMPLE WALKS IN THE FIRST QUADRANT

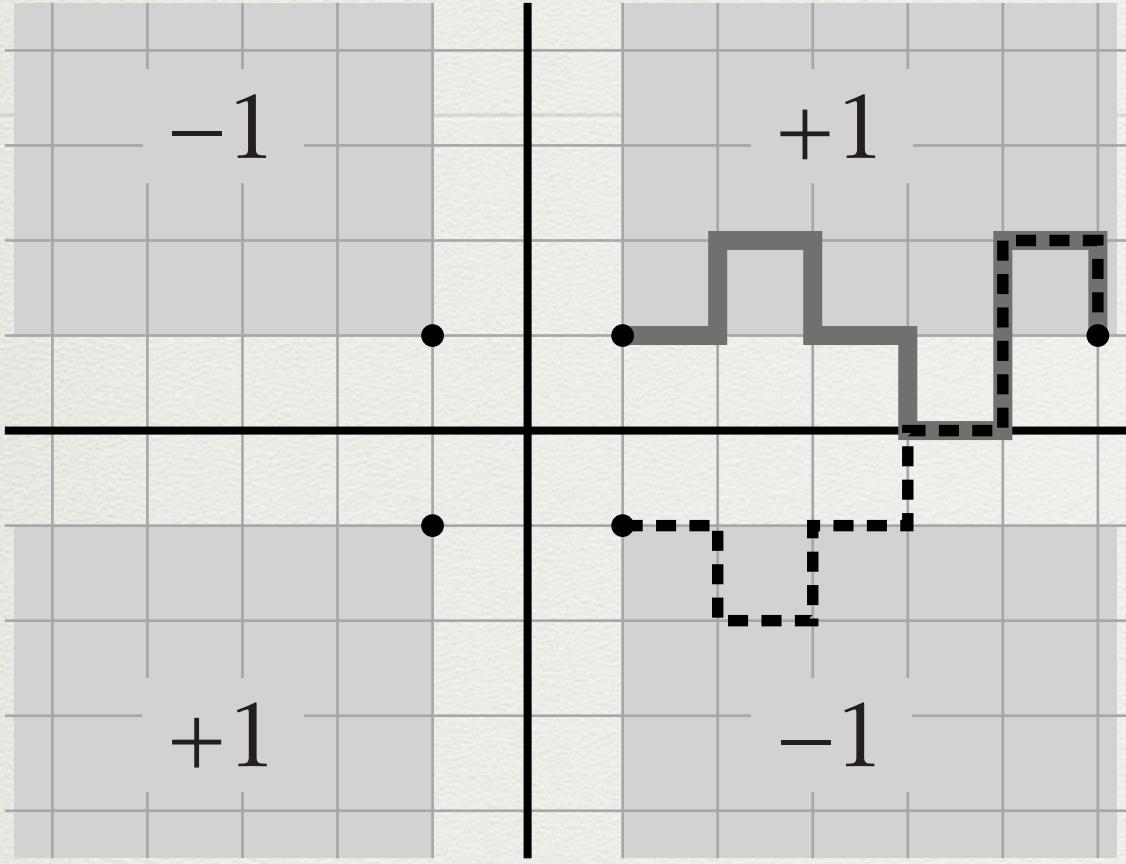


Sum of walks that stay in  
their chamber

$=$

Signed sum of all walks starting at (1,1)  
and its image under the reflections.

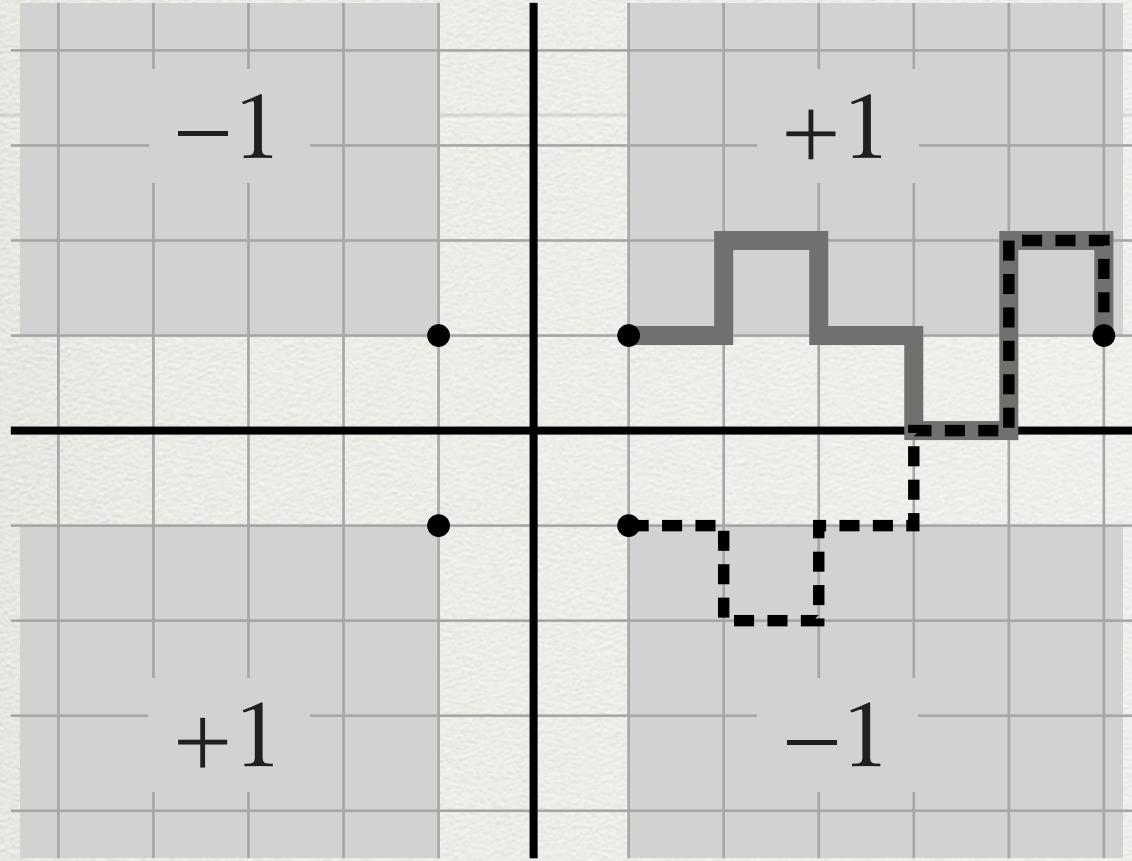
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$$\begin{aligned} & \sum_{n \geq 0} \text{walk}_{\mathbb{N}^2}((0,0) \xrightarrow{n} (0,0)) z^n \\ &= [x^1 y^1] \frac{xy - x/y + (xy)^{-1} + y/x}{(1 - z(x + 1/x + y + 1/y))} \end{aligned}$$

# SIMPLE WALKS IN THE FIRST QUADRANT



Sum of walks that stay in  
their chamber

=

Signed sum of all walks starting at  $(l,l)$   
and its image under the reflections.

walks that end at a given point ...

$$\text{Diag } \frac{(x^2 - 1)(y^2 - 1)}{1 - z(x^2y + y + xy^2 + x)}$$

walks that end on an axis ...

$$\text{Diag } \frac{(x^2 - 1)(y^2 - 1)}{1 - z(x^2y + y + xy^2 + x)(l-x)}$$

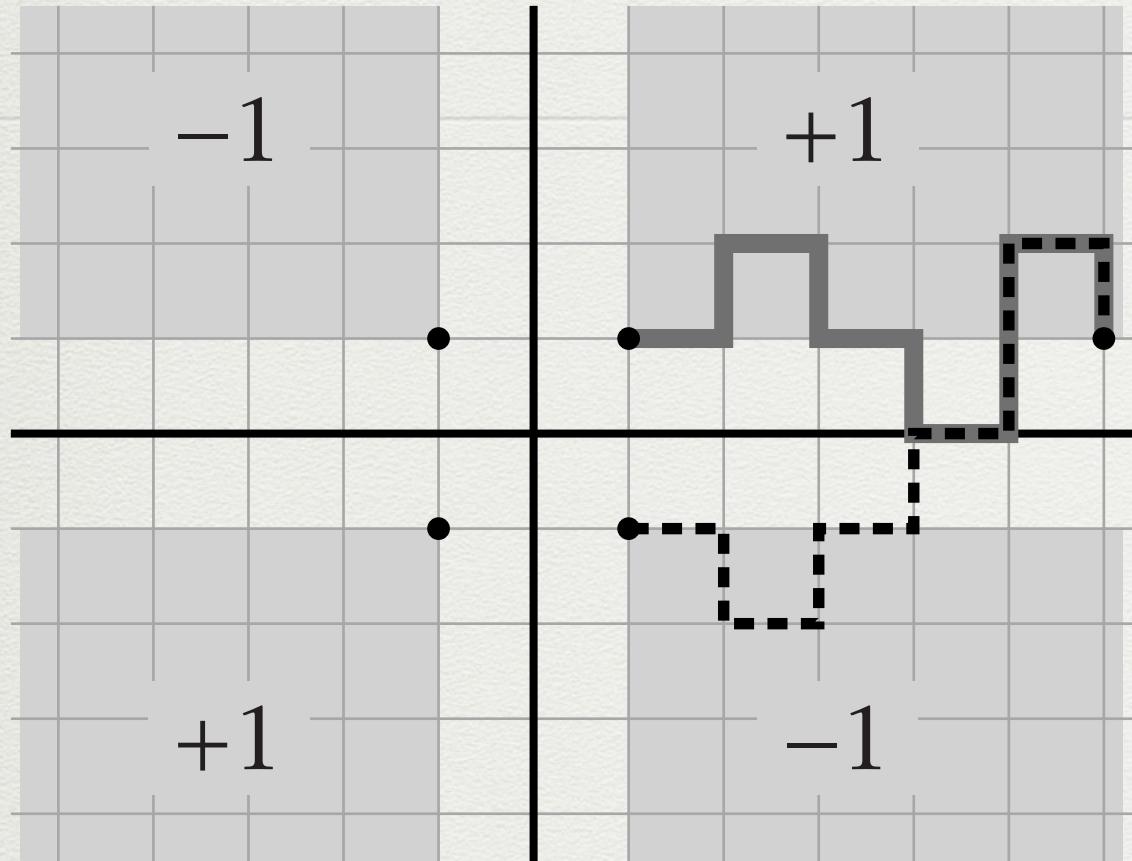
$$\sum_{n \geq 0} \text{walk}_{\mathbb{N}^2}((0,0) \xrightarrow{n} (0,0)) z^n$$

$$= [x^1 y^1] \frac{xy - x/y + (xy)^{-1} + y/x}{(1 - z(x + 1/x + y + 1/y))}$$

and walks that end anywhere.

$$\text{Diag } \frac{(x^2 - 1)(y^2 - 1)}{1 - z(x^2y + y + xy^2 + x)(l-x)(l-y)}$$

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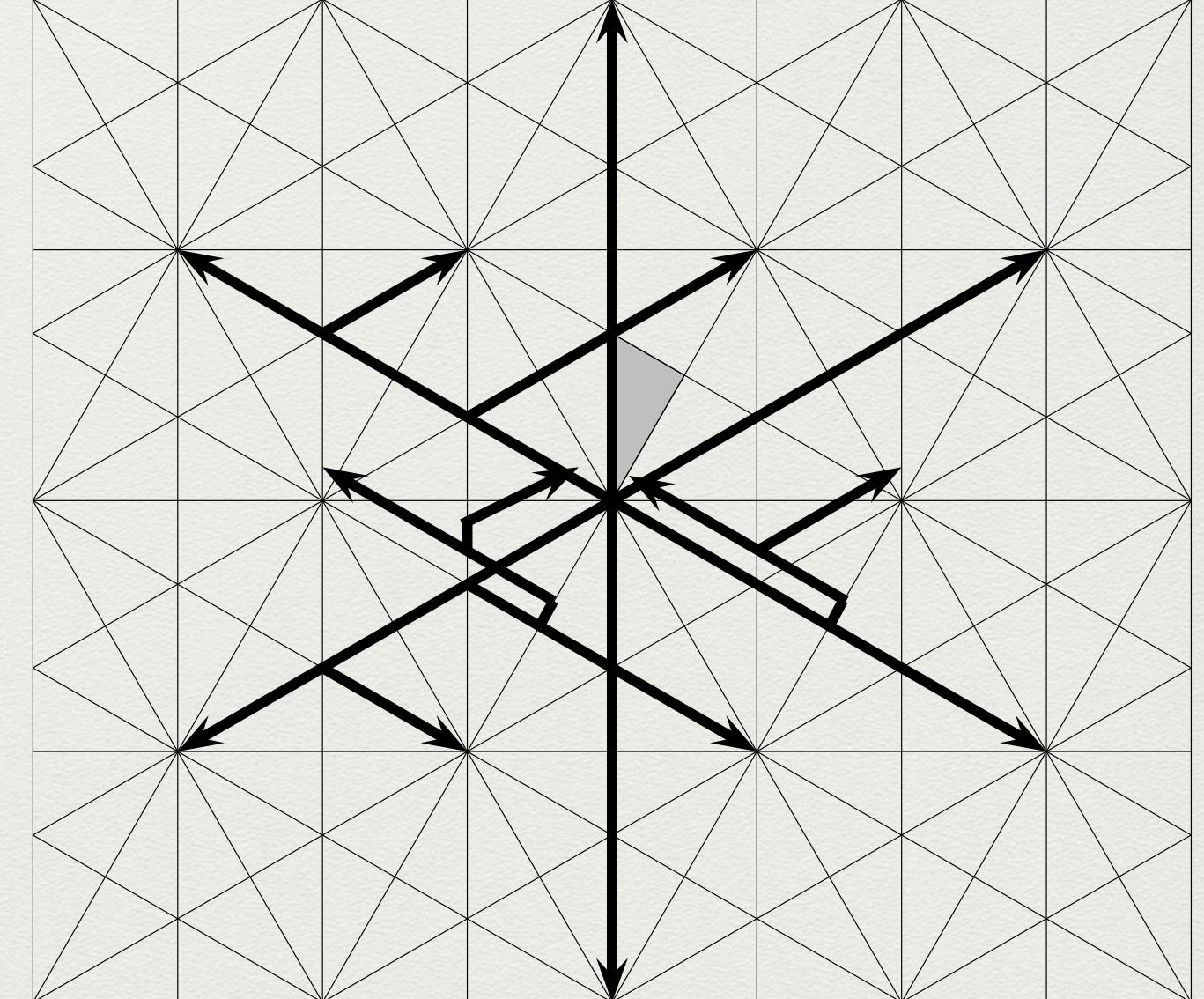
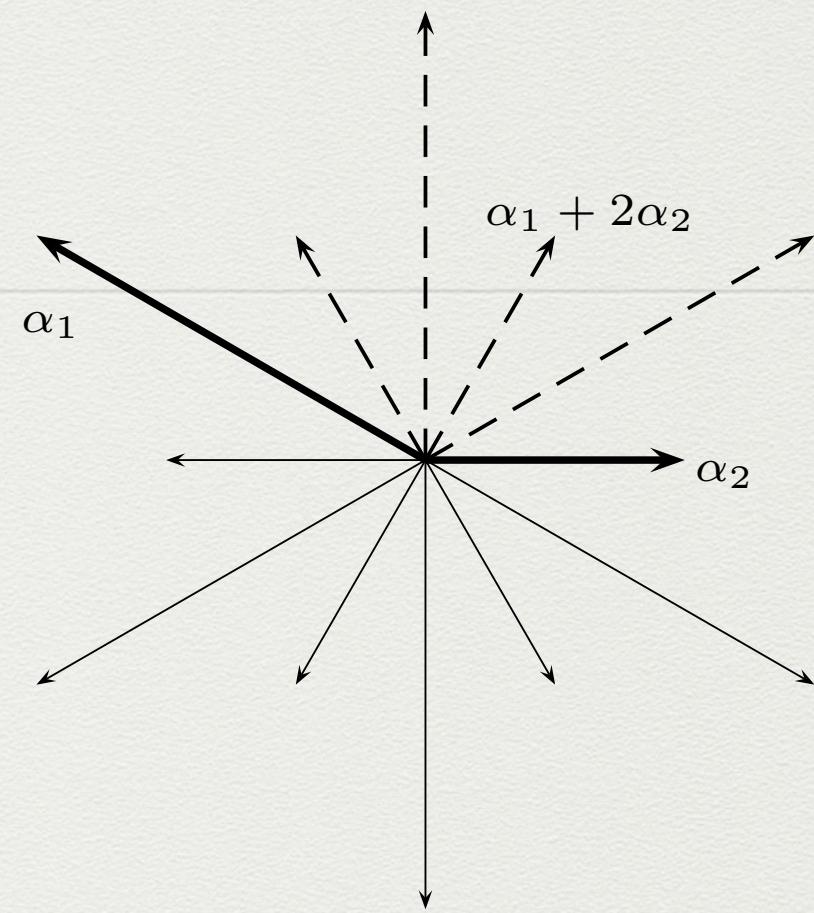
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$$\text{Diag } \frac{(x^2 - 1)(y^2 - 1)}{1 - z(x^2y + y + xy^2 + x)(1-x)(1-y)}$$

WHAT CAN WE DO WITH THESE EXPRESSIONS?

# AN UNUSUAL FAMILY: G<sub>2</sub>

- Root system of type G<sub>2</sub> give rise to interesting walks.
- Plane is tiled into 12 chambers
- Each step is built of mini-steps. At no point can it leave the Weyl chamber.
- We can find a generating function expression to count excursions, walks that end on a boundary, and walks that end anywhere.
- By similar machinery, GFs are extractions of rational functions.
- What “big steps” that are manageable can look like.



Images from Admissible subsets and Littelmann paths in affine Kazhdan-Lusztig theory Jérémie Guillet

# REFLECTIONS AND DIAGONALS

- Other reflection arguments are possible when we consider a winding plane.
- Reflectable/Algebraic walks: The GFs are expressible as diagonals of rational functions
- Orbit sum:  $S=\{E, SE, W, NW\}$  in the quarter plane

$$Q(1,1,t) = [x^{\geq}y^{\geq}] \frac{(1-\bar{x})(1+\bar{x})(1-\bar{y})(1-\bar{x}^2y)(1-x\bar{y})(1+x\bar{y})}{1-t(x+\bar{x}+x\bar{y}+\bar{x}y)} \Big|_{x=y=1} \left(\bar{x} = \frac{1}{x}; \bar{y} = \frac{1}{y}\right).$$

- If we cannot determine an explicit form for  $Q(l,l;z)$ , can we estimate

$$[z^n]Q(1,1;z) = \sum_{(i,j) \in \mathbb{N}^2} \text{walks } (0,0) \xrightarrow{n} (i,j)?$$

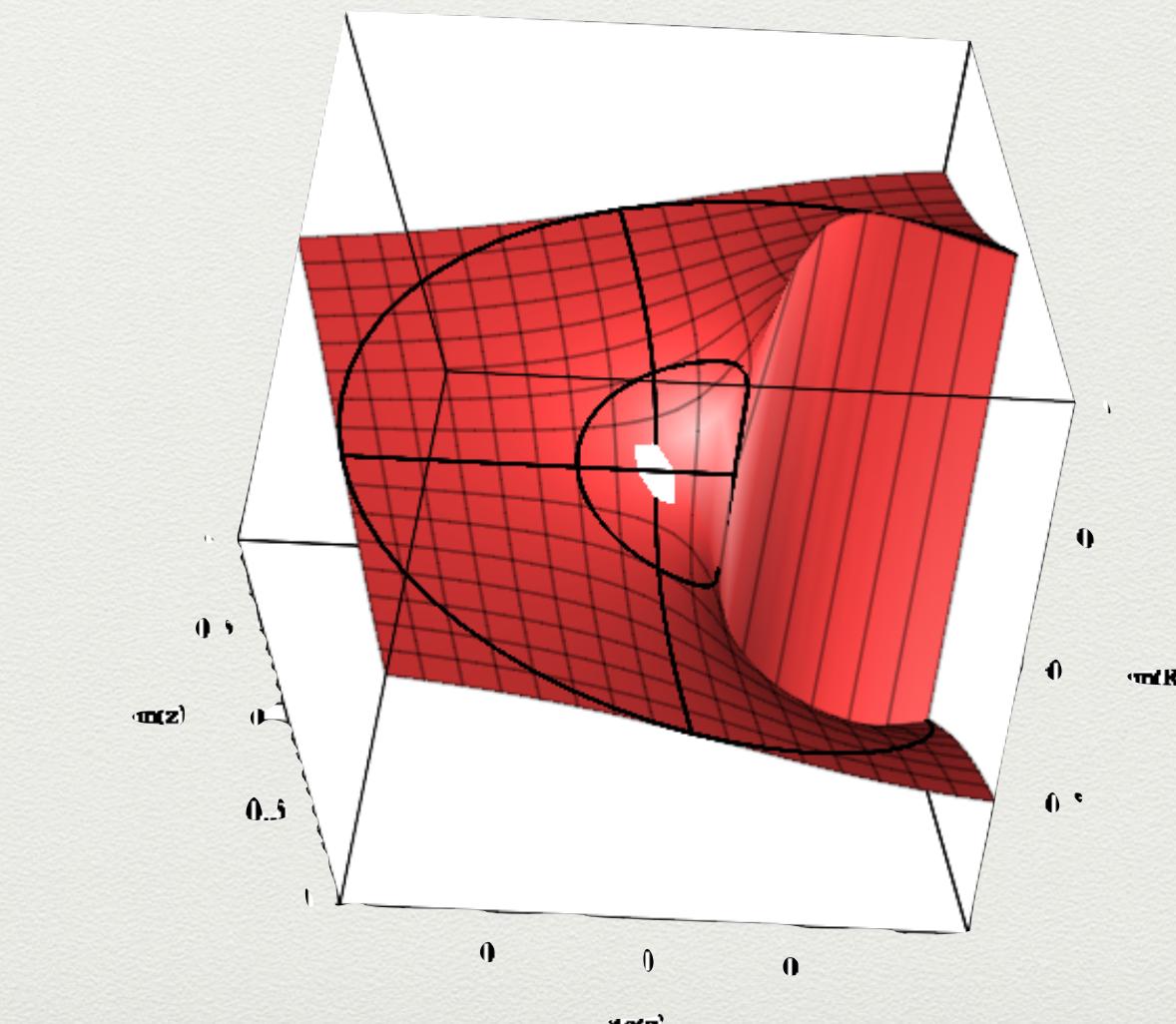
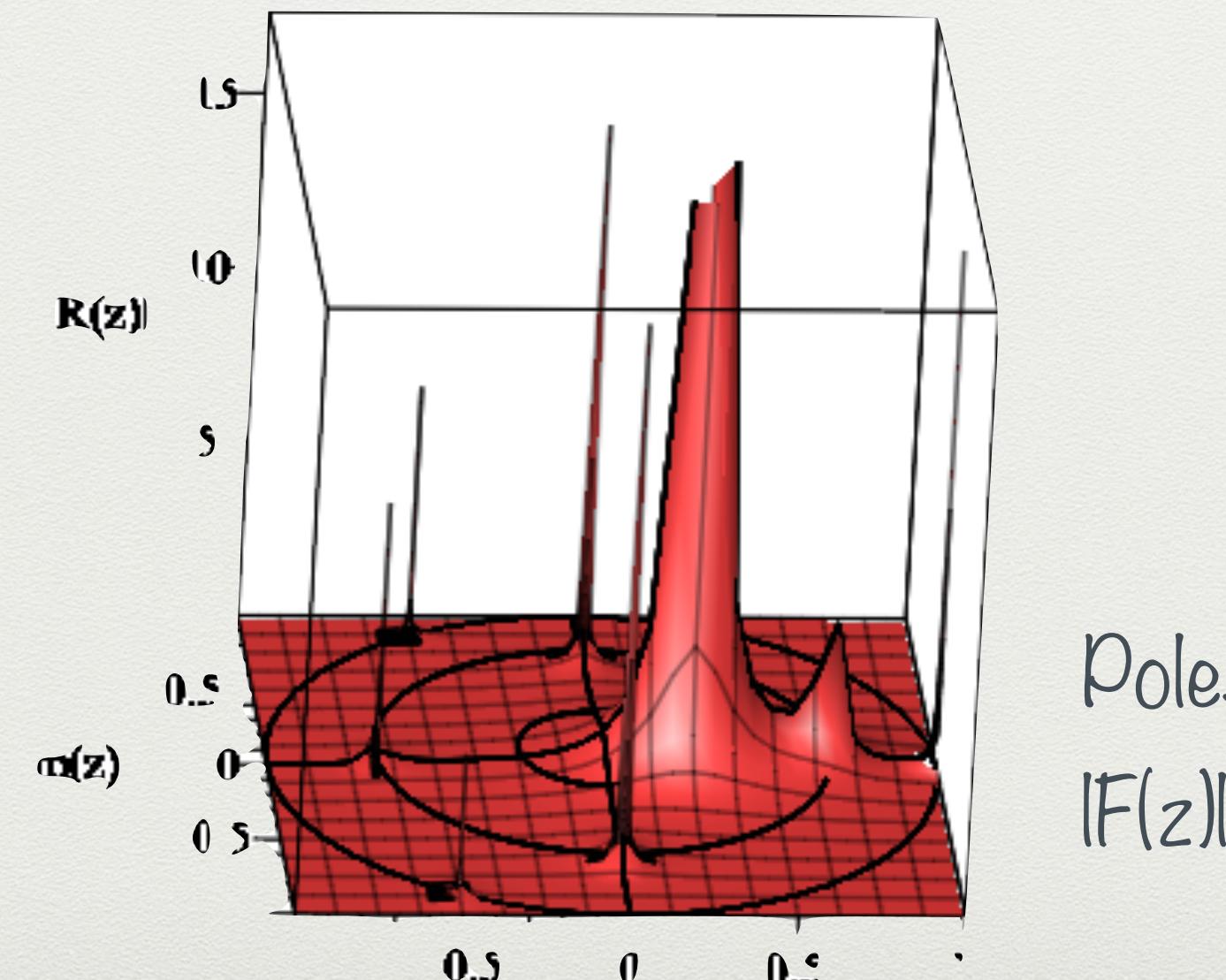
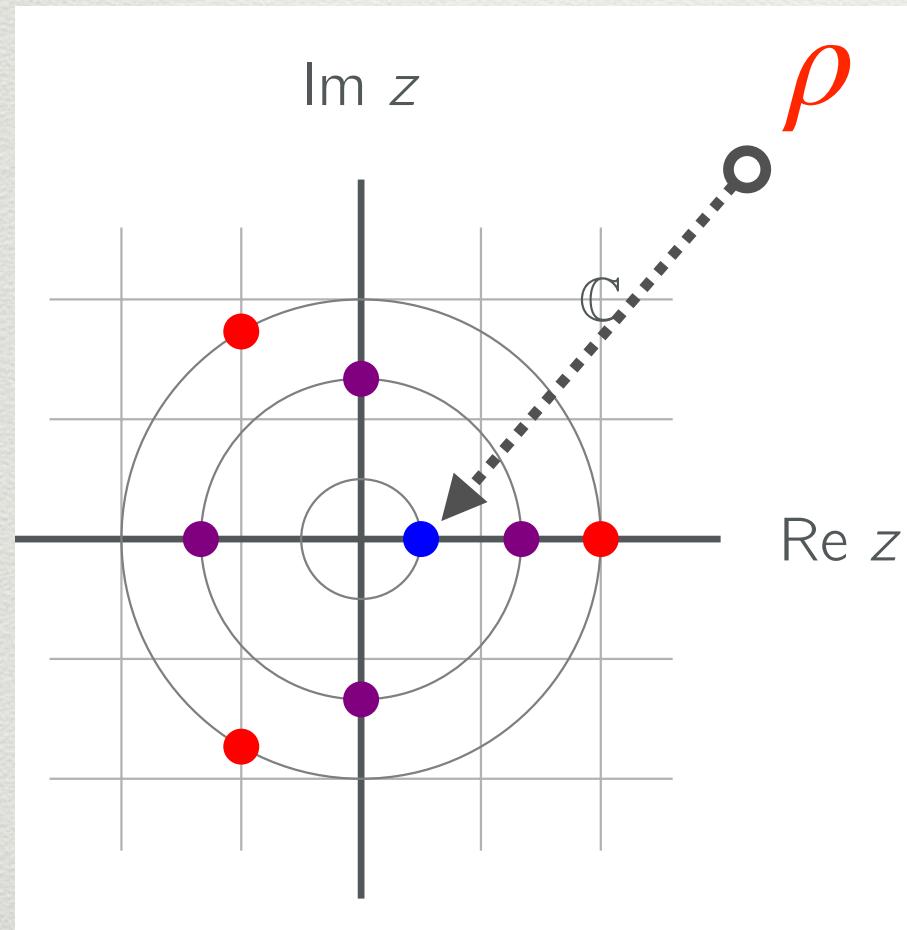
### III. THE GEOMETRY OF REFLECTABLE WALKS

# MANTRA OF UNIVARIATE ANALYTIC COMBINATORICS

- The **location** of the dominant singularity  $\rho$  of  $C(z)$  tells you about the **exponential growth** of  $c(n)$ . (Radius of convergence)
- The **nature** of the dominant singularity (eg. pole of order  $k$ , branch cut) of  $C(z)$  tells you about the **sub-exponential** growth

$$C(z) = \sum_{n \in \mathbb{N}} c(n) z^n$$

$$c(n) \sim \kappa \rho^{-n} n^{-r}$$



# VISUALIZING DOMAINS IN HIGHER DIMENSION COMPLEX SPACE

$$\frac{1}{1-x-y} = \sum \binom{k+\ell}{k, \ell} x^k y^\ell$$

The domain of convergence  $\mathcal{D}$  is a subset of  $\mathbb{C}^2$

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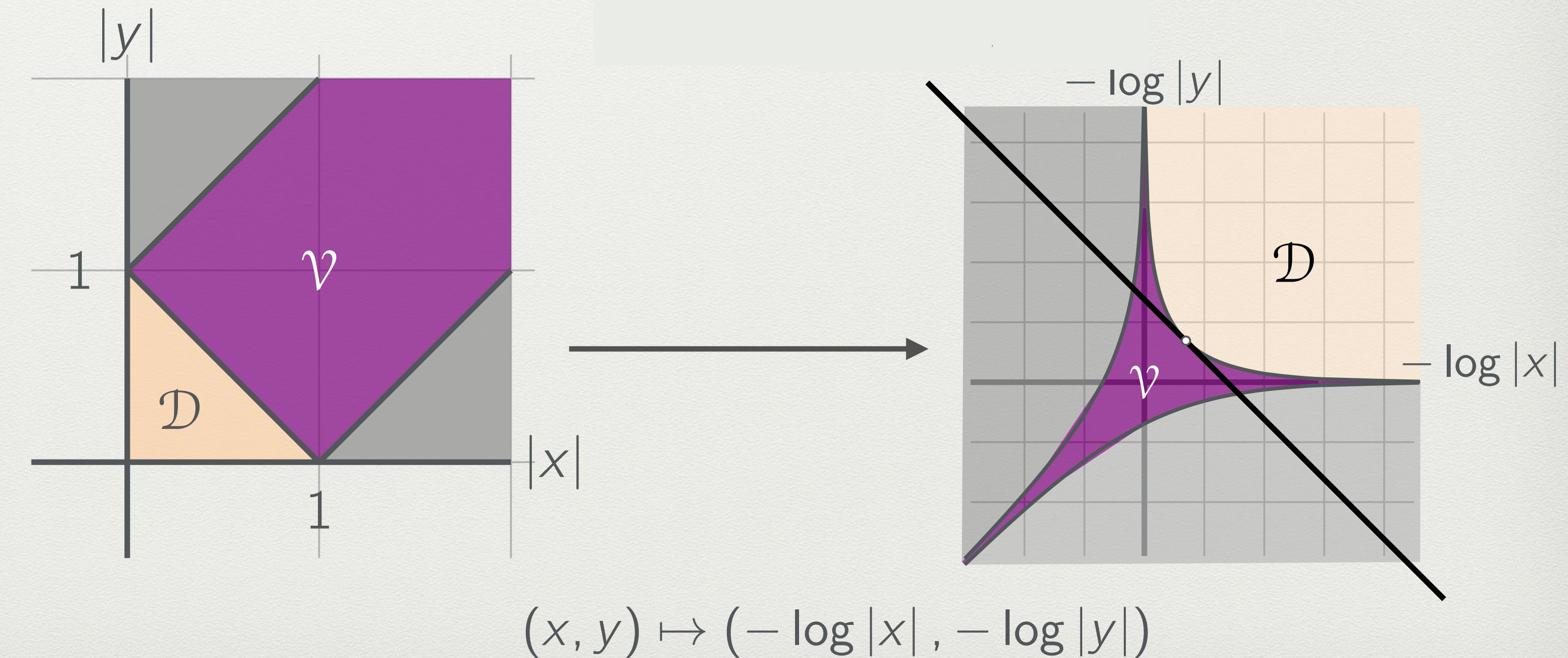
- Power series are **absolutely convergent!**
- Plot points in  $\mathbb{R}^2$  where the series is convergent.
- What is the multivariable equivalent of dominant singularity?

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# HIGHER DIMENSIONAL MANTRA

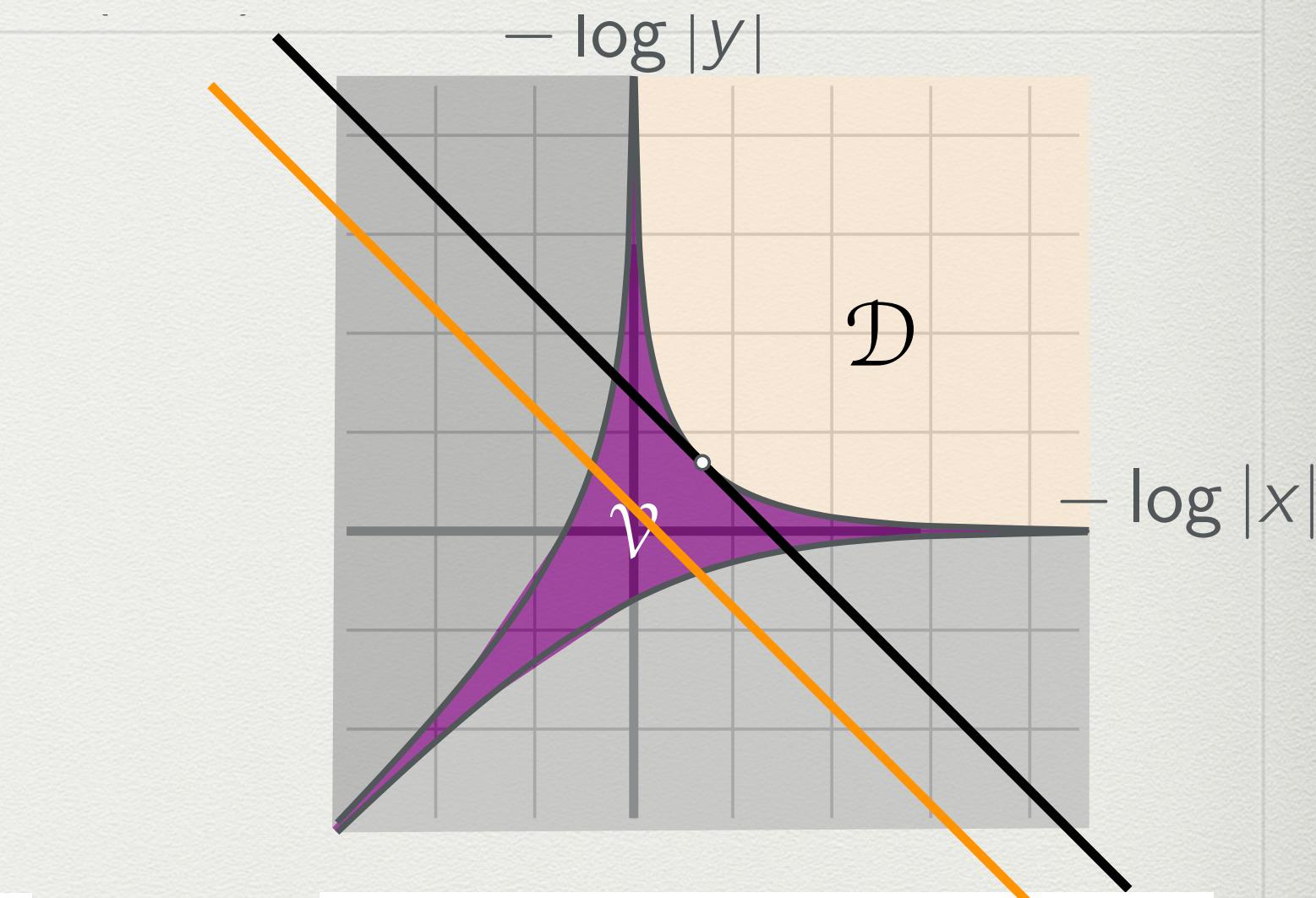
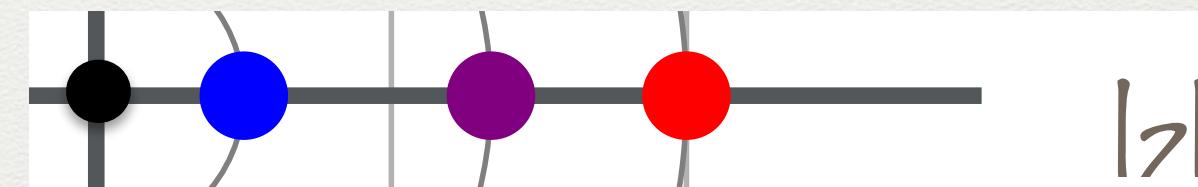
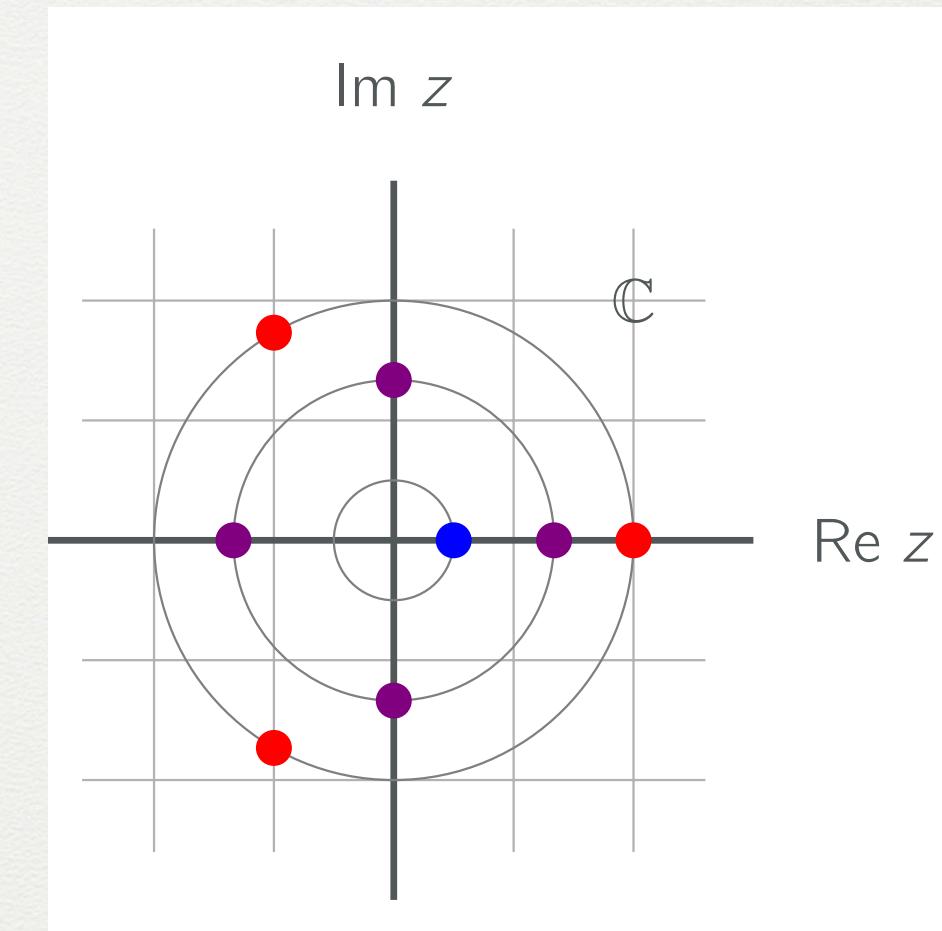
The boundary of convergence of the series (~variety defined by the denominator) identifies **critical points**. Roughly the analogue of **dominant singularity**.

The **location** of the critical point determines the **exponential growth**.

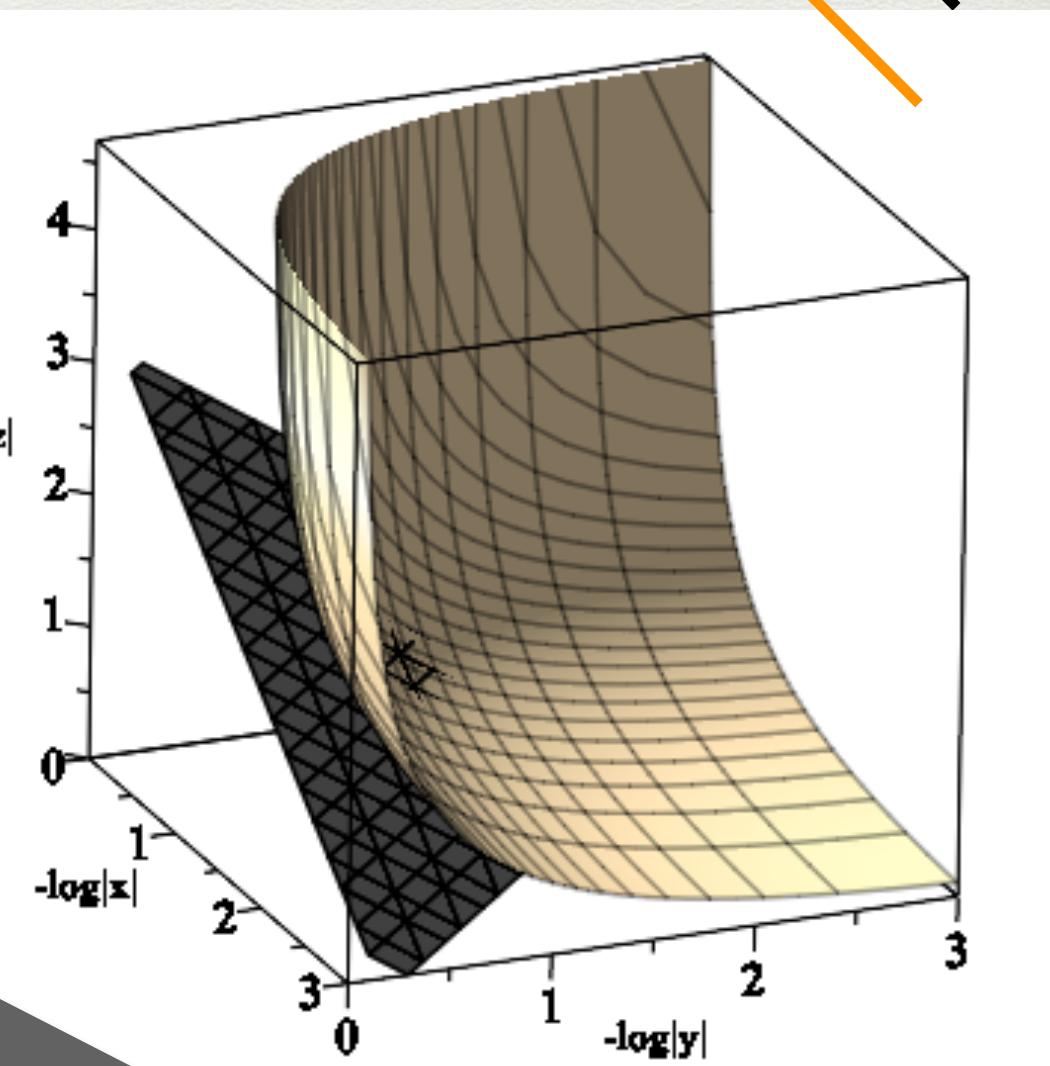
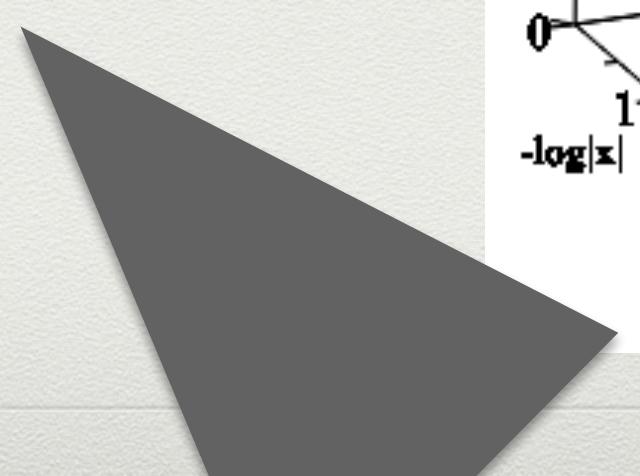
The **geometry at that point** determines the **sub-exponential growth**. The formulas incorporate the value of the numerator at the critical point.

The formulas relevant for walks give sub-exponential growth exponent in  $\frac{1}{2}\mathbb{N}$

(links **transcendence** to the order of the zero in the denominator)



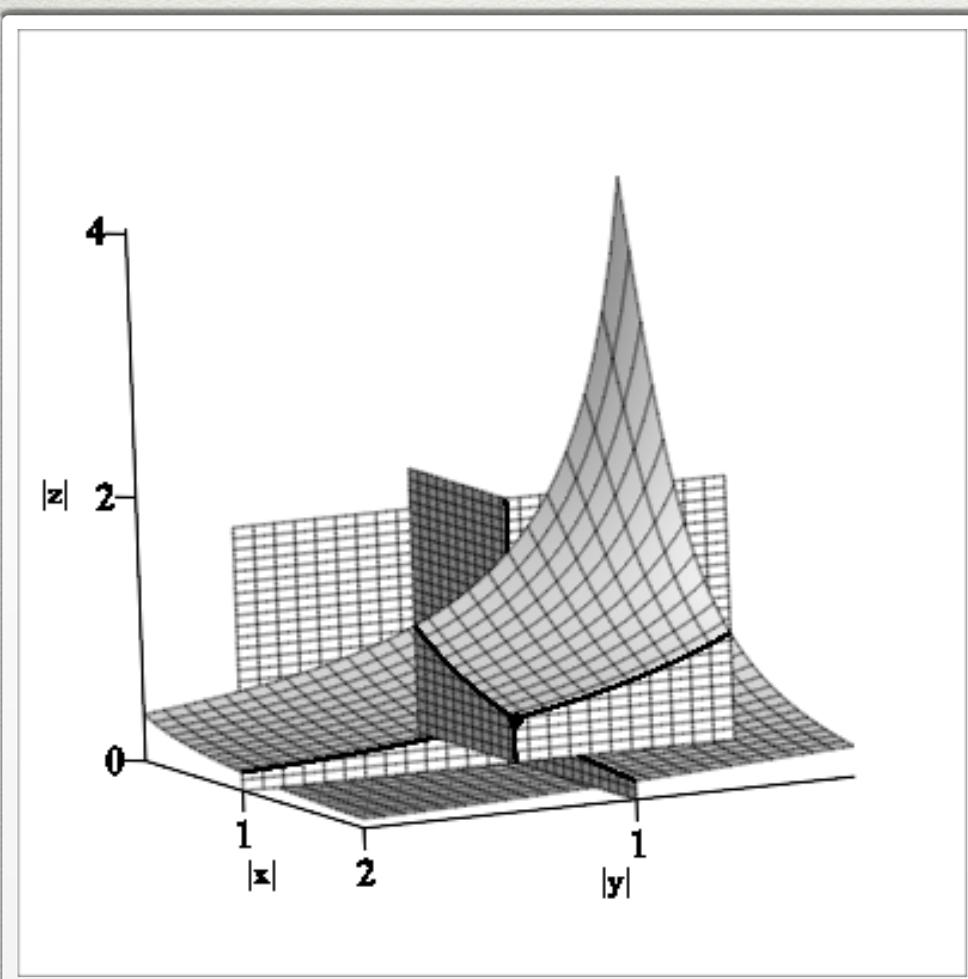
$|z|$



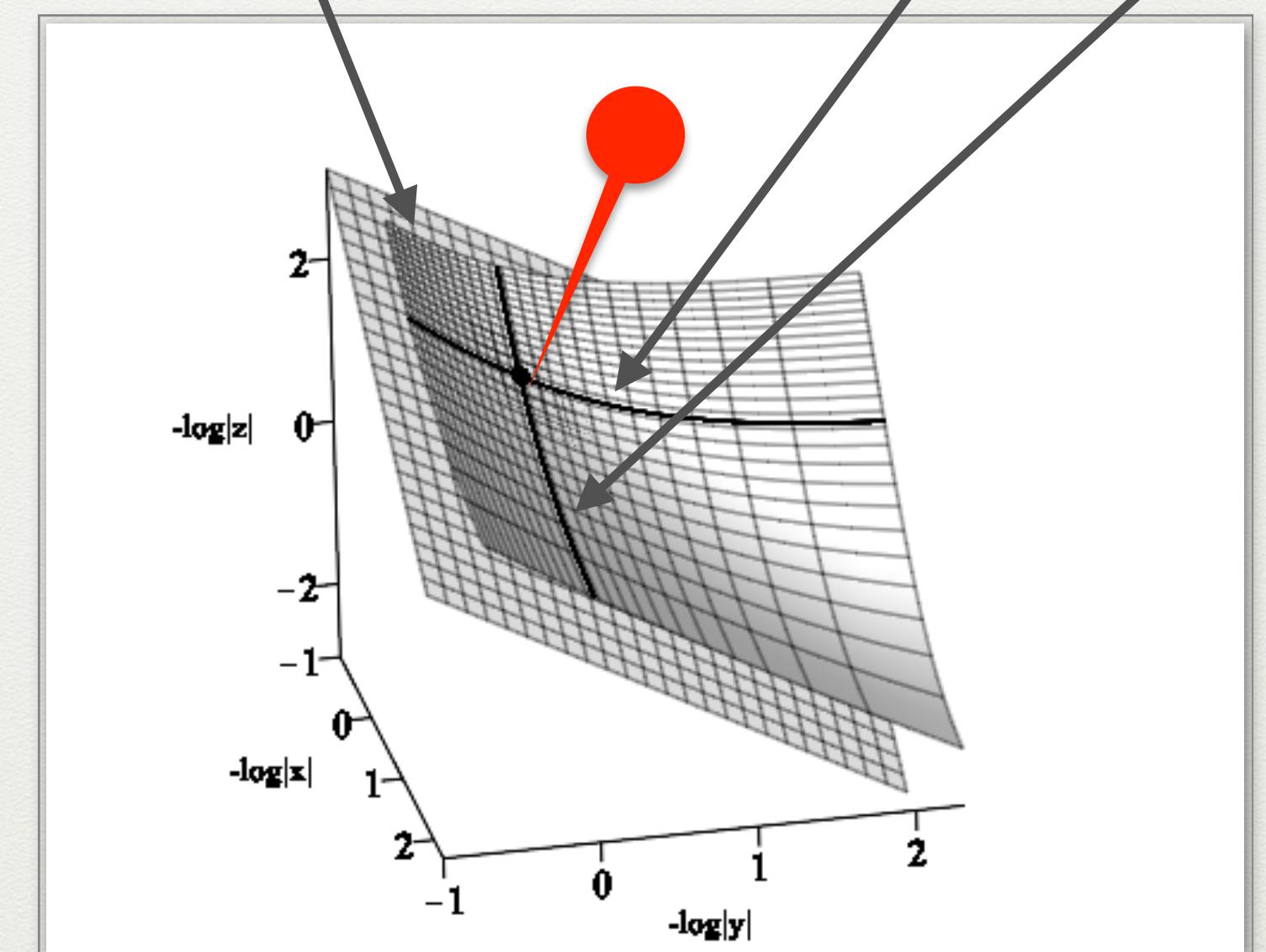
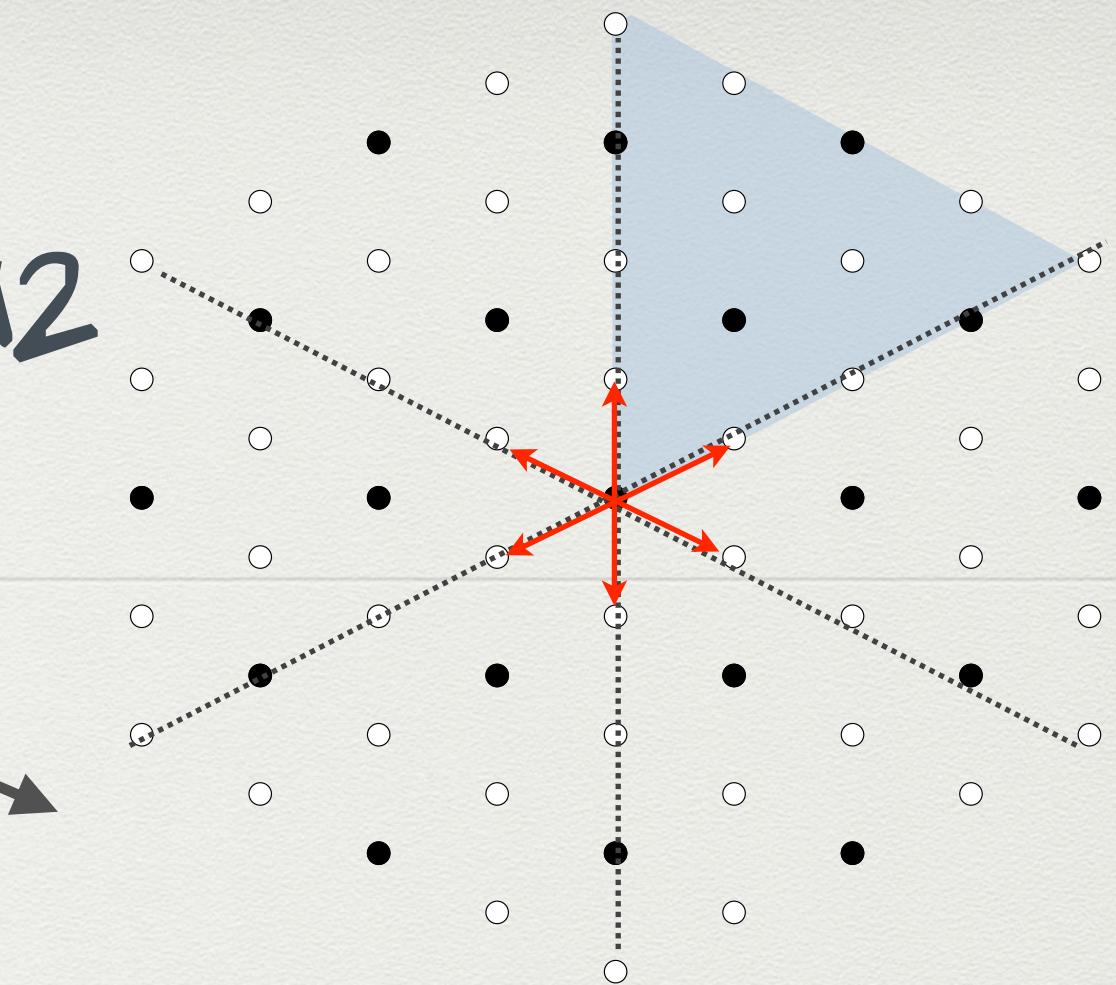
# TANDEM MODEL / WALK IN $A_2$

- Allows us to see the connection between walks that end at the origin, an axis, or anywhere.
- This model has algebraic GF for walks that end anywhere and transcendental GF for excursions.

$$\frac{3\sqrt{3}}{2\Gamma(\frac{1}{2})} \frac{3^n}{n^{3/2}} \quad \sqrt{3} \frac{3^{3m}}{\pi m^4}$$



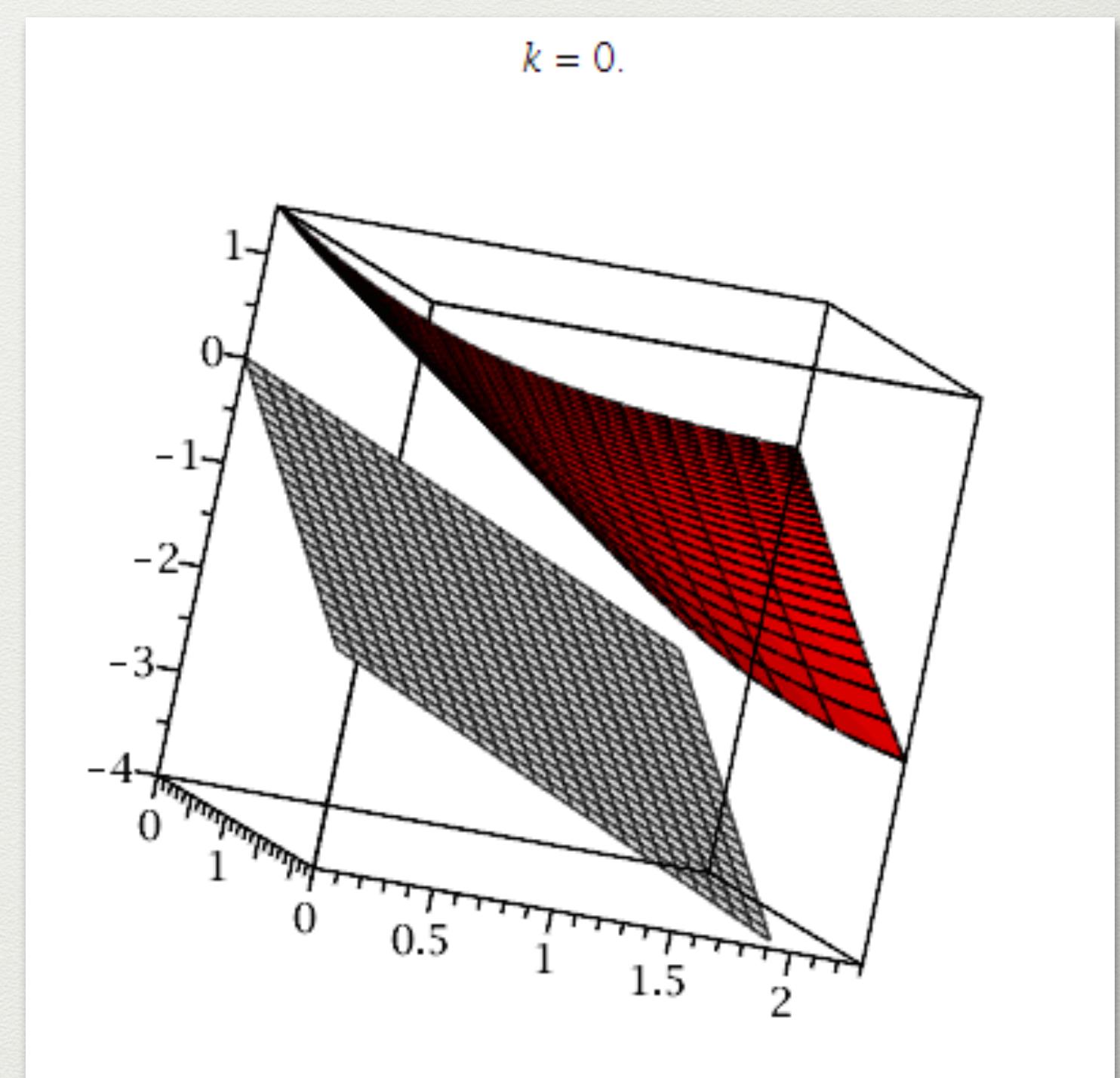
$$\frac{(1 - y^2/x + y^3 - x^2y^2 + x^3 - x^2/y)}{(1 - zxy(1/x + x/y + y)) (1 - x)(1 - y)}$$



We conclude: Three critical points:

$$(w, w^2, w^2/3), (w^2, w, w/3), (1, 1, 1/3)$$

(Potential for periodicity..)

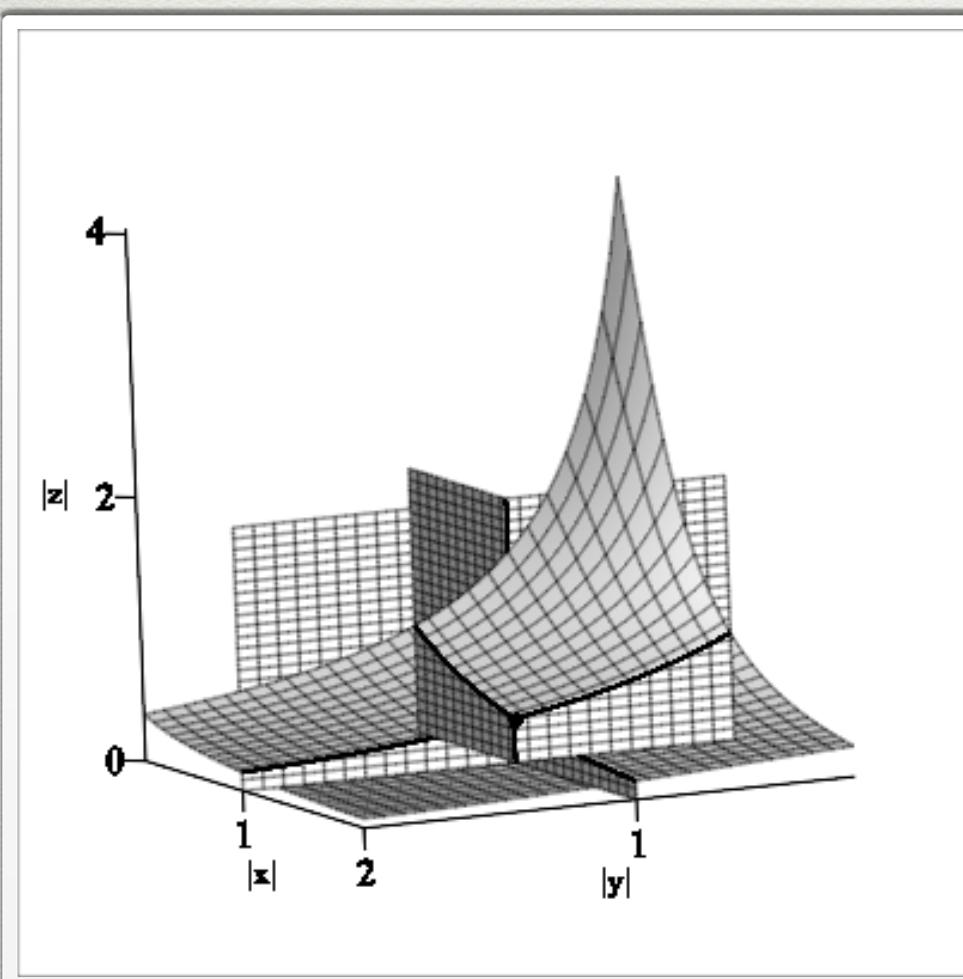


$$\frac{3\sqrt{3}}{2\Gamma(\frac{1}{2})} \frac{6^n}{n^{3/2}}$$

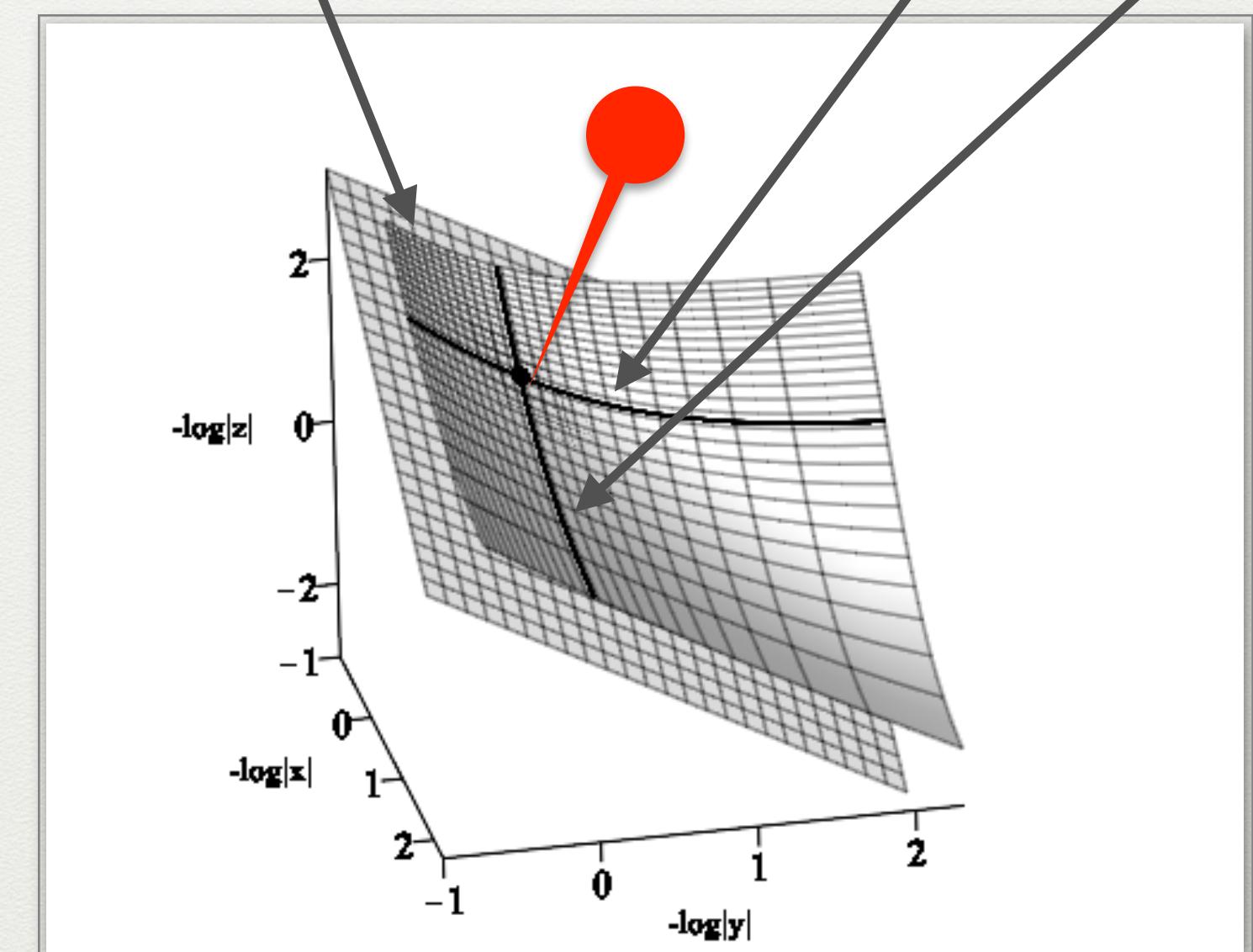
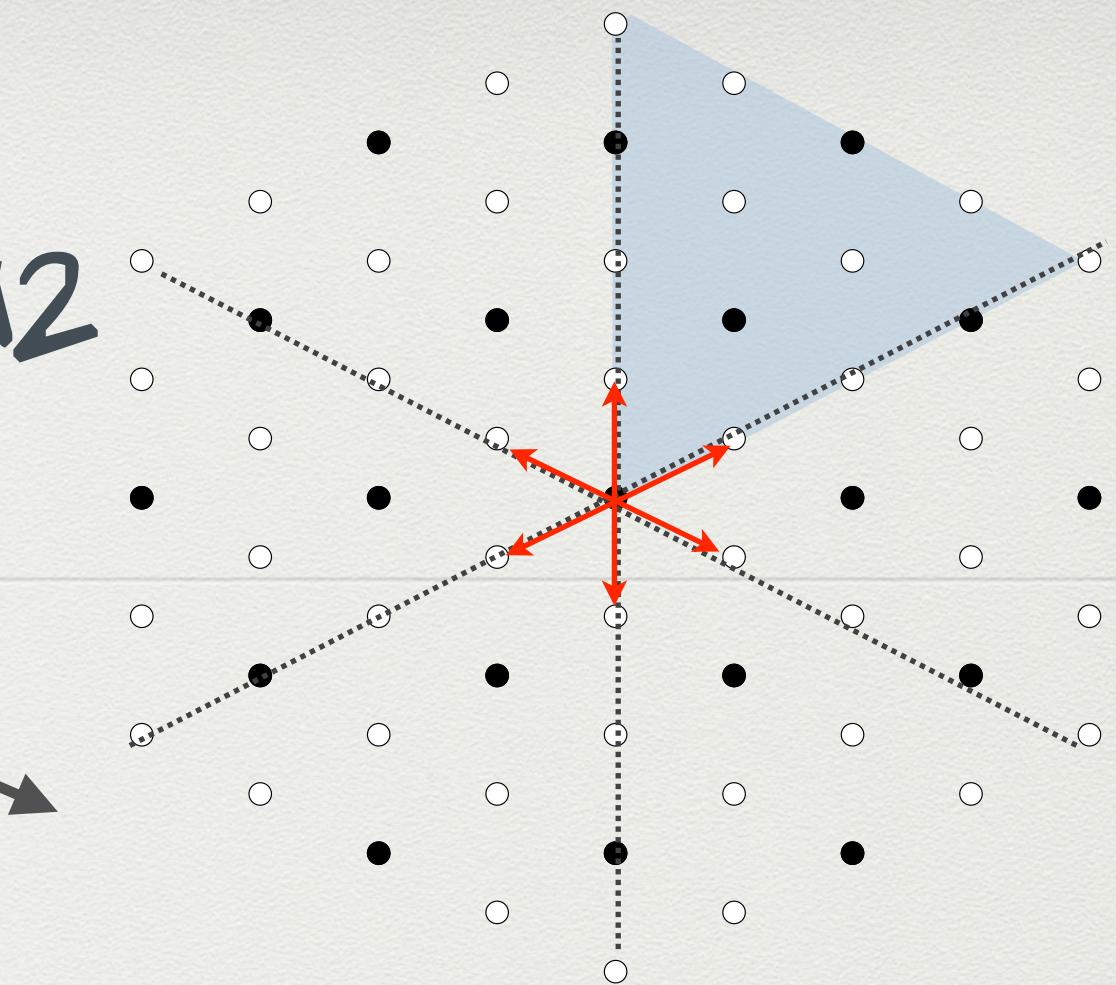
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- This model has algebraic GF for walks that end anywhere and transcendental GF for excursions.

$$\frac{3\sqrt{3}}{2\Gamma(\frac{1}{2})} \frac{3^n}{n^{3/2}} \quad \sqrt{3} \frac{3^{3m}}{\pi m^4}$$



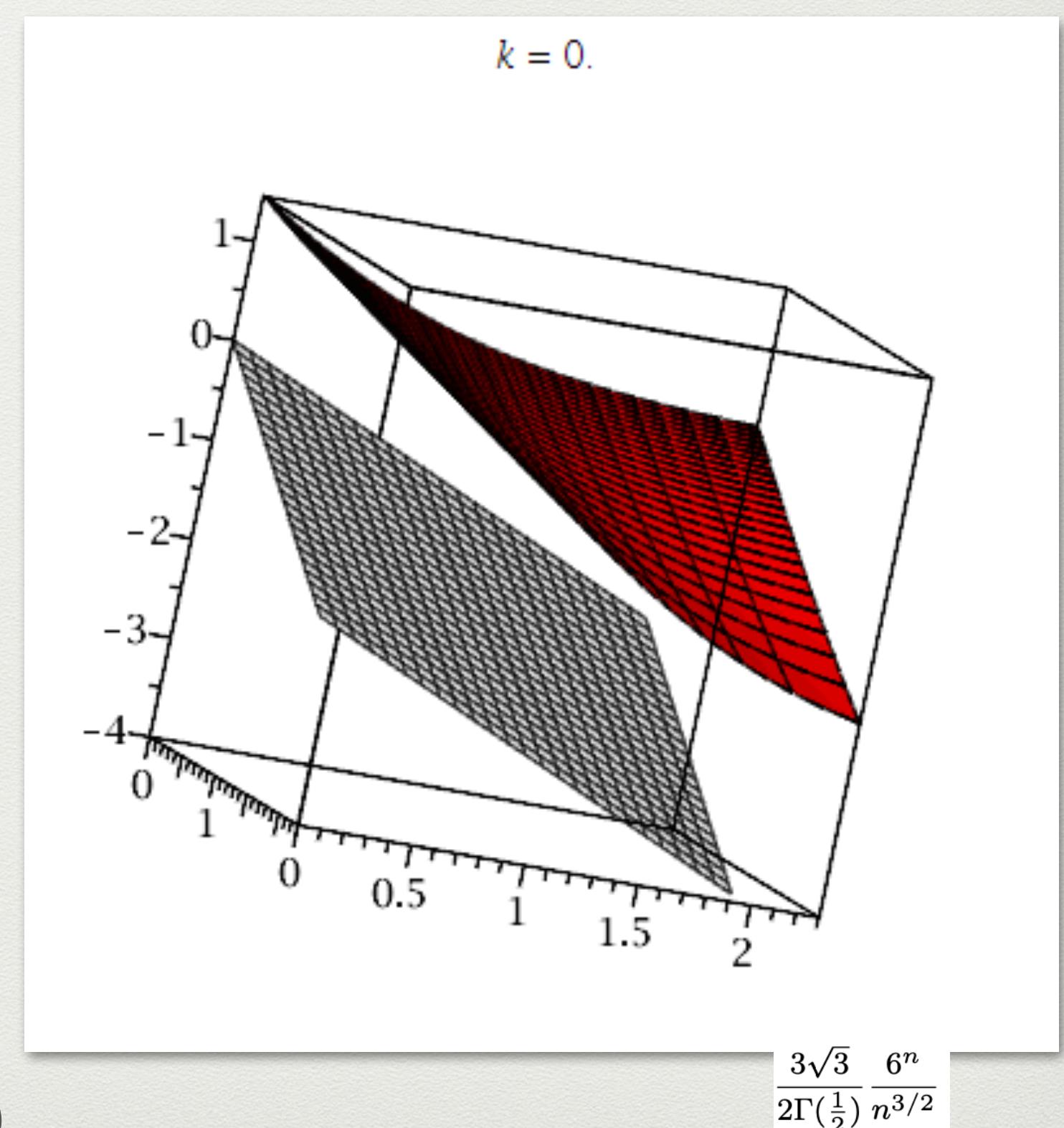
$$\frac{(1 - y^2/x + y^3 - x^2y^2 + x^3 - x^2/y)}{(1 - zxy(1/x + x/y + y))(1 - x)(1 - y)}$$



We conclude: Three critical points:

$$(w, w^2, w^2/3), (w^2, w, w/3), (1, 1, 1/3)$$

(Potential for periodicity..)



$$\frac{3\sqrt{3}}{2\Gamma(\frac{1}{2})} \frac{6^n}{n^{3/2}}$$

## IV. NEXT STEPS

# DICHOTOMIES: EITHER ELEMENTARY OR COMPLICATED

- Undergrad: Complex analytic functions are **either** unbounded or constant
- Fatou: If  $F(z)$  is a series with positive integer coefficients, and it converges in the unit disc, the function is **either** rational, or has a natural boundary. ( $\Rightarrow$  not D-finite)
- There are numerous conditions that imply that function is **either rational, or hypertranscendental.**
  - Satisfying both a difference equation AND a differential equation
  - Satisfying multiple p-Mahler equations

What is the combinatorial explanation? How can we systematically exploit these results?

# MOVING FORWARD

- What is the META THEOREM for D-finite functions in combinatorics.
- How can the geometric understanding inform our understanding of transcendency?
- How can we translate the geometric conditions of [Hardouin & Singer] to combinatorial conditions on the model?
- **Open Question:** What are the questions we should be considering?

# CURRENT / FUTURE PROJECTS

- Asymptotic enumeration problems from root systems  
(Cedric Lecouvey & Students)
- Classification theorems for walks on Cayley graphs  
(Jason Bell, Haggai Liu)
- Crack the nut of what it means to be differentiably algebraic  
(Lucia Di Vizio, Charlotte Hardouin, Alin Bostan, Kilian Raschel,...)

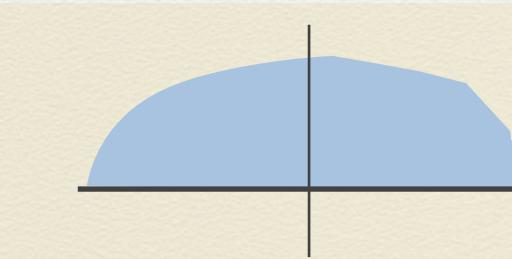
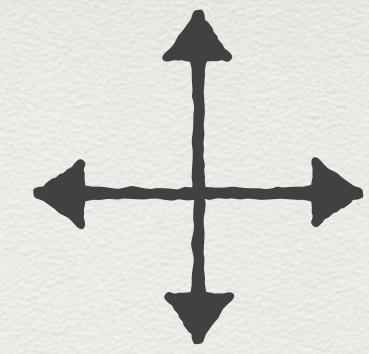
THANK YOU!

# REFERENCES

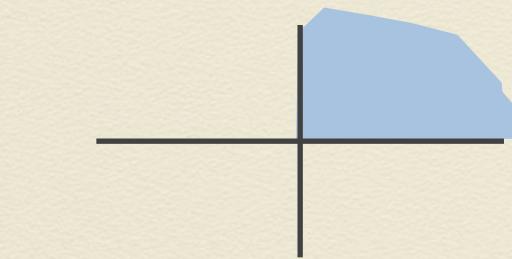
- Bell and Mishna (2020). On the complexity of the cogrowth sequence, *Journal of Combinatorial Algebra*.
- Gessel and Zeilberger (1992). Random walk in a Weyl chamber. *Proceedings of the American Mathematical Society*, 115(1), 27-31.
- Bousquet-Mélou and Mishna (2010). "Walks with small steps in the quarter plane." *Contemp. Math* 520: 1-40.
- Mishna and Simon (2019). The asymptotics of reflectable weighted random walks in arbitrary dimension - *Proceedings of EUROCOMB 2019*
- Melczer and Wilson (2019). "Higher dimensional lattice walks: Connecting combinatorial and analytic behavior." *SIAM Journal on Discrete Mathematics* 33.4 2140-2174.
- Alin Bostan's HDR: Calcul Formel pour la Combinatoire des Marches <https://specfun.inria.fr/bostan/HDR.pdf>
- Dreyfus, Hardouin, Roques, and Singer (2018). On the nature of the generating series of walks in the quarter plane. *Inventiones mathematicae*, 213(1), 139-203.
- Adamczeski, Dreyfus, Hardouin (2019). Hypertranscendence and linear difference equations. *arXiv preprint arXiv:1910.01874*.
- Elder and Rechnitzer (2014). The cogrowth series for  $BS(N, N)$  is D-finite *International J. Algebra and Computation* 24.02 171-187.

BONUS!

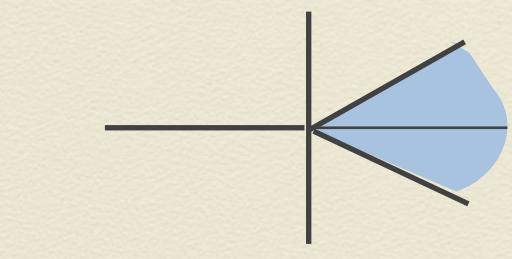
# SIMPLE STEPS IN VARIOUS CONES



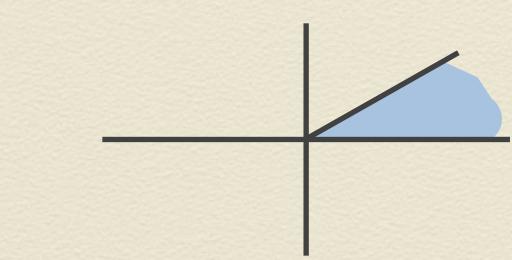
Half plane  
Algebraic



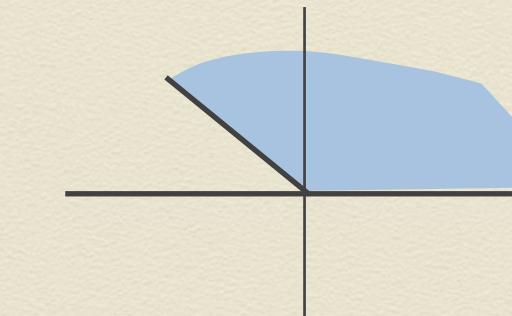
D-finite



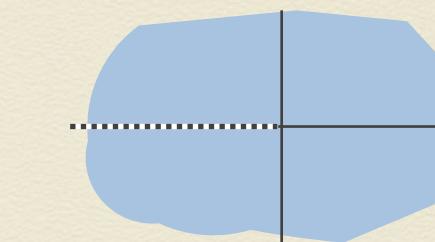
D-finite



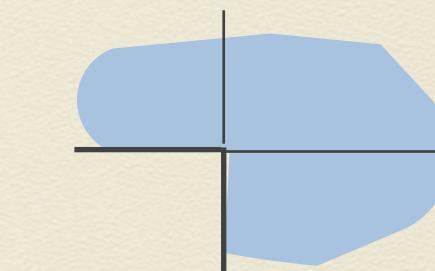
D-finite  
(Gouyou-Beauchamps)



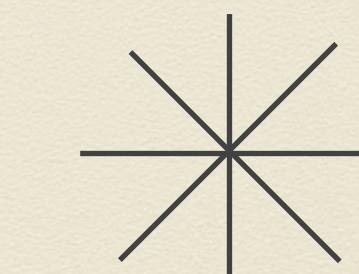
Nasty algebraic  
(Bostan & Kauers...)



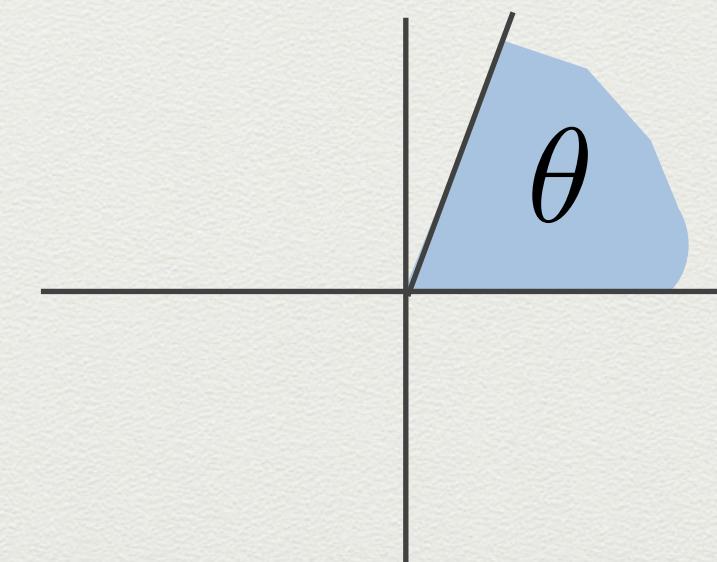
Slit plane model  
Algebraic  
(Bousquet-Mélou/Schaeffer)



3/4 plane model  
D-finite (Bousquet-Mélou... )



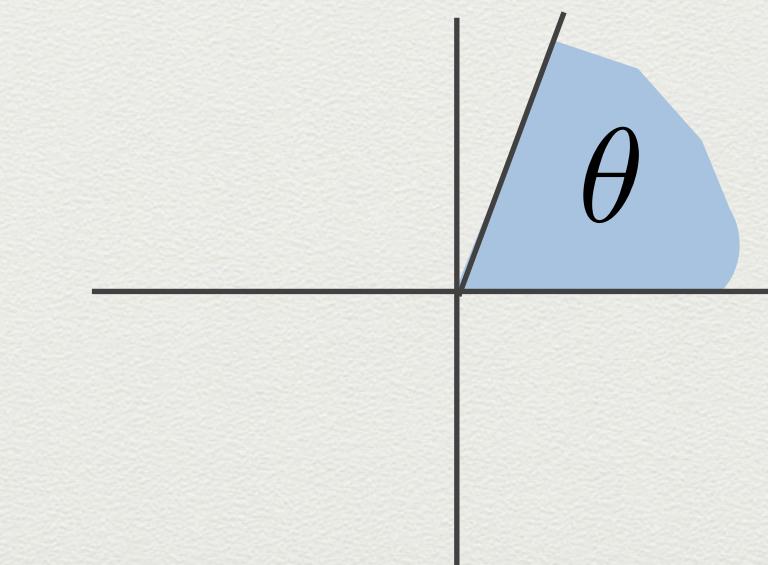
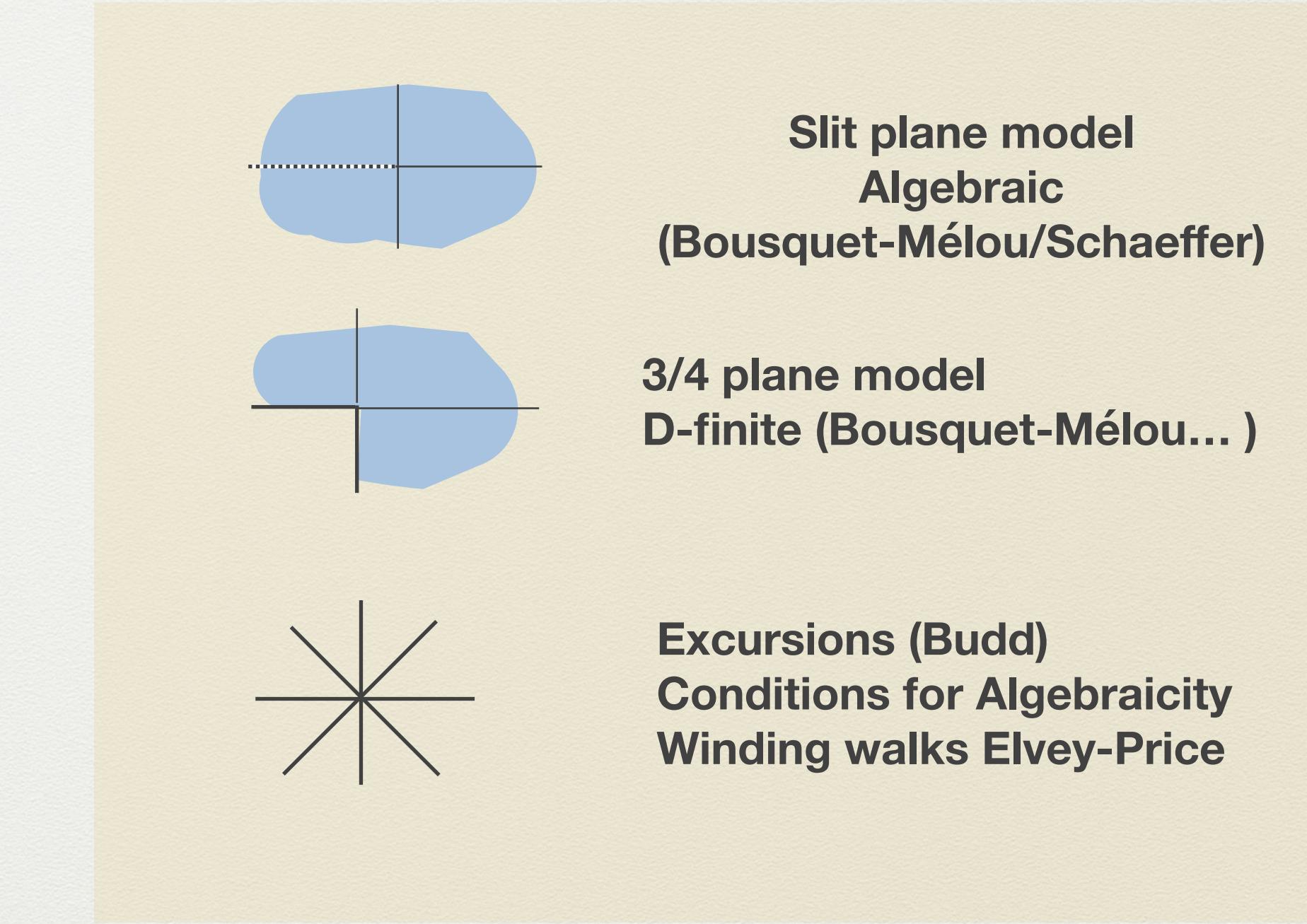
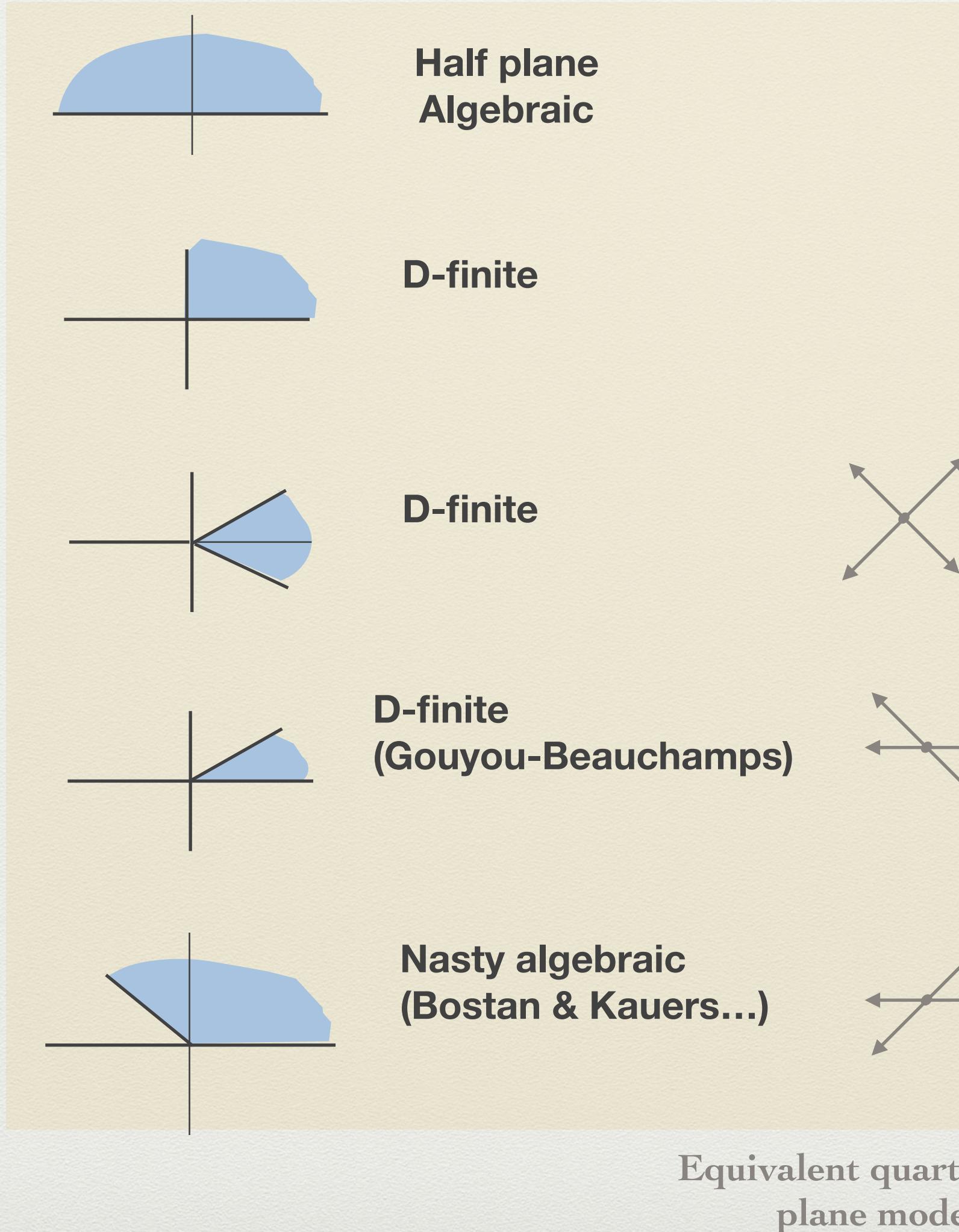
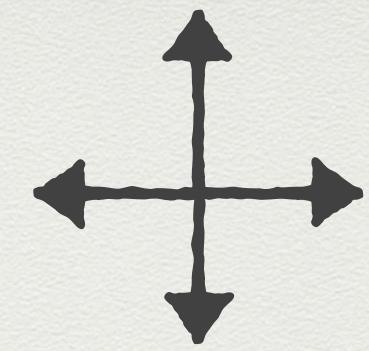
Excursions (Budd)  
Conditions for Algebraicity  
Winding walks Elvey-Price



Under some conditions,  $Q(x,y,z)$  is  
provably not D-finite  
(Denisov & Wachtel 2016)

$$e(n) \sim \alpha \rho^{-n} n^{f(\theta)}$$

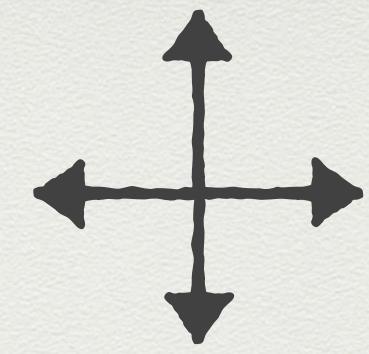
# SIMPLE STEPS IN VARIOUS CONES



Under some conditions,  $Q(x,y,z)$  is provably not D-finite  
(Denisov & Wachtel 2016)

$$e(n) \sim \alpha \rho^{-n} n^{f(\theta)}$$

# SIMPLE STEPS IN VARIOUS CONES



USEFUL, BUT  
DOES NOT  
CAPTURE ALL  
MODELS.

