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# **A Generalized Neighborhood for Cellular Automata**

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**<http://member.acm.org/~daze>**

# Basic references

- Zaitsev D.A. A generalized neighborhood for cellular automata, Theoretical Computer Science, 666 (2017), 21-35.
- Zaitsev D.A. hm, hn, hmn - Generators of canvas for Petri net models of hypertorus (hypercube) grid with Moore's, von-Neumann's, and generalized neighborhoods, respectively, 2015, <https://github.com/dazeorgacm/hmn>
- Zaitsev D.A. htgen - Generator of hypertorus Petri net models, 2015, <https://github.com/dazeorgacm/htgen>
- Zaitsev D.A. ts - Torus Simulator: simulator of traffic within multidimensional torus interconnect, 2020, <https://github.com/dazeorgacm/ts>
- Zaitsev, D.A., Tymchenko, S.I., Shtefan, N.Z. Switching vs Routing within Multidimensional Torus Interconnect, PIC&ST2020, October 6-9, 2020, Kharkiv, Ukraine, <http://picst.org>

# Neighborhood in hypercube (hypertorus) for microelectronics and telecommunications

- Connection of nodes in square (multidimensional) lattice
- Network-on-chip, 2D, 3D
- Interconnect for supercomputers and clusters, 3D, 5D, 6D

# Torus interconnect

- Three-dimensional torus network: IBM Blue Gene/L and Blue Gene/P, and the Cray XT3
- Five-dimensional torus network: IBM Blue Gene/Q
- Six-dimensional torus network: Fujitsu K computer, PRIMEHPC FX10 – three-dimensional torus 3D mesh interconnect Tofu
- Fugaku, ~0.5 exaflops – TOFU interconnect D

# Fugaku (Fujitsu, RIKEN)



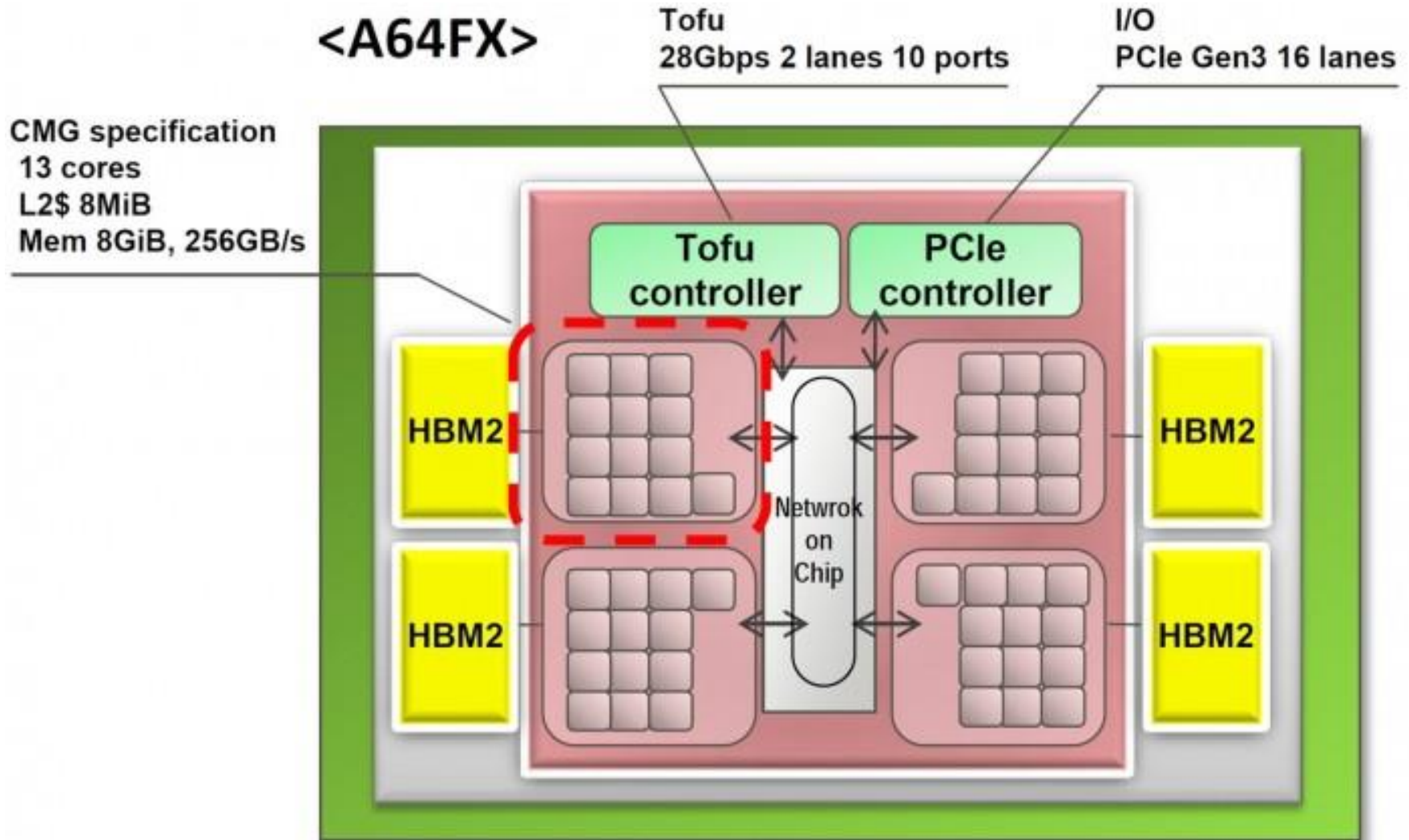
# A64FX



A64FX® Microarchitecture Manual

<http://github.com/fujitsu/A64FX>

# A64FX block diagram



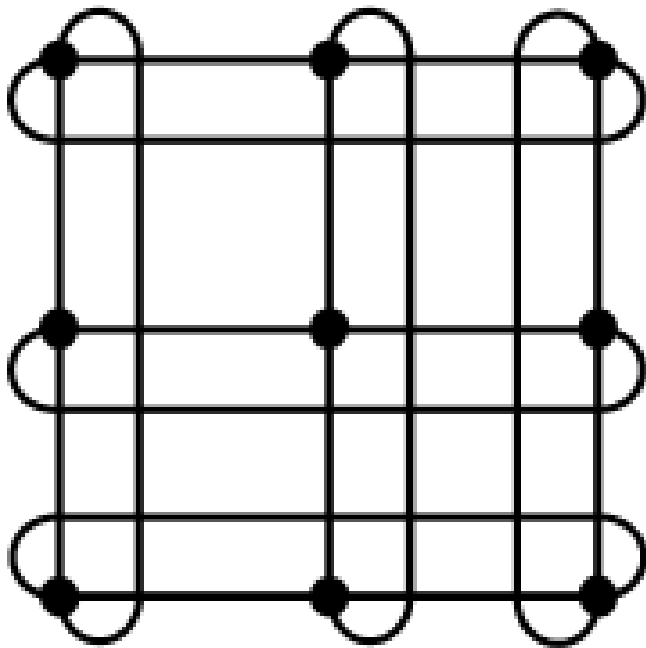


# Neighborhood of torus interconnect

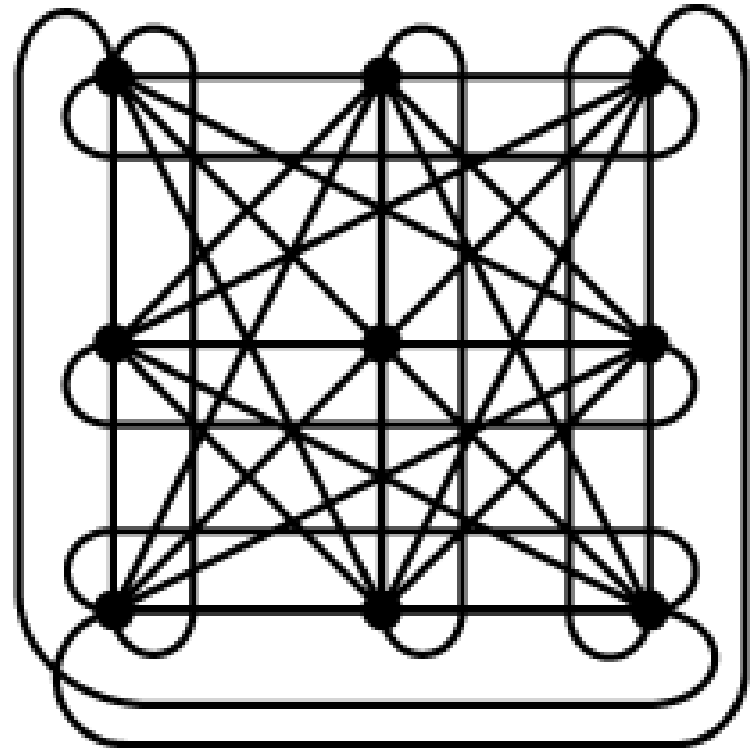
- Von Neumann neighborhood
- Mixed mesh and von Neumann interconnect
- Moore neighborhood is too dense in multidimensional space
- Generalized neighborhood is flexible, density is adjusted using a parameter
- Cross-By-Pass-Torus can be implemented as a generalized neighborhood with radius  $> 1$



# Neighborhoods in 2D torus



Von Neumann

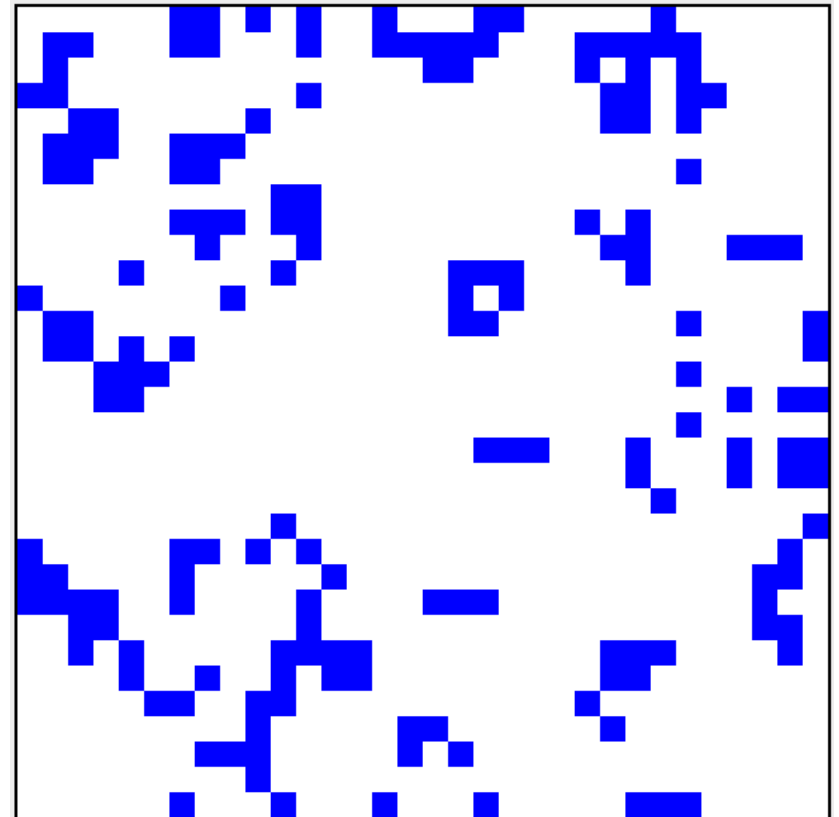
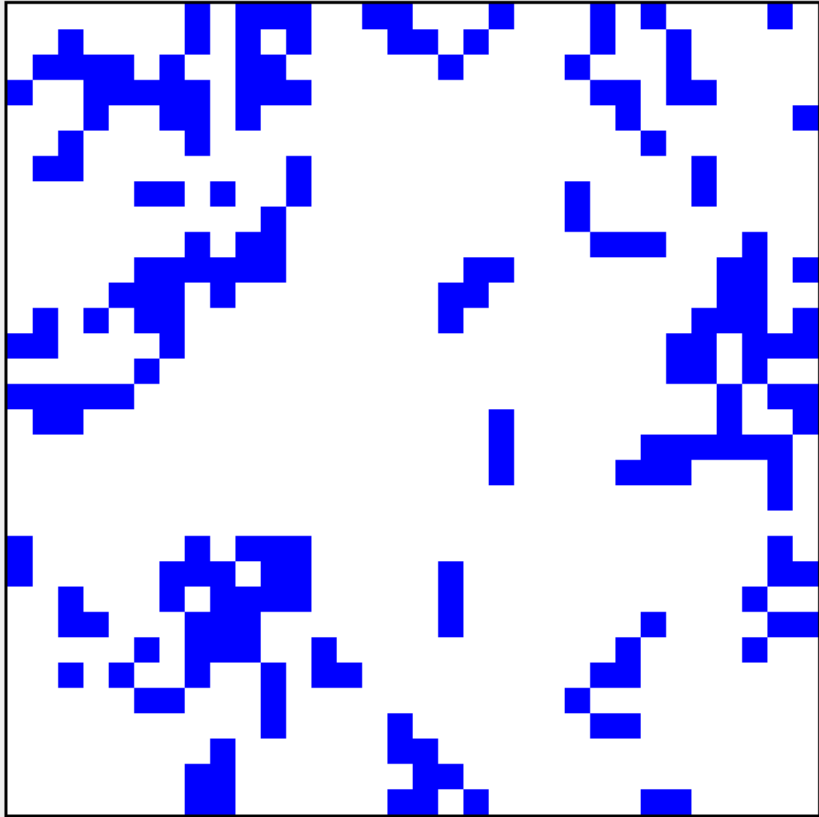


Moore

# Cellular Automata

- Lattice of cells in d-dimensional space
- Cell state in the next tact depends on the states of its neighbors in the current tact
- 1D, elementary ( $\{0,1\}$ ), rule 110 – Turing-complete
- 2D – Game of Life
- 3D – Simulation of Flows of Water
- Synchronous, Asynchronous, Totalistic, Stochastic etc

# 2D CA simulation example



FiatLux simulator, Nazim Fatès

<http://fiatlux.loria.fr>

# Applications of Cellular Automata

- Network Routing
- Cracks in metal constructions
- Spreading of viruses
- Spreading of insects (mosquito)
- Modelling climate change
- Cloud dynamics simulation
- Artificial brain dynamics

# Conventional neighborhoods for cellular automata

- Von Neumann – Manhattan distance of 1
- Moore – Chebyshev distance of 1
- Using radius  $r$
- Diamond shaped

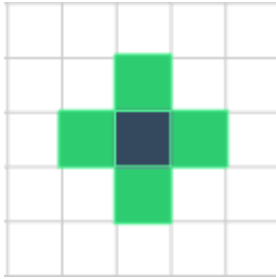
*Chebyshev distance* – maximal distance on coordinates:  $L^\infty(\vec{i}', \vec{i}) = \max_j (|\vec{i}' - \vec{i}|_j)$

*Manhattan distance* – sum of distances on coordinates (taxicab):  $L^1(\vec{i}', \vec{i}) = \sum_j (|\vec{i}' - \vec{i}|_j)$

# Generalized k-neighborhood in d-dimensional lattice

- **Sharp k-neighborhood** – exactly k coordinates change, their differences belong to  $\{-1,1\}$  (Chebyshev distance of 1 restricted by Manhattan distance of k)
- **k-neighborhood** – no more than k coordinates change, their differences belong to  $\{-1,1\}$
- Parameter k:  $1 \leq k \leq d$
- 1-neighborhood = von Neumann
- d-neighborhood = Moore

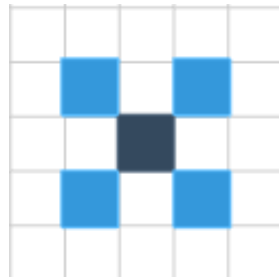
# 2D case



1-neighborhood,  
sharp 1-neighborhood,  
von Neumann neighborhood  
4 neighbors



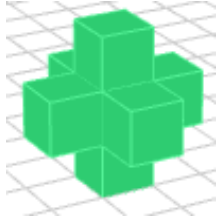
2-neighborhood,  
Moore neighborhood  
8 neighbors



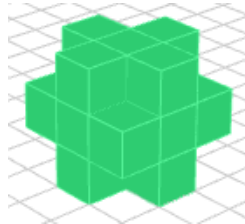
sharp 2-neighborhood  
4 neighbors



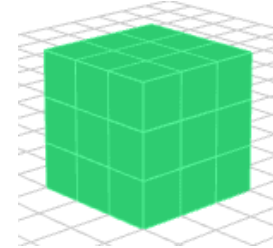
# 3D case



1-neighborhood,  
sharp 1-neighborhood,  
von Neumann neighborhood  
6 neighbors



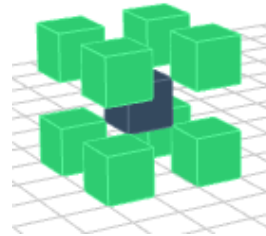
2-neighborhood  
18 neighbors



3-neighborhood,  
Moore neighborhood  
26 neighbors



sharp 2-neighborhood,  
12 neighbors



sharp 3-neighborhood  
8 neighbors

# 4D case

1-neighborhood von Neumann	2-neighborhood	3-neighborhood	4-neighborhood Moore
sharp 1	sharp 1 + sharp 2	sharp 1 + sharp 2 + sharp 3 = 2-neighborhood + sharp 3	sharp 1 + sharp 2 + sharp 3 + sharp 4 = 3-neighborhood + sharp 4
Sharp neighborhoods			
Sharp 1	Sharp 2	Sharp 3	Sharp 4
$(-1, 0, 0, 0), (1, 0, 0, 0),$ $(0, -1, 0, 0), (0, 1, 0, 0),$ $(0, 0, -1, 0), (0, 0, 1, 0),$ $(0, 0, 0, -1), (0, 0, 0, 1)$ <u>8 neighbors</u>	$(-1, -1, 0, 0), (-1, 1, 0, 0),$ $(1, -1, 0, 0), (1, 1, 0, 0),$ $(-1, 0, -1, 0), (-1, 0, 1, 0),$ $(1, 0, -1, 0), (1, 0, 1, 0),$ $(-1, 0, 0, -1), (-1, 0, 0, 1),$ $(1, 0, 0, -1), (1, 0, 0, 1),$ $(0, -1, -1, 0), (0, -1, 1, 0),$ $(0, 1, -1, 0), (0, 1, 1, 0),$ $(0, -1, 0, -1), (0, -1, 0, 1),$ $(0, 1, 0, -1), (0, 1, 0, 1),$ $(0, 0, -1, -1), (0, 0, -1, 1),$ $(0, 0, 1, -1), (0, 0, 1, 1)$ <u>24 neighbors</u>	$(-1, -1, -1, 0), (-1, -1, 1, 0),$ $(-1, 1, -1, 0), (-1, 1, 1, 0),$ $(1, -1, -1, 0), (1, -1, 1, 0),$ $(1, 1, -1, 0), (1, 1, 1, 0),$ $(-1, -1, 0, -1), (-1, -1, 0, 1),$ $(-1, 1, 0, -1), (-1, 1, 0, 1),$ $(1, -1, 0, -1), (1, -1, 0, 1),$ $(1, 1, 0, -1), (1, 1, 0, 1),$ $(-1, 0, -1, -1), (-1, 0, -1, 1),$ $(-1, 0, 1, -1), (-1, 0, 1, 1),$ $(1, 0, -1, -1), (1, 0, -1, 1),$ $(1, 0, 1, -1), (1, 0, 1, 1),$ $(0, -1, -1, -1), (0, -1, -1, 1),$ $(0, -1, 1, -1), (0, -1, 1, 1),$ $(0, 1, -1, -1), (0, 1, -1, 1),$ $(0, 1, 1, -1), (0, 1, 1, 1)$ <u>24 neighbors</u>	$(-1, -1, -1, -1),$ $(-1, -1, -1, 1),$ $(-1, -1, 1, -1),$ $(-1, -1, 1, 1),$ $(-1, 1, -1, -1),$ $(-1, 1, -1, 1),$ $(-1, 1, 1, -1),$ $(-1, 1, 1, 1),$ $(1, -1, -1, -1),$ $(1, -1, -1, 1),$ $(1, -1, 1, -1),$ $(1, -1, 1, 1),$ $(1, 1, -1, -1),$ $(1, 1, -1, 1),$ $(1, 1, 1, -1),$ $(1, 1, 1, 1)$ <u>16 neighbors</u>

## Tasks solved

The number of neighbors in  $k$ -neighborhood for  $d$ -dimensional lattice counted for:

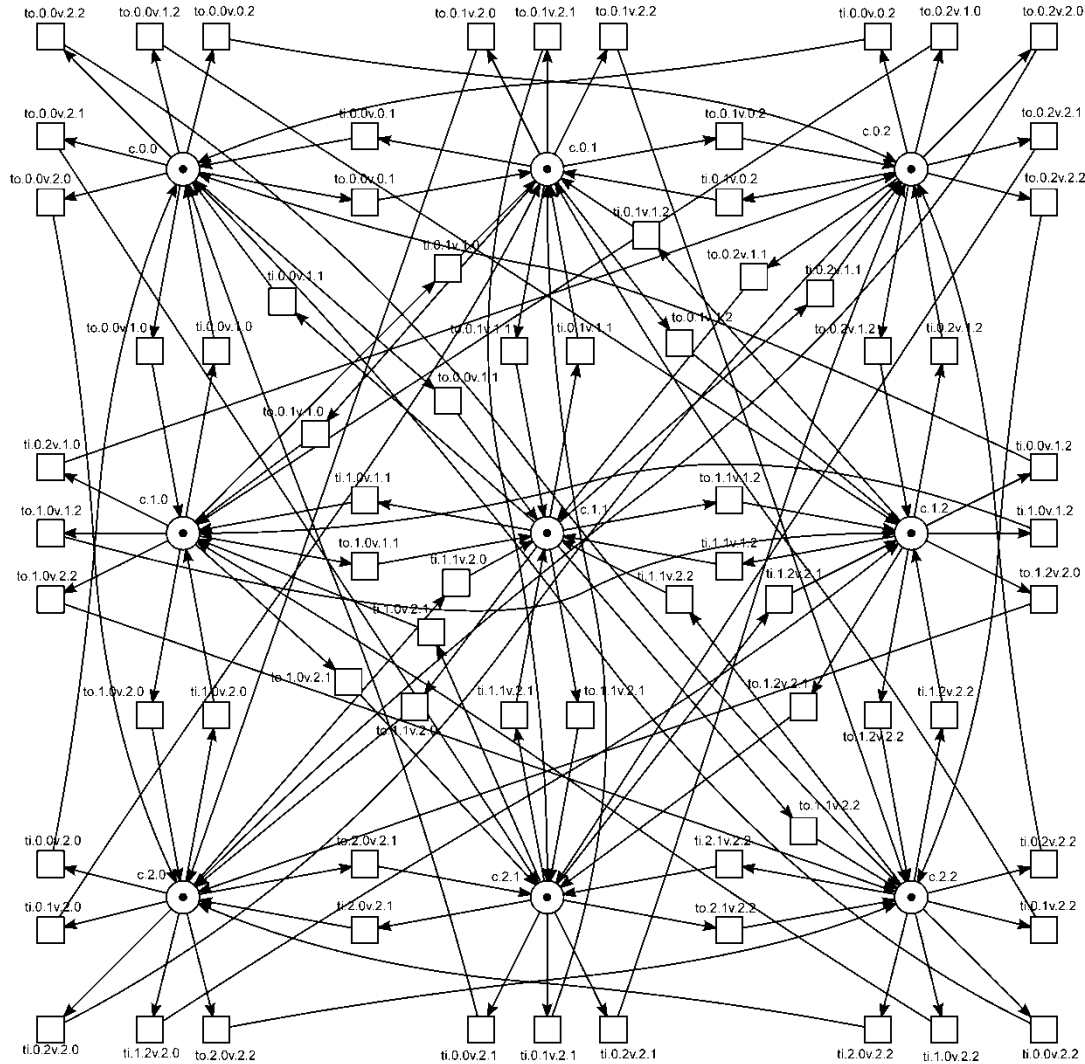
- Infinite lattice
- Finite hypercubes and hypertoruses
- $k$ -neighborhood of radius  $r$

# Connection with oeis.org

- The On-Line Encyclopedia of Integer Sequences
- OEIS A005843 – von Neumann
- OEIS A024023 – Moore
- OEIS A013609 – sharp k-neighborhood
- **New:** OEIS A265014 – k-neighborhood
- **New:** OEIS A266213 – sharp, radius  $r$ , diamond shaped
- OEIS A008288 – Delannoy numbers – partial sums of a new OEIS A266213

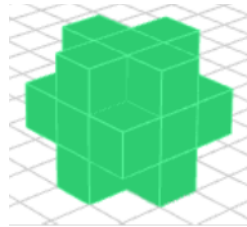
# Generator of canvas for finite grids

- <https://github.com/dazeorgacm/hmn>



# k-neighborhood in finite d-cubes

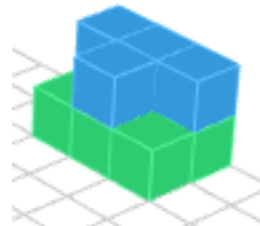
An example of  
2-neighborhood in a  
3-cube



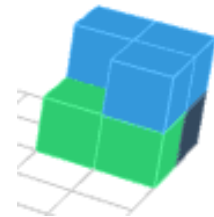
inside 3-cube  
18 neighbors



on 2-cube bound,  
(a square)  
13 neighbors



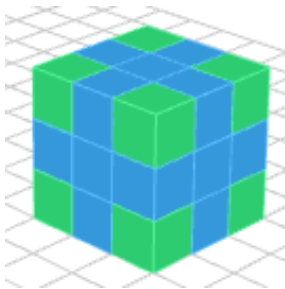
on 1-cube bound,  
(a segment)  
9 neighbors



on 0-cube bound,  
(a point)  
6 neighbors

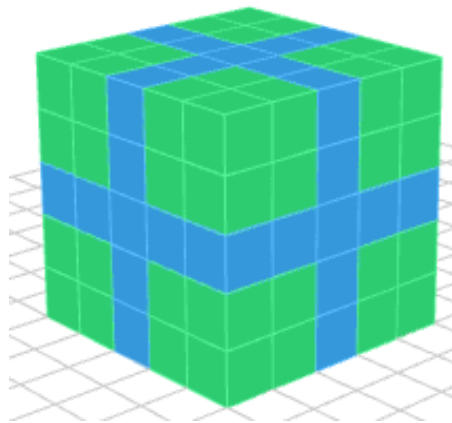
# Neighborhoods of radius $r$

Moore's – for  $k=d$ ,  
an example for  $d=3$



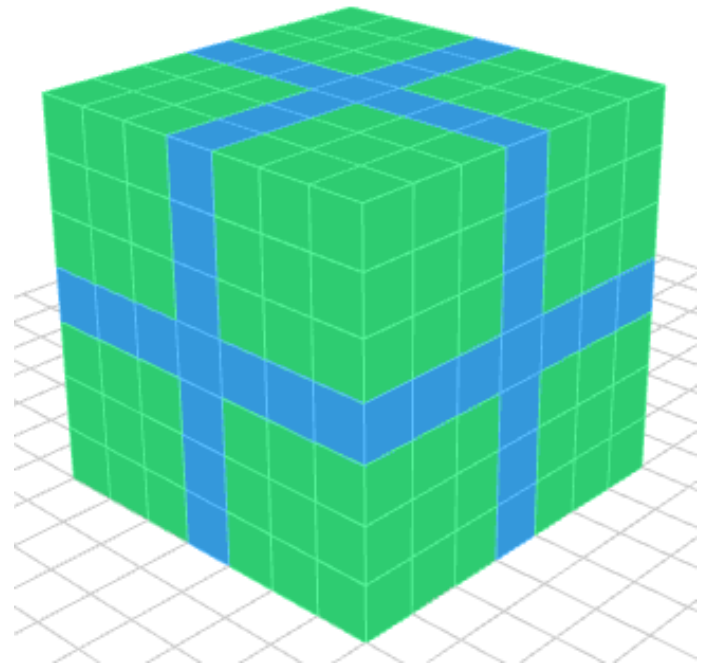
$r=1$

26 neighbors



$r=2$

124 neighbors



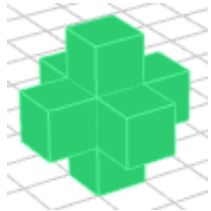
$r=3$

342 neighbors

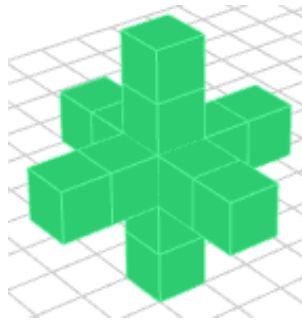


# Neighborhoods of radius $r$

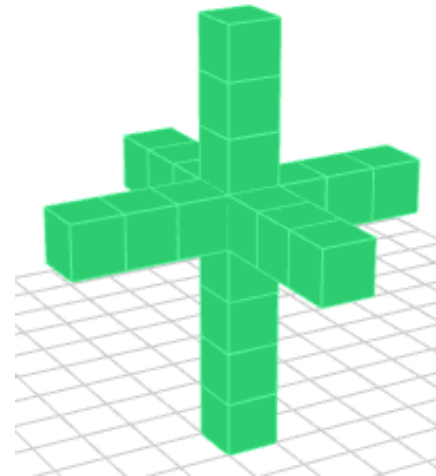
Narrow von Neumann's – for  $k=1$ ,  
an example for  $d=3$



$r=1$   
6 neighbors



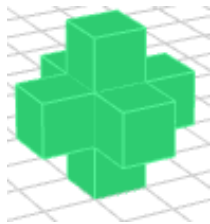
$r=2$   
12 neighbors



$r=3$   
18 neighbors

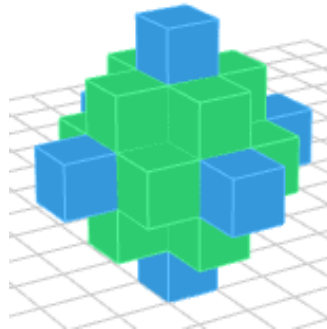
# Neighborhoods of radius $r$

Diamond-shaped von Neumann's – Manhattan distance  $r$ ,  
an example for  $d=3$



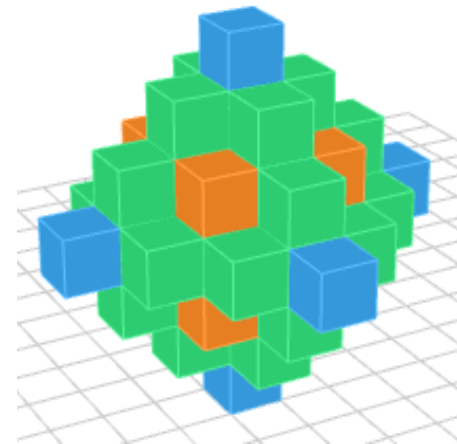
$r=1$

6 neighbors



$r=2$

24 neighbors



$r=3$

56 neighbors

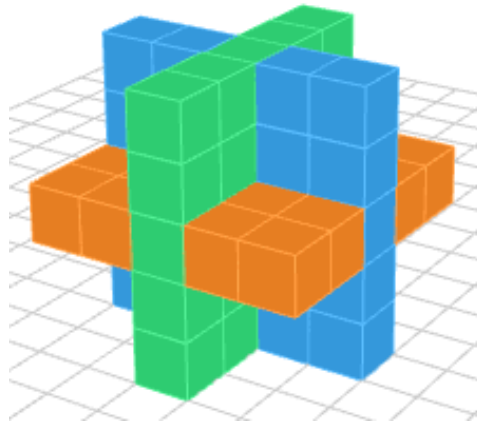
# k-neighborhoods of radius r

An example of 2-neighborhood in 3-dimensional lattice



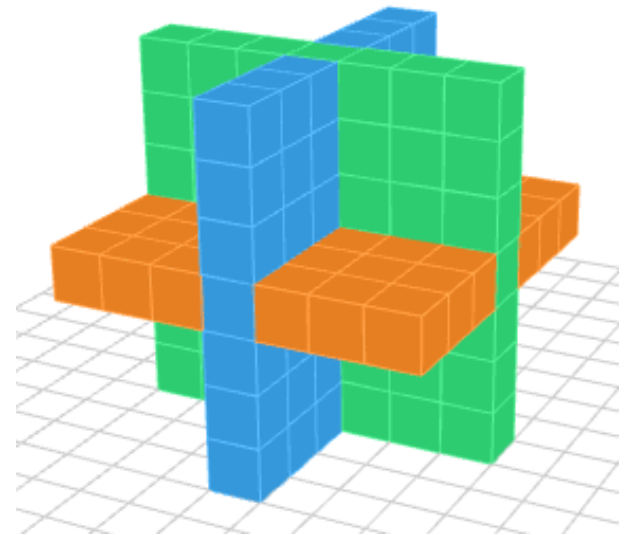
$r=1$

18 neighbors



$r=2$

60 neighbors



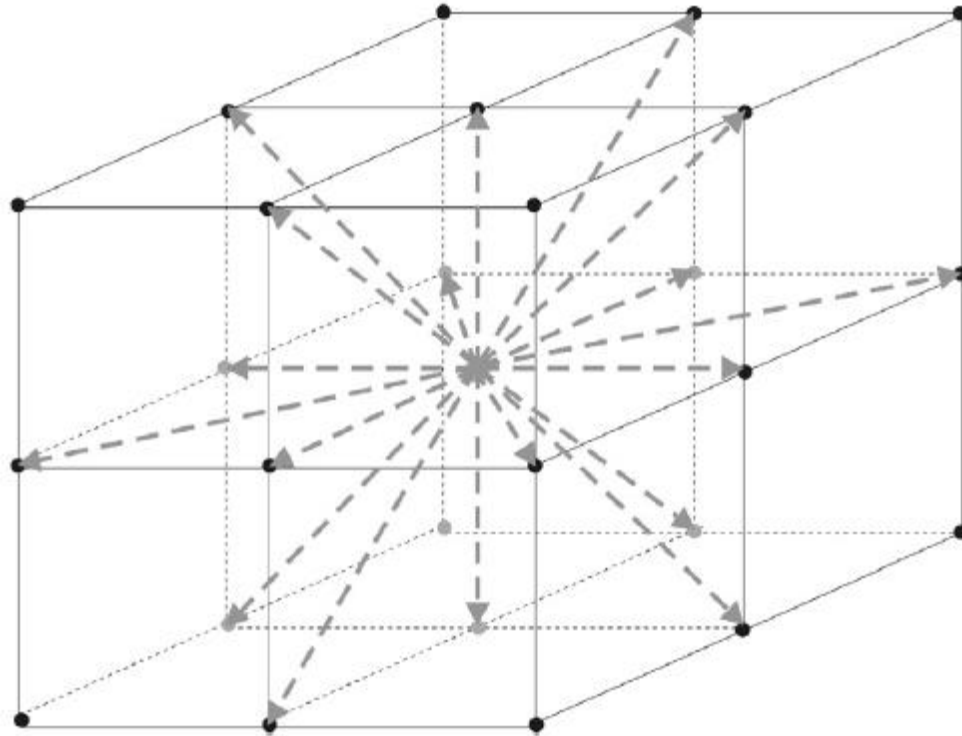
$r=3$

126 neighbors

# List of derived formulae

- $K(d,k)$  – number of neighbors in a  $k$ -neighborhood
- $M(d,k,m)$  – number of neighbors in a  $k$ -neighborhood for a cell situated at a  $(d - m)$ -cube bound
- $T(d,k,n)$  – the number of connections for a  $k$ -neighborhood in a  $d$ -dimensional lattice of size  $n$
- $R_{\text{diamond}}(d, r)$  – number of neighbors in a diamond-shaped neighborhood of radius  $r$
- $R(d, k, r)$  – number of neighbors in a  $k$ -neighborhood of radius  $r$

# 2-neighborhood in 3-dimensional case



$(0, 0, -1), (0, 0, 1), (0, -1, 0), (0, 1, 0), (-1, 0, 0), (1, 0, 0),$   
 $(0, -1, -1), (0, -1, 1), (0, 1, -1), (0, 1, 1), (-1, 0, -1), (-1, 0, 1),$   
 $(1, 0, -1), (1, 0, 1), (-1, -1, 0), (-1, 1, 0), (1, -1, 0), (1, 1, 0)$

# Number of neighbors in $k$ -neighborhood

$$\hat{K}(d, k) = |S(d, k)| = 2^k C_d^k \quad \text{Known OEIS A013609}$$

$$K(d, k) = |G(d, k)| = \sum_{j=1}^k \hat{K}(d, j) = \sum_{j=1}^k 2^j C_d^j$$

$$K(d, k) = K(d, k-1) + K(d-1, k) + K(d-1, k-1) - 2K(d-1, k-2),$$

$$K(d, k) = 2K(d-1, k-1) + K(d-1, k) + 2.$$

**A new OEIS sequence OEIS A265014**

# Number of Neighbors

The number of  $(d - k)$ -cube bounds in a  $d$ -hypercube – the number of neighbors in a sharp  $k$ -neighborhood.

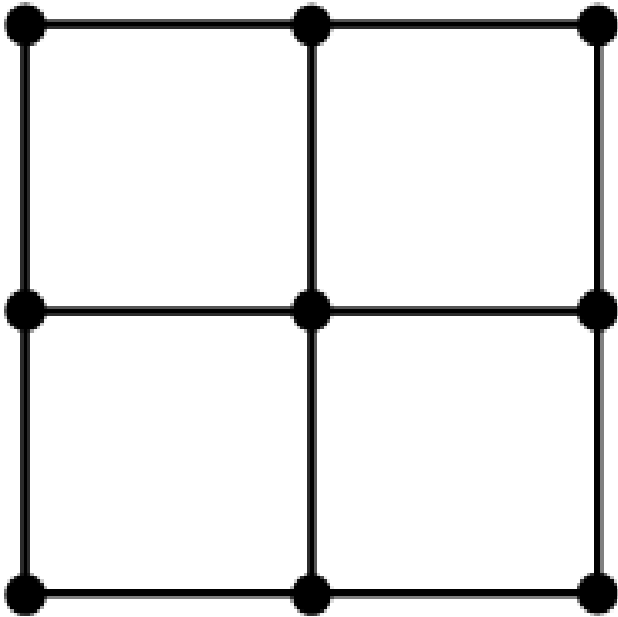
[illegible]

The number of neighbors in a generalized  $k$ -neighborhood, from von Neumann's ( $k = 1$ ) to Moore's ( $k = d$ ).

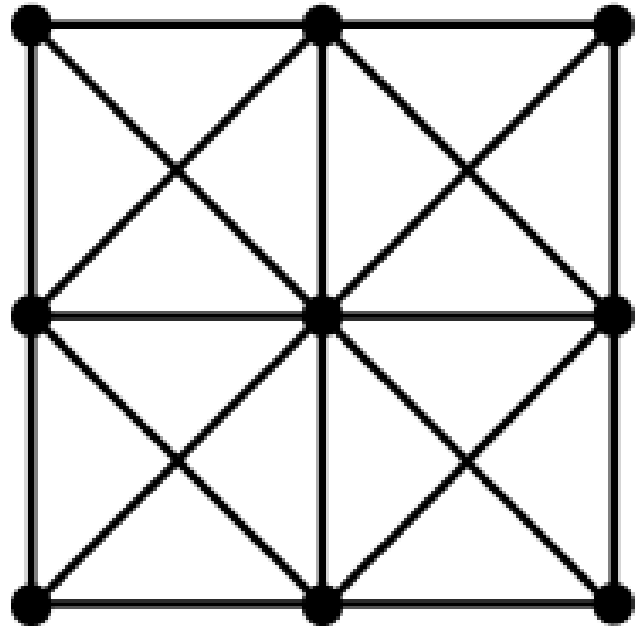
[illegible]



# Finite hypercube

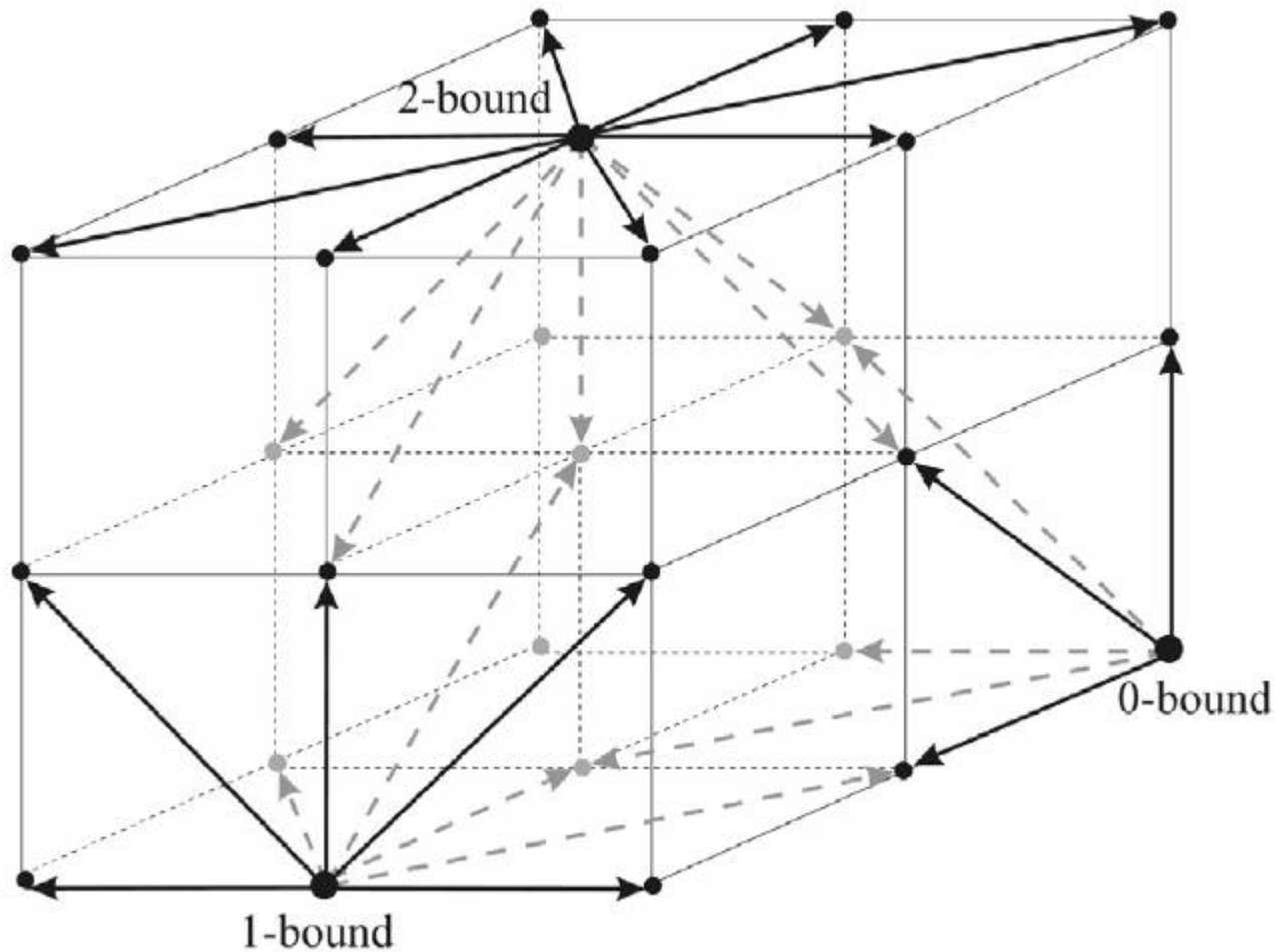


Von Neumann



Moore

# 2-neighborhood in 3-dimensional case



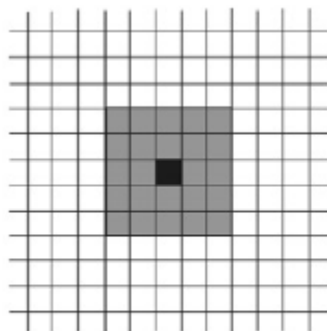
# Number of neighbors and connections

$$\hat{M}(d, k, m) = \sum_{\substack{k_1+k_2=k \\ k_1 \leq m \\ k_2 \leq d-m}} C_m^{k_1} C_{d-m}^{k_2} 2^{k_2}$$

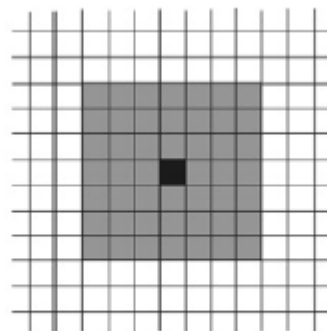
$$M(d, k, m) = \sum_{j=1}^k \hat{M}(d, j, m) = \sum_{j=1}^k \sum_{j_1=\max(0, m+j-d)}^{\min(j, m)} C_m^{j_1} C_{d-m}^{j-j_1} 2^{j-j_1}$$

$$T(d, k, n) = \frac{\sum_{m=0}^d C_d^m 2^m (n-2)^{d-m} M(d, k, m)}{2}$$

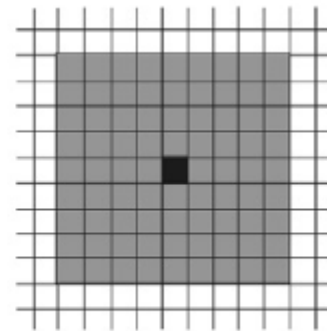
# Radius



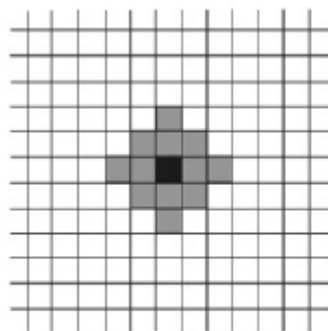
$r=2$



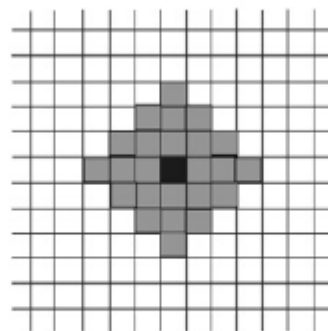
$r=3$



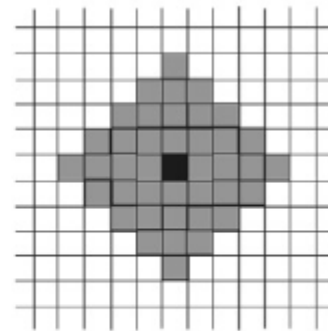
$r=4$



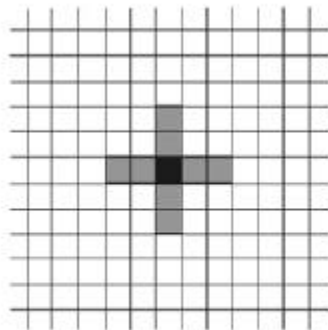
$r=2$



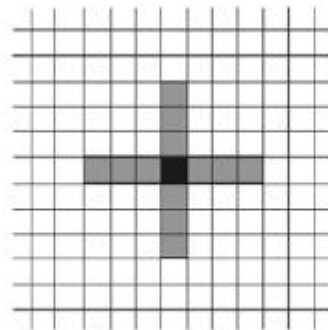
$r=3$



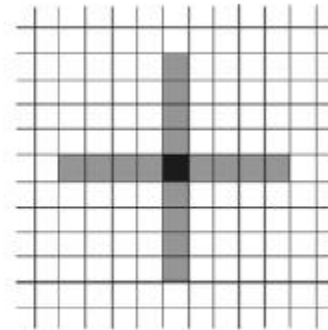
$r=4$



$r=2$



$r=3$



$r=4$

# Decomposition of Delannoy numbers

$$\hat{R}_{diamond}(d, r) = \sum_{k=1}^{\min(d,r)} C_{r-1}^{k-1} C_d^k 2^k$$

**A new OEIS sequence OEIS A266213**

$$R_{diamond}(d, r) = \sum_{k=1}^{\min(d,r)} C_r^k C_d^k 2^k$$

$$D(d, r) = R_{diamond}(d, r) + 1, \quad \text{Known OEIS A008288}$$

# Number of neighbors in a generalized k-neighborhood of radius r

$$R(d, k, r) = \sum_{j=1}^k C_d^j (2r)^j$$

$$R(3, 2, 2) = C_3^1 4^1 + C_3^2 4^2 = 3 \cdot 4 + 3 \cdot 16 = 60$$

$(-2, -2, 0), (-2, 2, 0), (2, -2, 0), (2, 2, 0), (-2, 0, -2), (-2, 0, 2),$   
 $(2, 0, -2), (2, 0, 2), (0, -2, -2), (0, -2, 2), (0, 2, -2), (0, 2, 2),$   
 $(-2, -1, 0), (-2, 1, 0), (2, -1, 0), (2, 1, 0), (-2, 0, -1), (-2, 0, 1),$   
 $(2, 0, -1), (2, 0, 1), (0, -2, -1), (0, -2, 1), (0, 2, -1), (0, 2, 1),$   
 $(-1, -2, 0), (-1, 2, 0), (1, -2, 0), (1, 2, 0), (-1, 0, -2), (-1, 0, 2),$   
 $(1, 0, -2), (1, 0, 2), (0, -1, -2), (0, -1, 2), (0, 1, -2), (0, 1, 2).$

# Conclusions

- k-neighborhood introduced in d-dimensional lattice
- its extreme cases give von Neumann's (sparsest) and Moore's (densest) neighborhoods
- number of neighbors counted for infinite lattice and finite hypercubes and hypertoruses
- number of neighbors counted for k-neighborhoods of radius  $r$
- two new sequences A265014 and A266213 accepted by OEIS; partials sums of A266213 produce Delannoy numbers



# Future research directions

- Modify and adjust  $t_s$
- Register new OEIS sequences
- Routing via CA
- Combine hypertorus, hypercube with meshes
- Use 2 parameters:  $(k, k')$ -neighborhood
- Use reverse definition of  $k'$ -neighborhood decreasing from Moore neighborhood
- Specify sequences using hypergeometric

