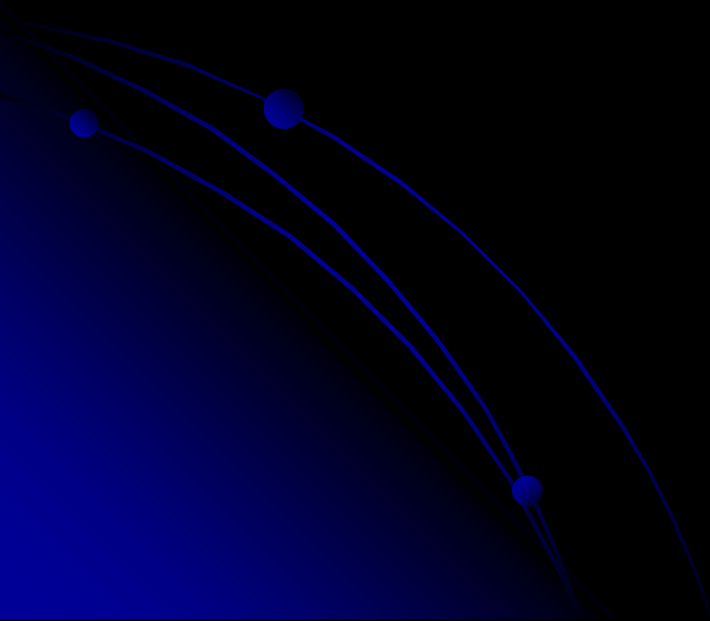


Morfológia



Matematická morfológia

η μορφή = forma, tvar

ο λόγος (τα λόγια) = slovo (slová)

Morfológia = štúdium formy a štruktúry (zvieratá, rastliny)

- Matematická morfológia = nástroj na popis komponentov obrazu, tvaru, štruktúry

Základ – teória množín

Použitie

predspracovanie

filtrovanie šumu, zjednodušenie tvarov, ...

segmentácia

watershed, hrany, obrys, ...

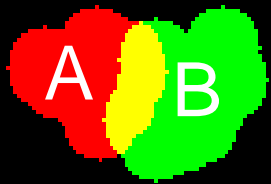
popis štruktúry objektov

kostra, konvexný obal, ...

- kvantitatívny popis

analýza tvaru (area, perimeter, ...),

granulometria, súvislé oblasti ...

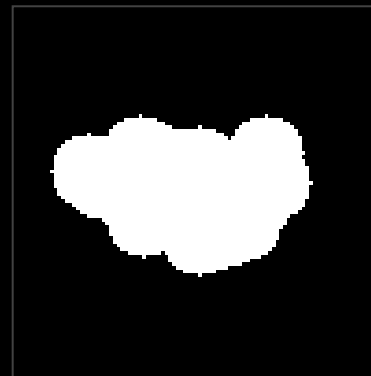


Základné definície

- Prvok množiny $x \in A$
- Prvok nepatriaci množine $x \notin A$
- Prázdna množina – neobsahuje žiadny prvok \emptyset
- Disjunktné množiny, ak $A \cap B = \emptyset$
- Podmnožina $A \subseteq B \Leftrightarrow (x \in A \Rightarrow x \in B)$

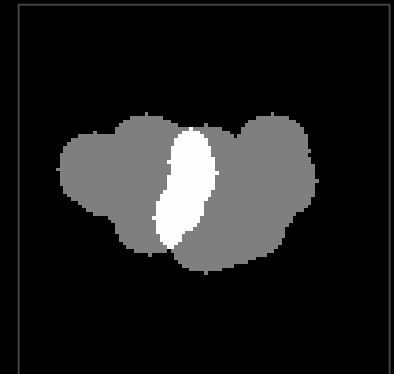
Zjednotenie

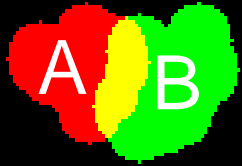
$$A \cup B = \{x \mid x \in A \vee x \in B\}$$



Prienik

$$A \cap B = \{x \mid x \in A \wedge x \in B\}$$

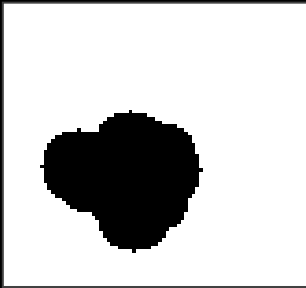




Množinové operácie

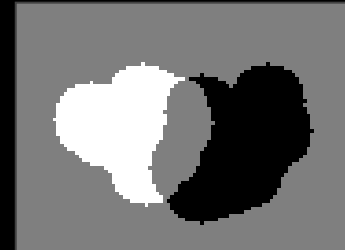
Komplement

$$A^c = \{x \mid x \notin A\}$$



Rozdiel

$$A - B = A \cap B^c = \{x \mid x \in A \wedge x \notin B\}$$



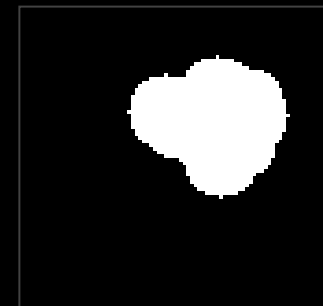
Zrkadlenie

$$\hat{A} = \{x \mid x = -a, \forall a \in A\}$$



Posunutie

$$A_z = A + z = \{x \mid x = a + z, \forall a \in A\}$$



Morfologické operácie

Vzťah:

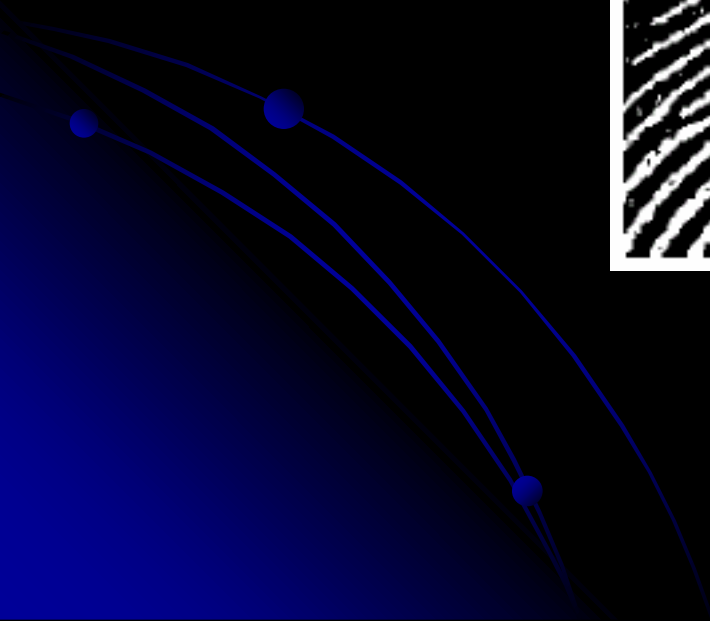
obraz (množina) – štrukturálny prvok

Výsledok:

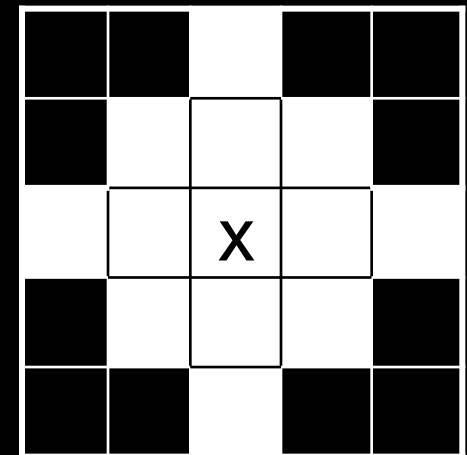
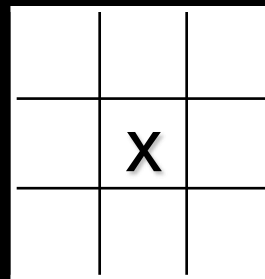
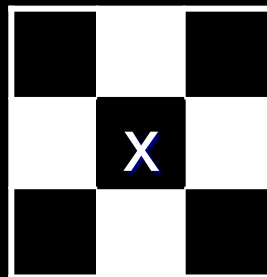
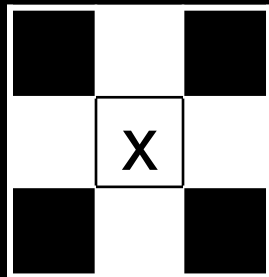
zmena, zmenšenie, zväčšenie množiny



Binárna morfológia



Štruktúrálny prvok



x – počiatok súr. sústavy (0,0)
referenčný bod

Štruktúrálňy prvok

tvar

veľkosť

orientácia

pozícia vzhľadom k x

Závisia od aplikácie, ovplyvňujú výsledok

ŠP je (zvyčajne) **oveľa menší** ako obraz

Dilatácia



Minkowského súčet \oplus

$$A \oplus B = \bigcup_{b \in B} A_b$$

$$A \oplus B = \bigcup_{b \in B} \{a + b \mid a \in A\}$$

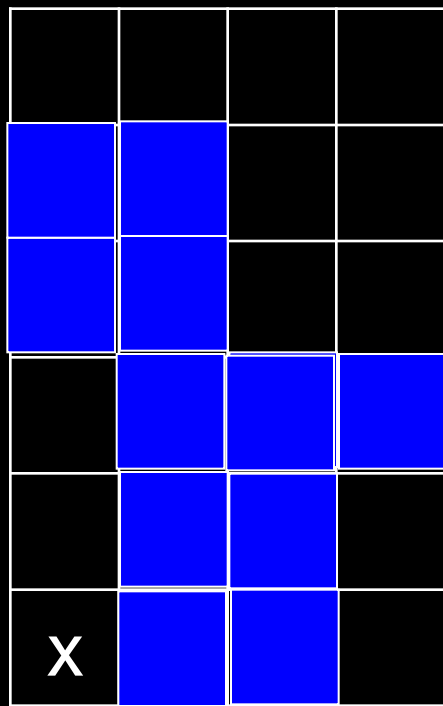
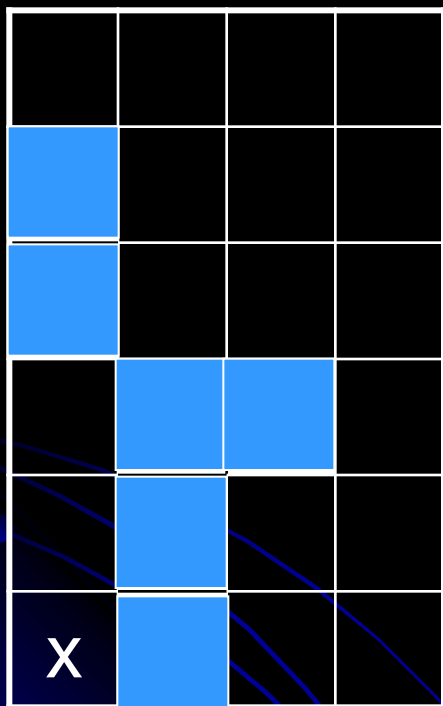
$$= \{a + b \mid a \in A, b \in B\}$$

$$A \oplus B = \{x \mid \hat{B}_x \cap A \neq \emptyset\}$$

Expanzívna operácia – zväčšuje množinu

$$A \oplus B = \bigcup_{b \in B} A_b$$

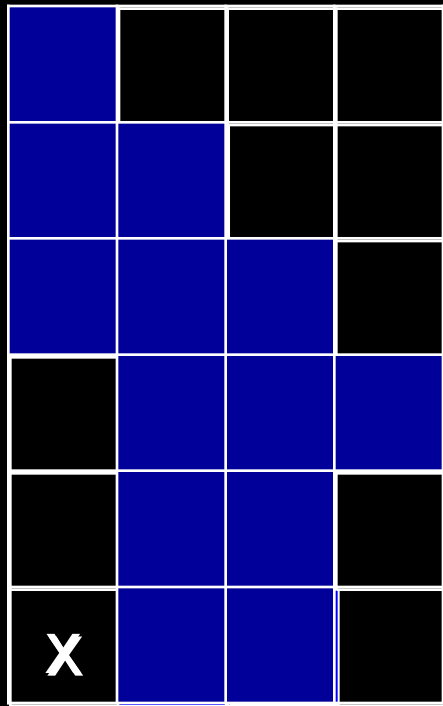
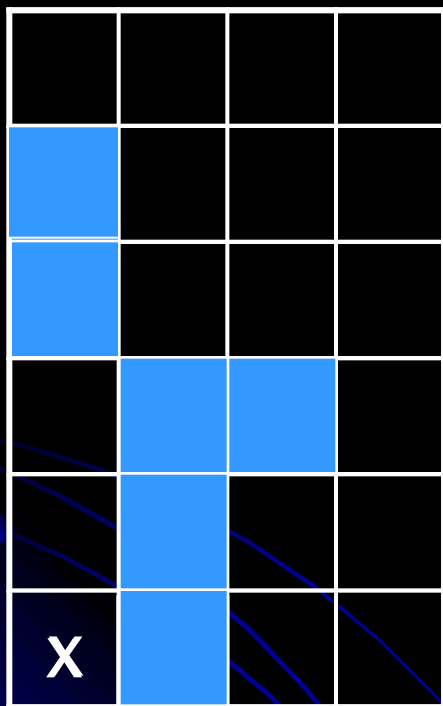
Dilatácia



$$B = \begin{array}{|c|c|} \hline x & \\ \hline b_1 & b_2 \\ \hline \end{array}$$

$$A \oplus B = \bigcup_{b \in B} A_b$$

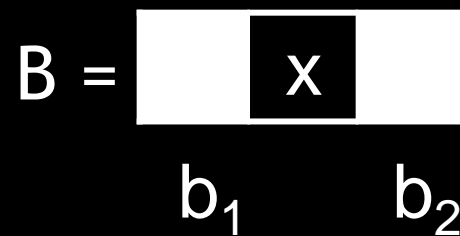
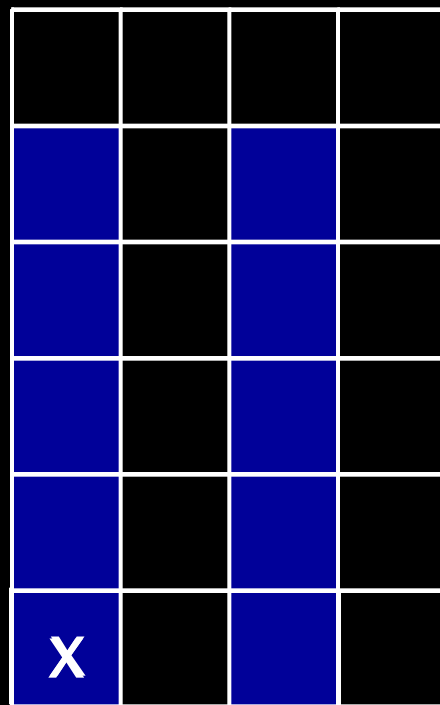
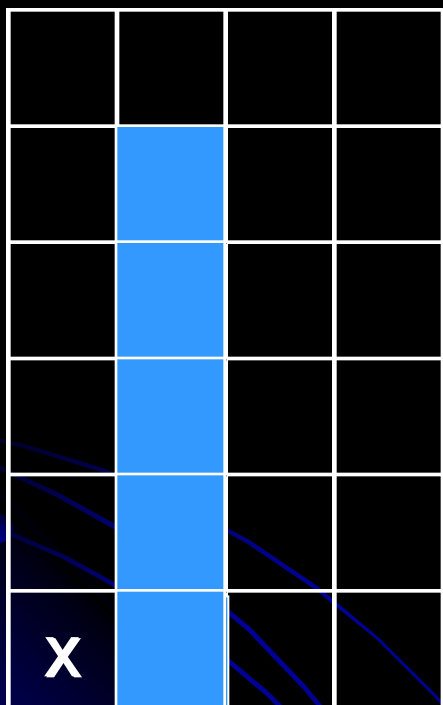
Dilatácia



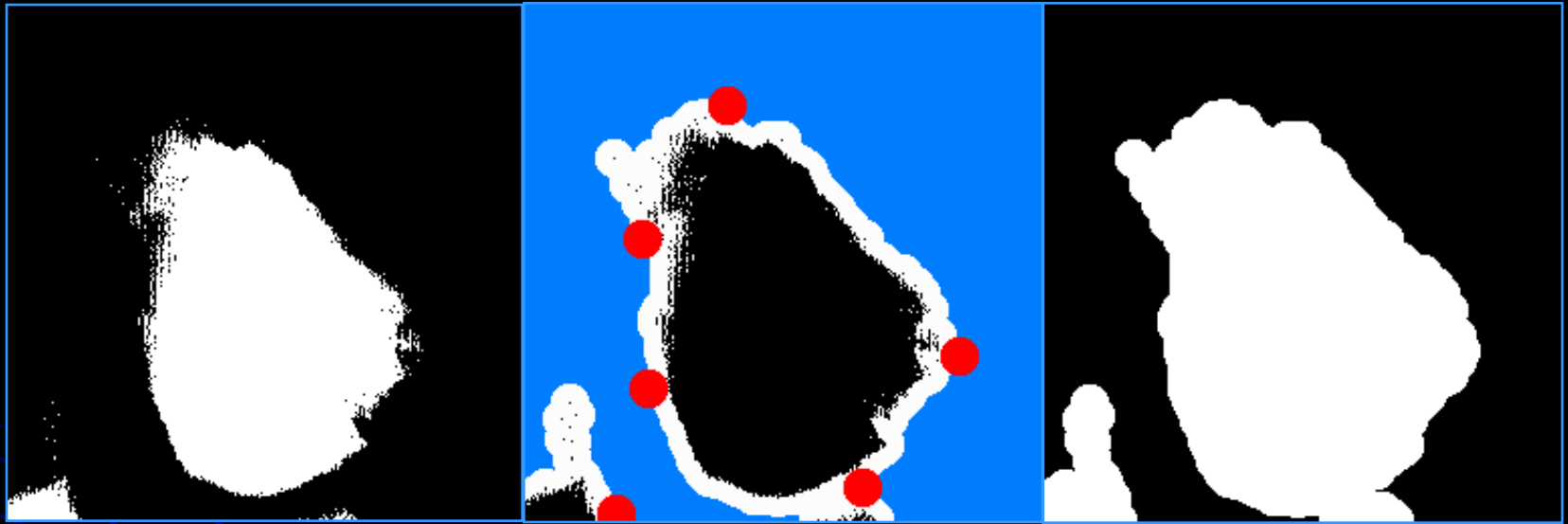
$$B = \begin{array}{c} b_3 \\ \square \\ \square \quad \square \\ b_1 \quad b_2 \end{array}$$

$$A \oplus B = \bigcup_{b \in B} A_b$$

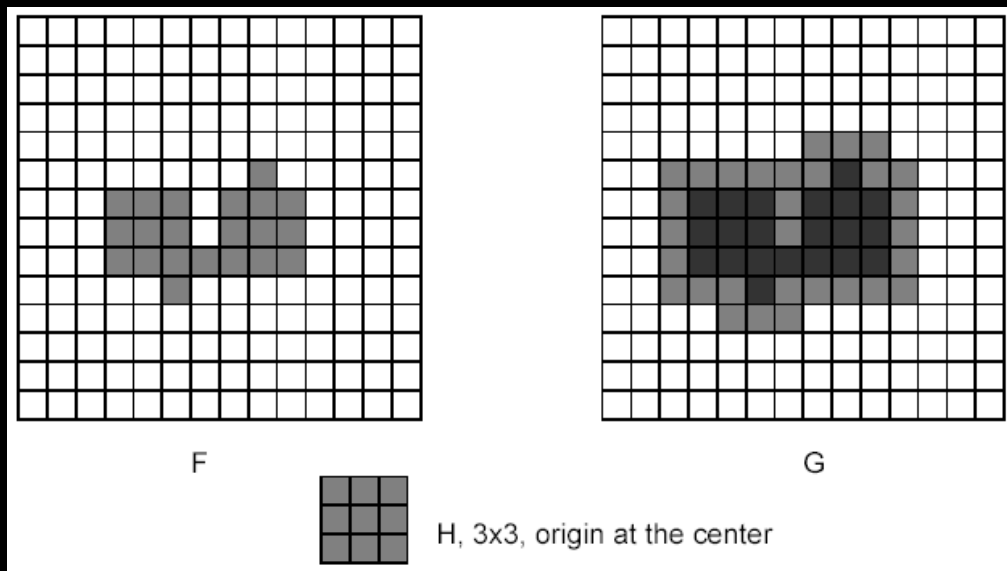
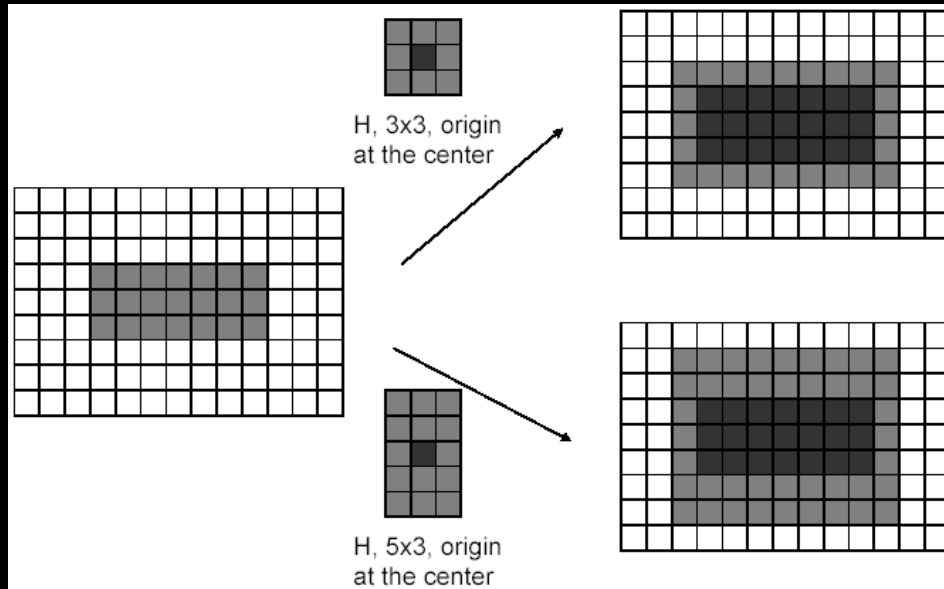
Dilatácia



Dilatácia



Dilatácia



Vlastnosti dilatácie

$$A \oplus B = B \oplus A$$

$$A \oplus (B \oplus C) = (A \oplus B) \oplus C$$

$$A_1 \subseteq A_2 \Rightarrow A_1 \oplus B \subseteq A_2 \oplus B$$

$$A \oplus (B \cup C) = (A \oplus B) \cup (A \oplus C)$$

Erózia

Minkowského rozdiel \ominus

$$A \ominus B = \bigcap_{b \in B} A_{-b}$$

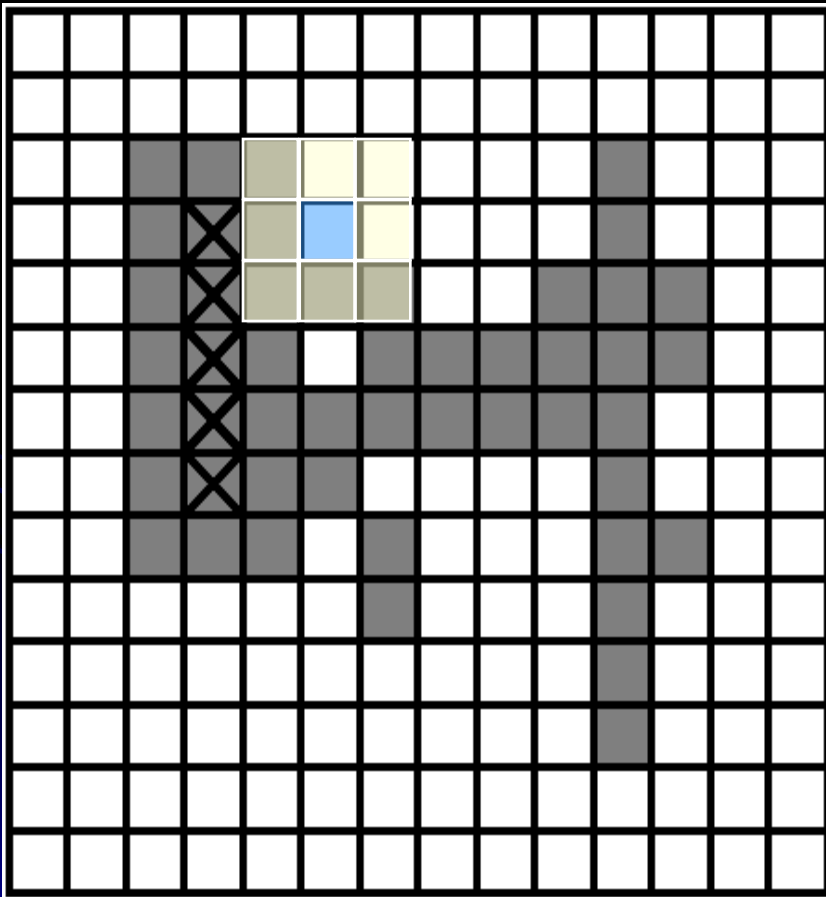
$$A \ominus B = \bigcap_{b \in B} a - b \mid a \in A$$

$$A \ominus B = \{ x \mid B_x \subseteq A \}$$

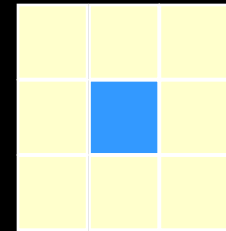
Kontraktívna operácia – znižuje množinu

$$A \ominus B = \{x \mid B_x \subseteq A\}$$

Erózia

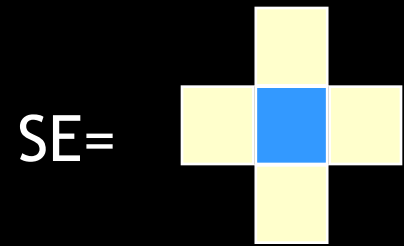
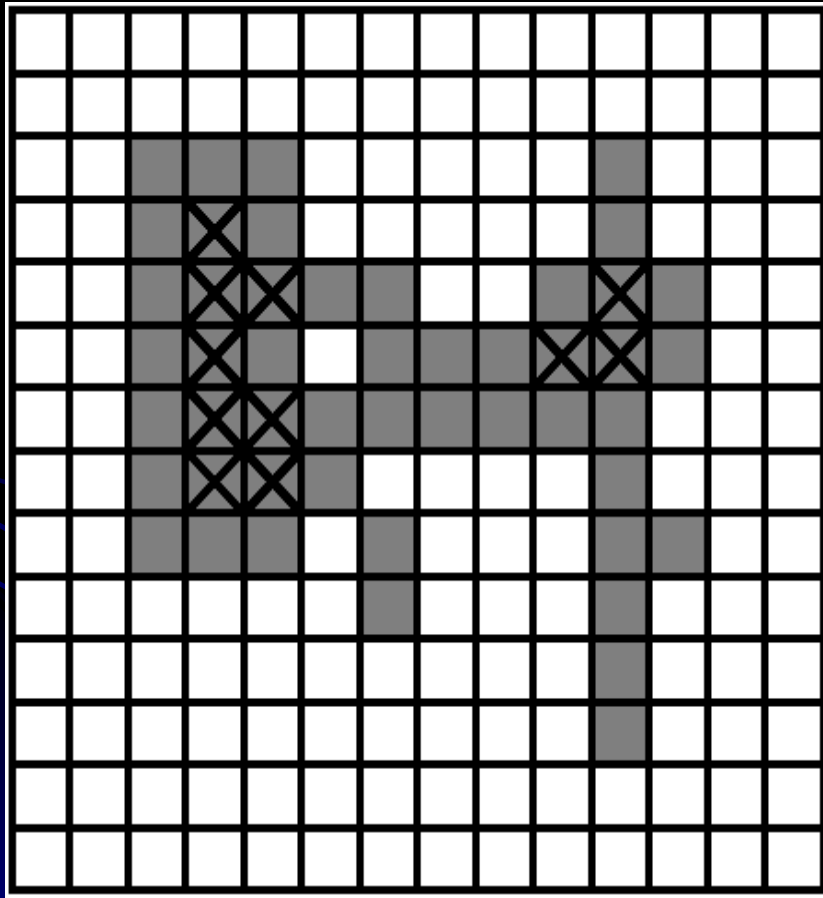


SE=

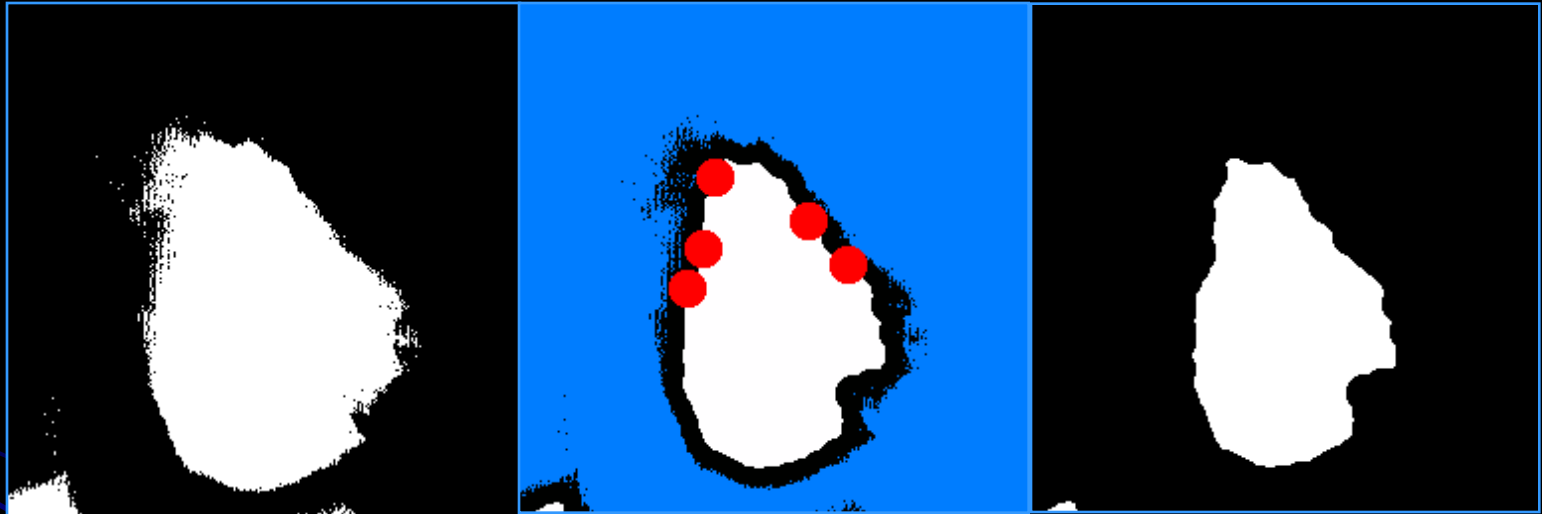


$$A \ominus B = \{x \mid B_x \subseteq A\}$$

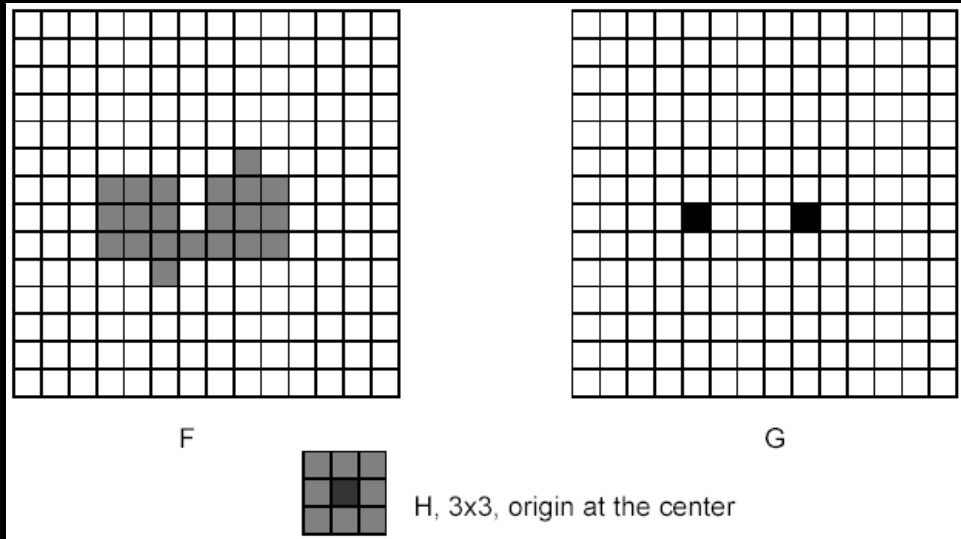
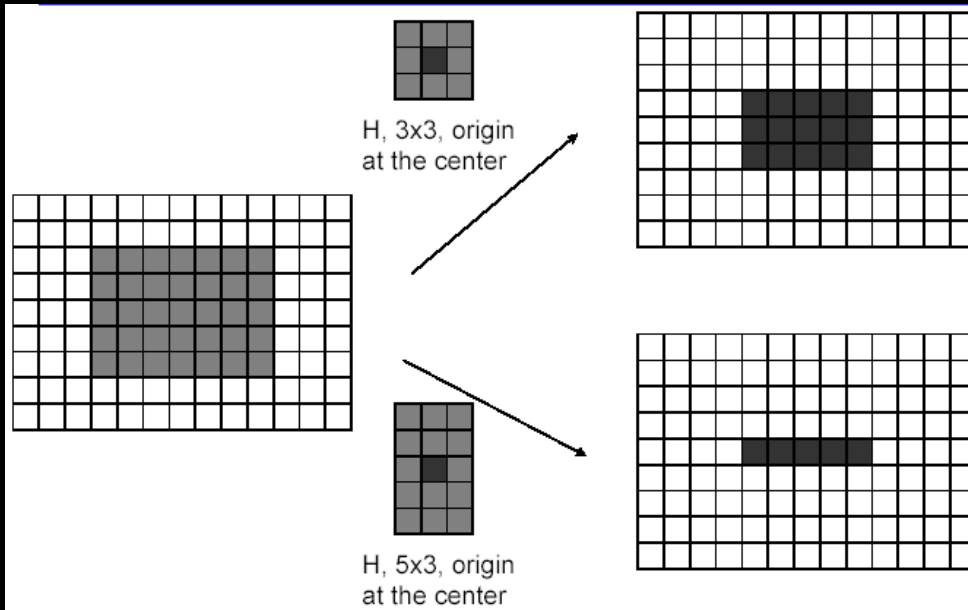
Erózia



Erózia



Erózia



Vlastnosti erózie

$$A \ominus B \neq B \ominus A$$

$$A_1 \subseteq A_2 \Rightarrow (A_1 \ominus B) \subseteq (A_2 \ominus B)$$

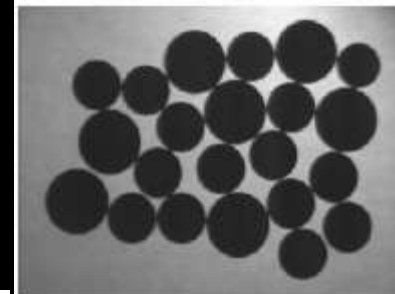
$$B_1 \subseteq B_2 \Rightarrow (A \ominus B_1) \supseteq (A \ominus B_2)$$

$$A \ominus (B \cup C) = (A \ominus B) \cap (A \ominus C)$$

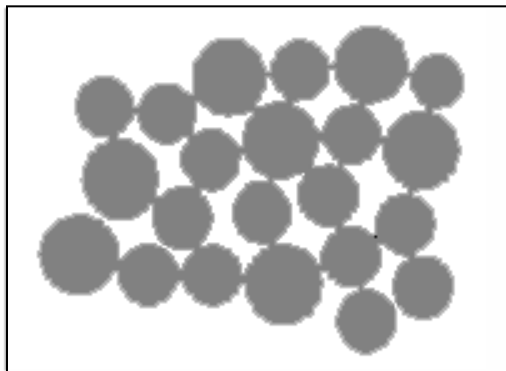
$$(A \ominus B) \ominus C = A \ominus (B \oplus C)$$

$$(A \ominus B) \oplus B \subseteq A \subseteq (A \oplus B) \ominus B$$

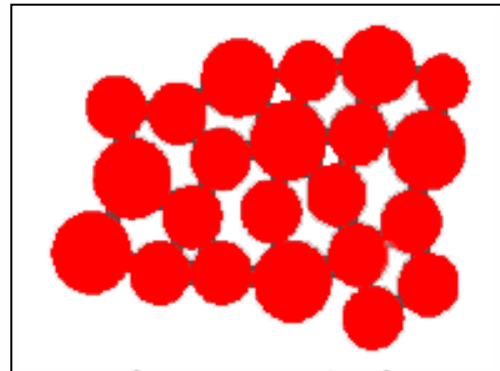
Príklad použitia



Original



Prahovanie



1 spojitý útvar

Erózia



THE
TEST
IMAGE

Originál



THE
TEST
IMAGE

Erodovaný 1x



THE
TEST
IMAGE

Erodovaný 2x

Dualita

$$A \ominus E^{\tau} = A^c \oplus \hat{E}$$

Opakovanie

dilatácia

Zväčšuje množinu

Vypĺňa diery, zálivy určitej veľkosti a tvaru

erózia

Zmenšuje množinu

Odstraňuje štruktúry určitej veľkosti a tvaru

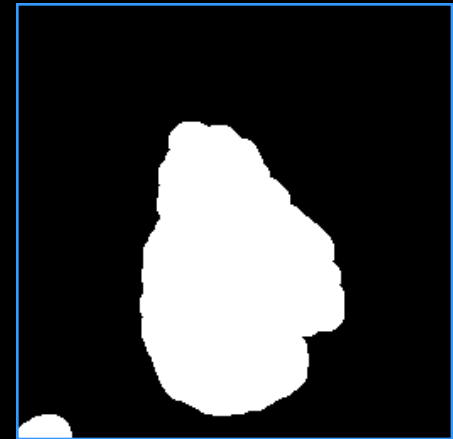
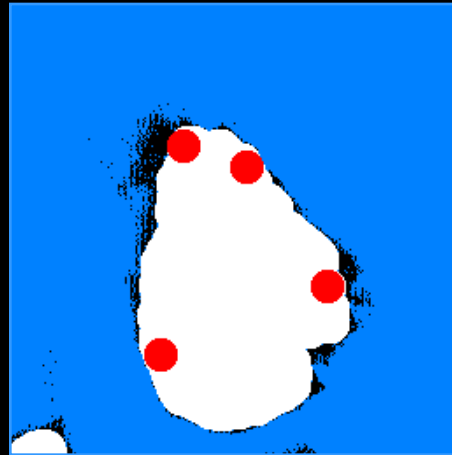
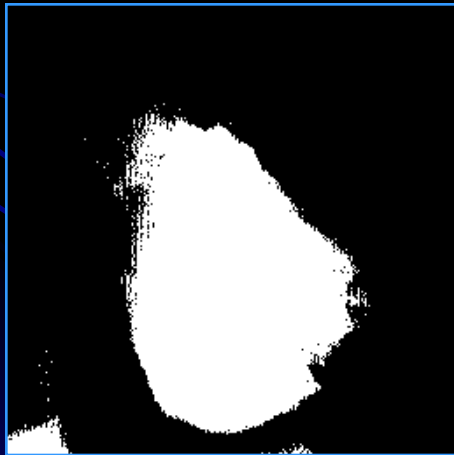
Môže rozdeliť množinu

– v závislosti na štruktúrálom prvku

Interaktívne na <http://dip.sccg.sk/>

Otvorenie

$$A \circ B = \overline{A \ominus B} \oplus B$$



Vlastnosti otvorenia

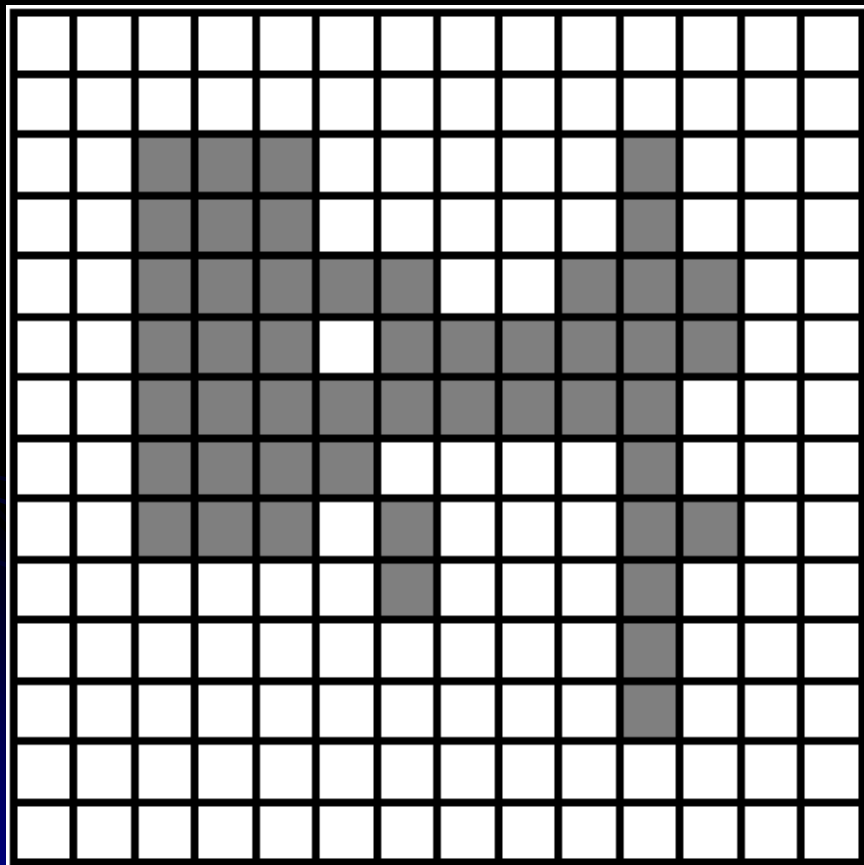
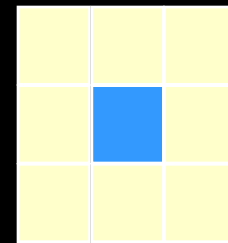
$$A \circ B \subseteq A$$

$$A \circ \overline{B \circ B} = A \circ B$$

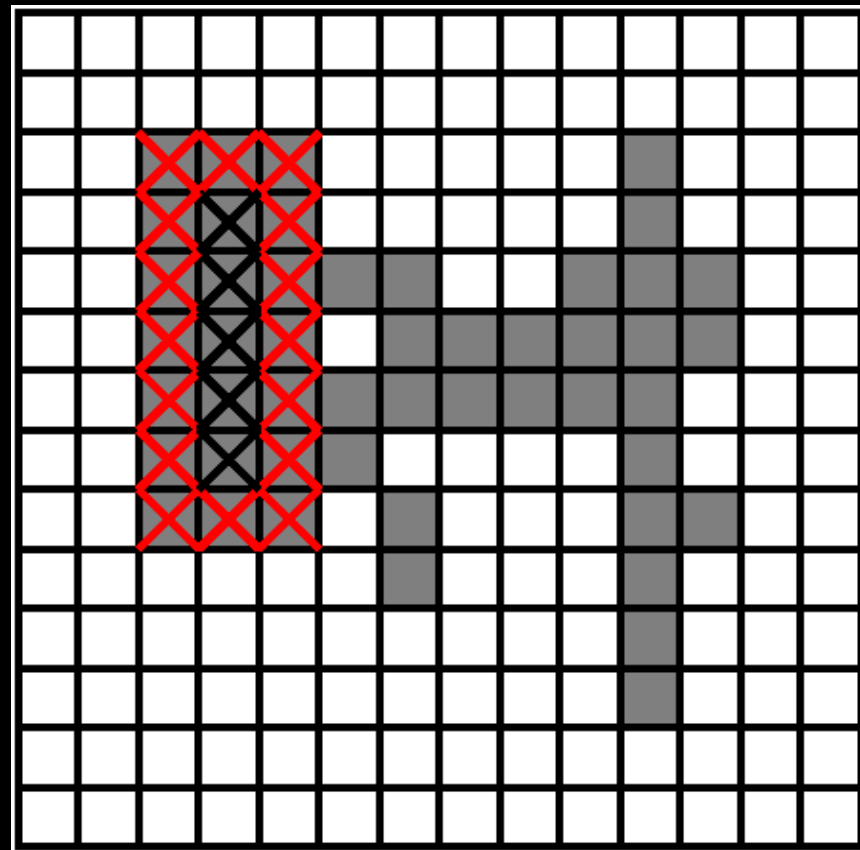
$$A \circ B = (A \ominus B) \oplus B$$

Otvorenie

B =



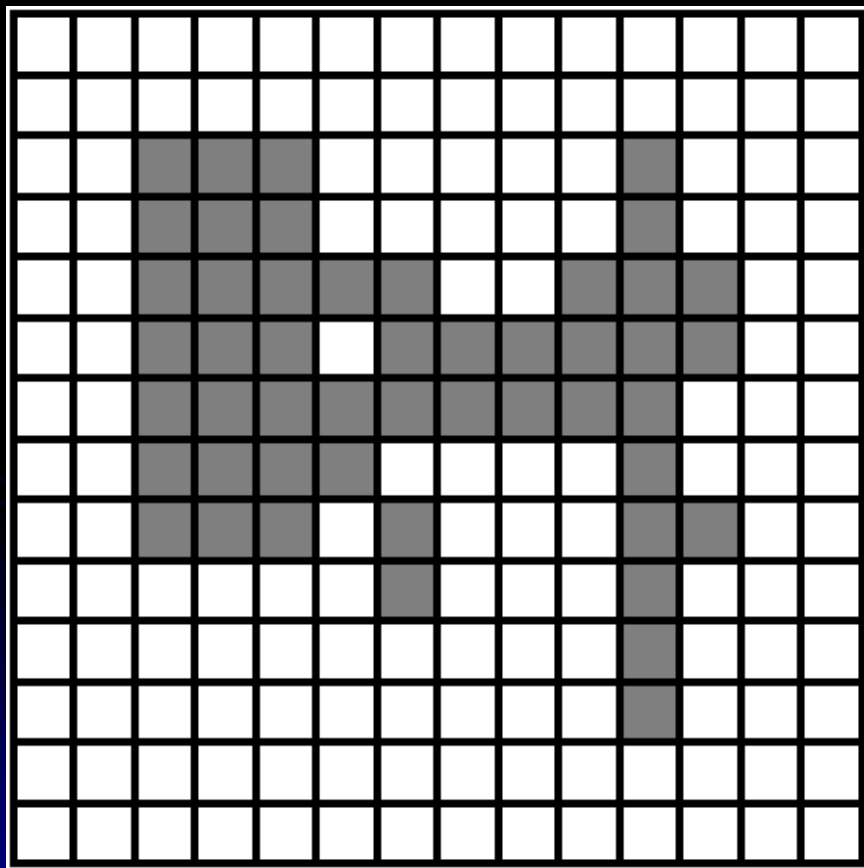
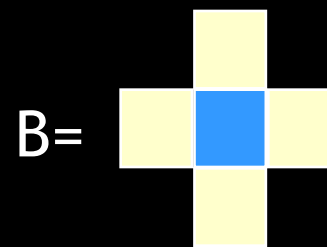
A



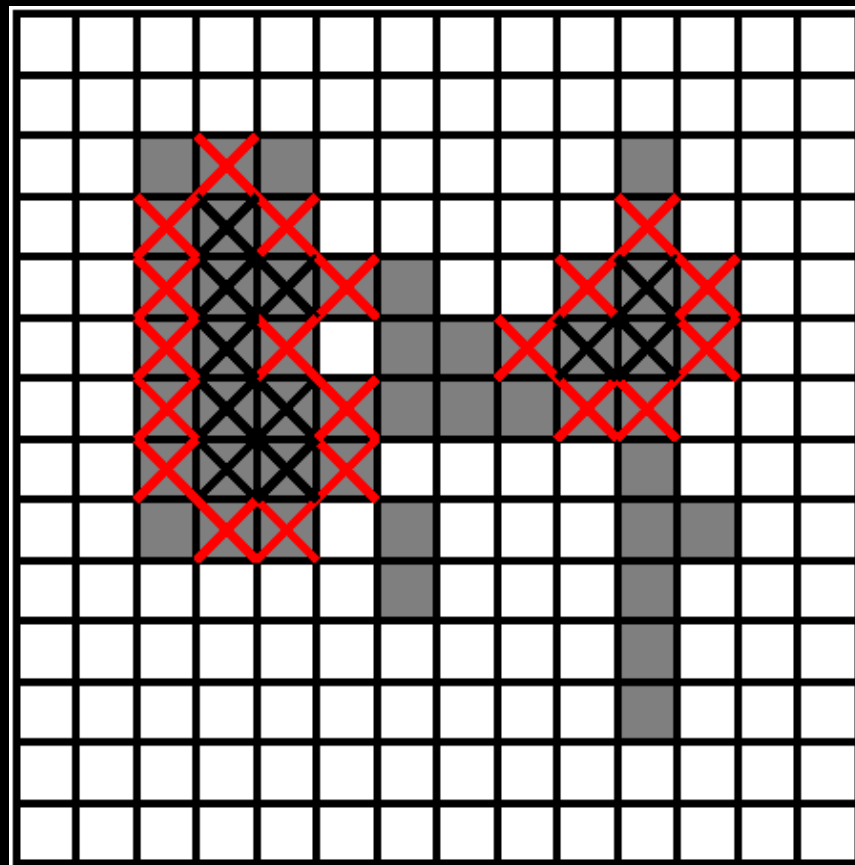
$A \ominus B$ $A \circ B$

$$A \circ B = (A \ominus B) \oplus B$$

Otvorenie

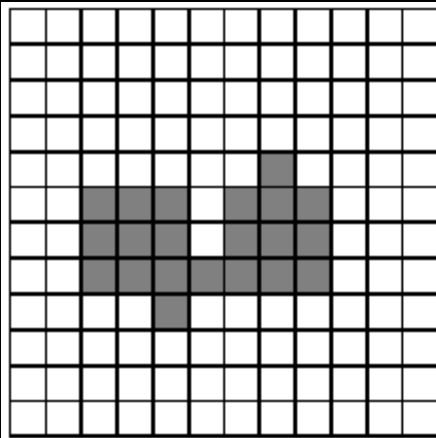


A

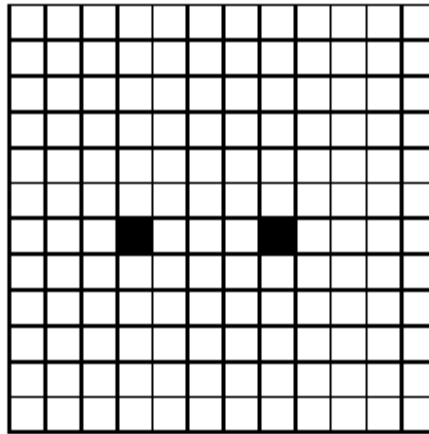


$A \ominus B$ $A \circ B$

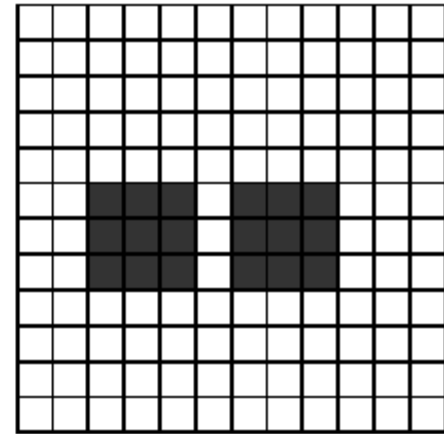
Otvorenie



F



$F \ominus H$



$(F \ominus H) \oplus H$

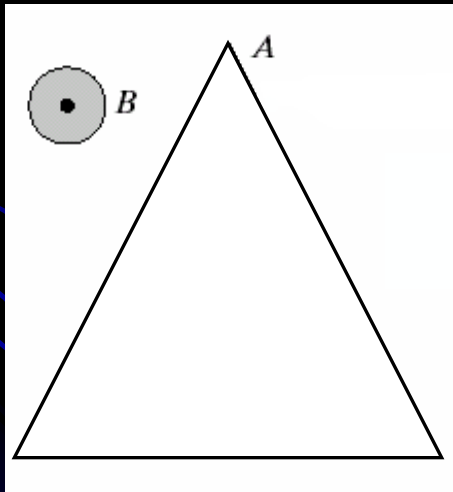


H, 3x3, origin at the center

Otvorenie

$$A \circ B = \bigcup B_x \mid B_x \subseteq A$$

posúvame B **po vnútornej strane hranice A**



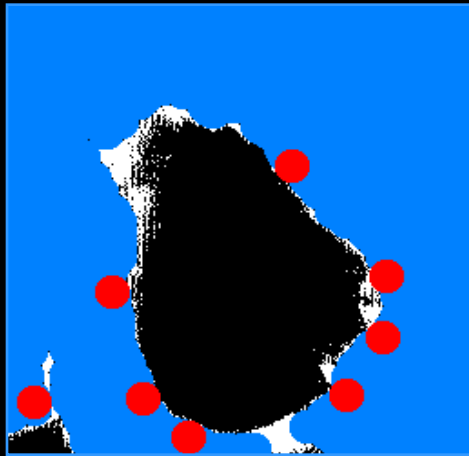
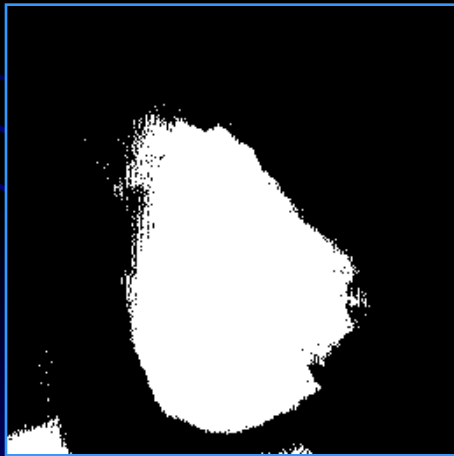
$A \ominus B$

$\oplus B$

$A \circ B$

Uzavretie

$$A \bullet B = \overline{A \oplus B \ominus B}$$



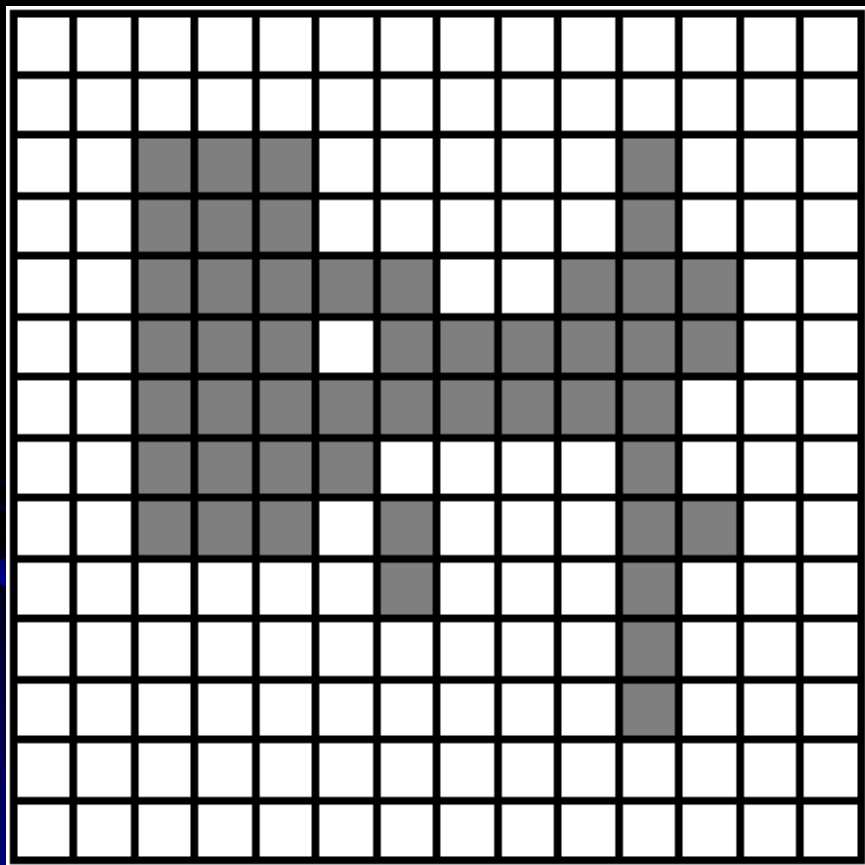
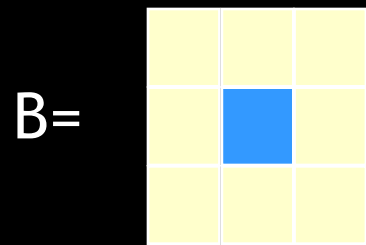
Vlastnosti uzavretia

$$A \subseteq A \bullet B$$

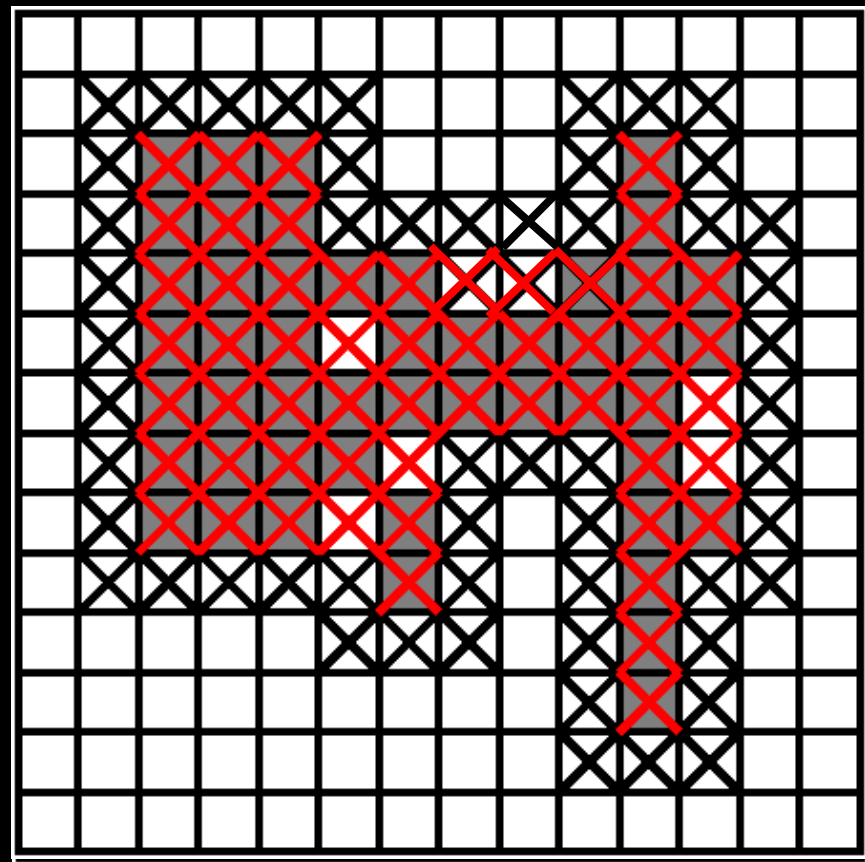
$$A \bullet \overline{B \bullet B} = A \bullet B$$

$$A \bullet B = A \oplus B \ominus B$$

Uzavretie

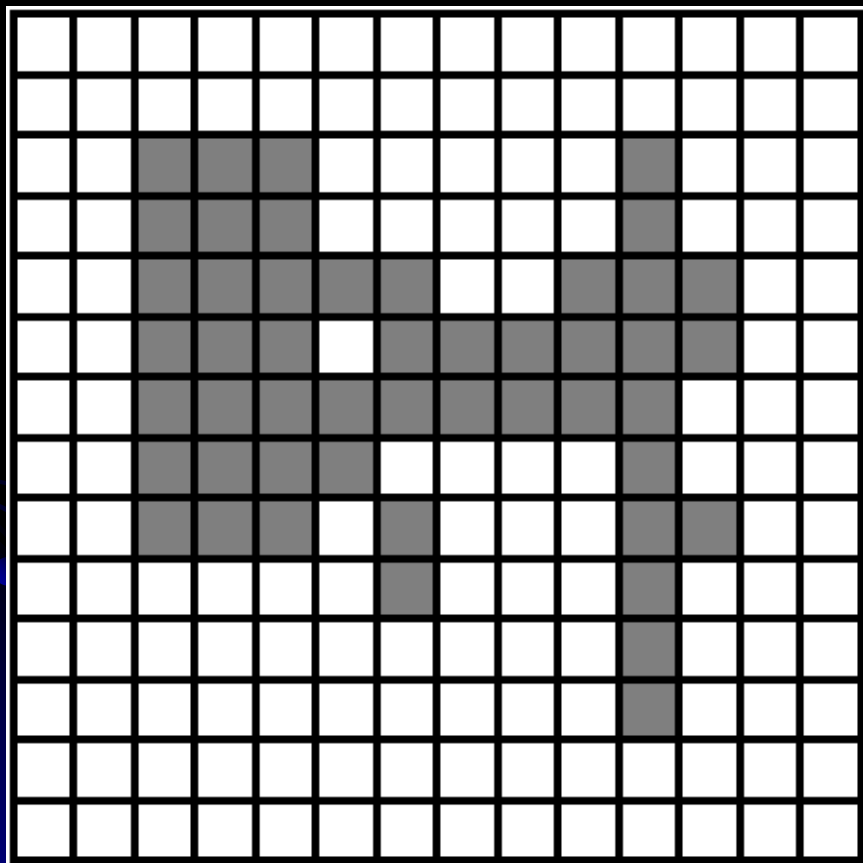
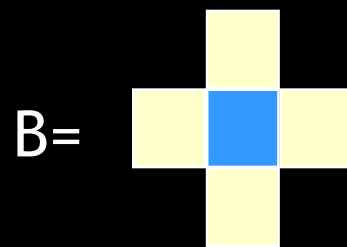


A

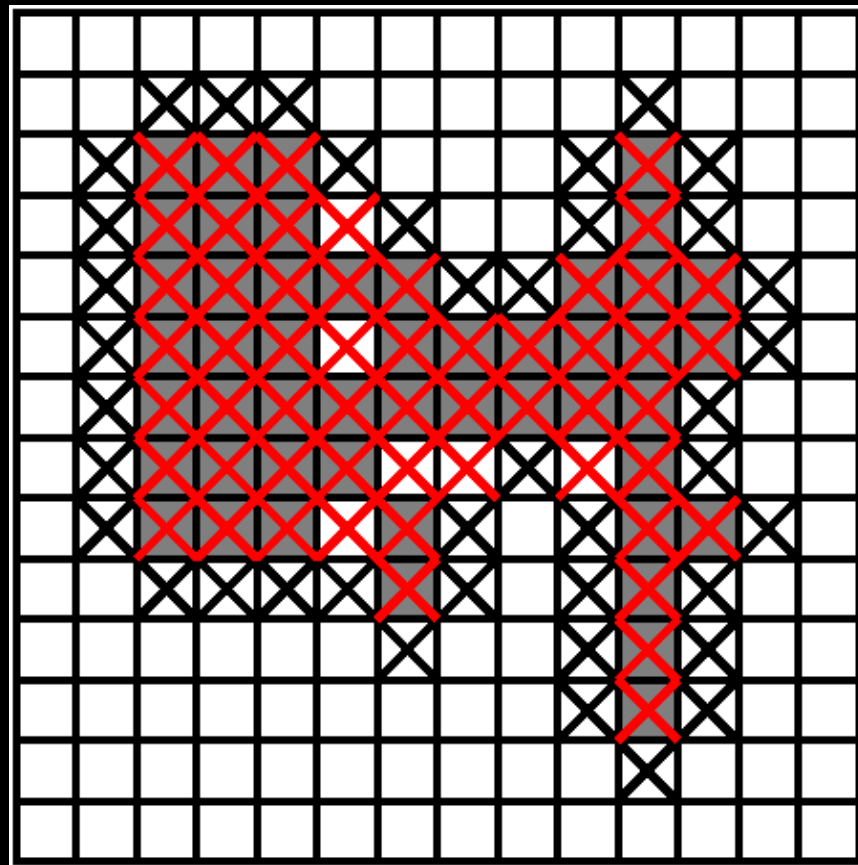


$A \oplus B$ $A \bullet B$

$$A \bullet B = \overline{A \oplus B} \ominus B \quad \text{Uzavretie}$$

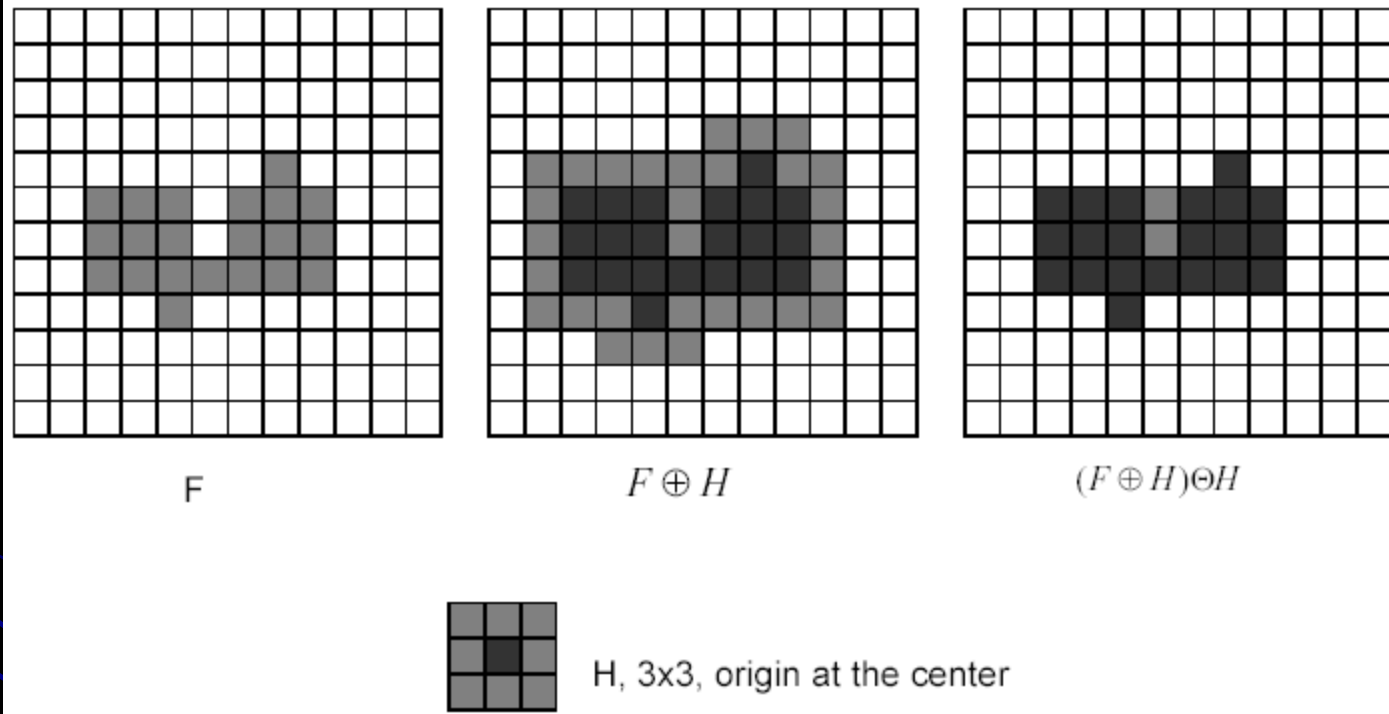


A



$A \oplus B$ $A \bullet B$

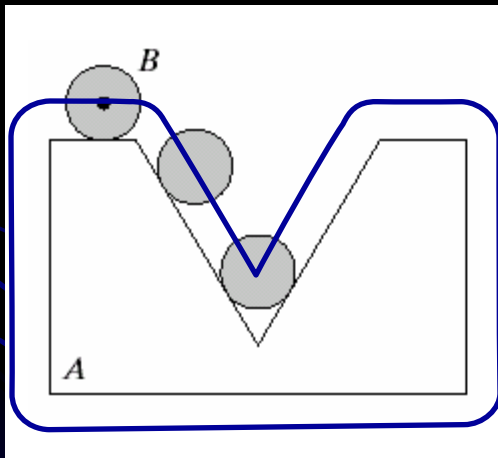
Uzavretie



Uzavretie

$$A \bullet B = \{ w \mid w \in B_x, B_x \cap A \neq \emptyset \}$$

posúvame B **po vonkajšej strane hranice A**

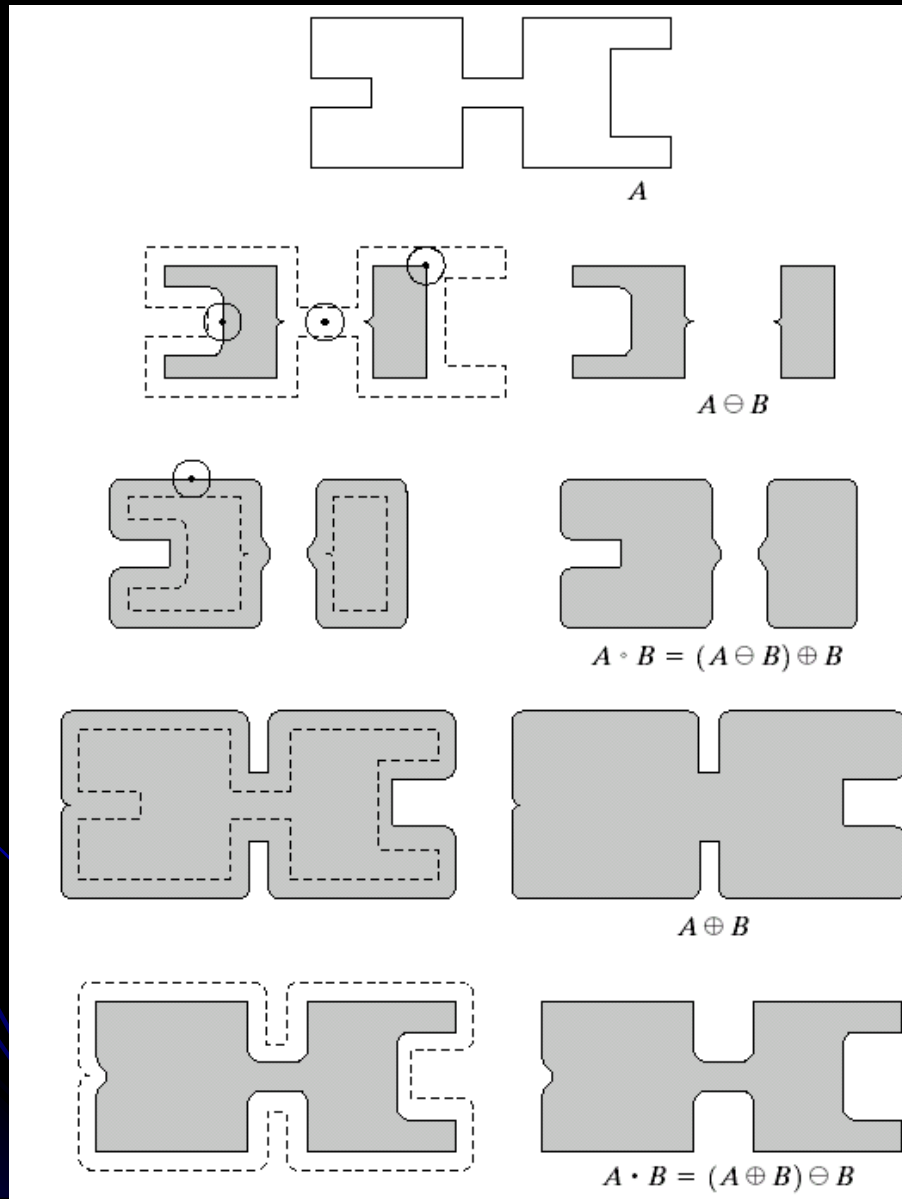


$$A \oplus B$$

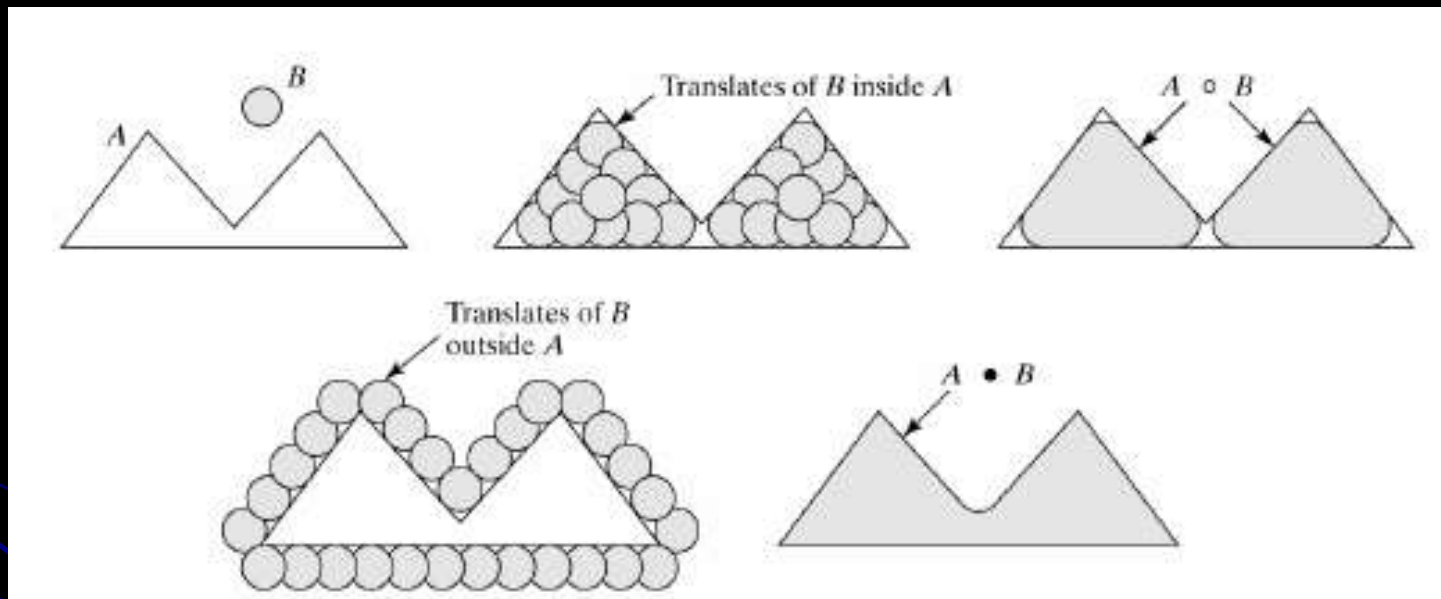
$$\ominus B$$

$$A \bullet B$$

Otvorenie - Uzavretie



Otvorenie - Uzavretie



Otvorenie - Uzavretie

THE
TEST
IMAGE

○ THE
TEST
IMAGE

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TEST
IMAGE

Dualita

$$A \bullet E^{\tau} = A^C \circ \hat{E}$$

Aplikácia: filtrovanie šumu



1. erózia
 $A \ominus B$



2. dilatácia
 $(A \ominus B) \oplus B = A \circ B$



3. dilatácia
 $(A \circ B) \oplus B$



4. erózia
 $((A \circ B) \oplus B) \ominus B = (A \circ B) \bullet B$

Opakovanie

otvorenie

erózia + dilatácia

uzavretie

dilatácia + erózia

- vyhladzuje kontúry
- prerušuje tenké spojenia
- maže tenké výčnelky

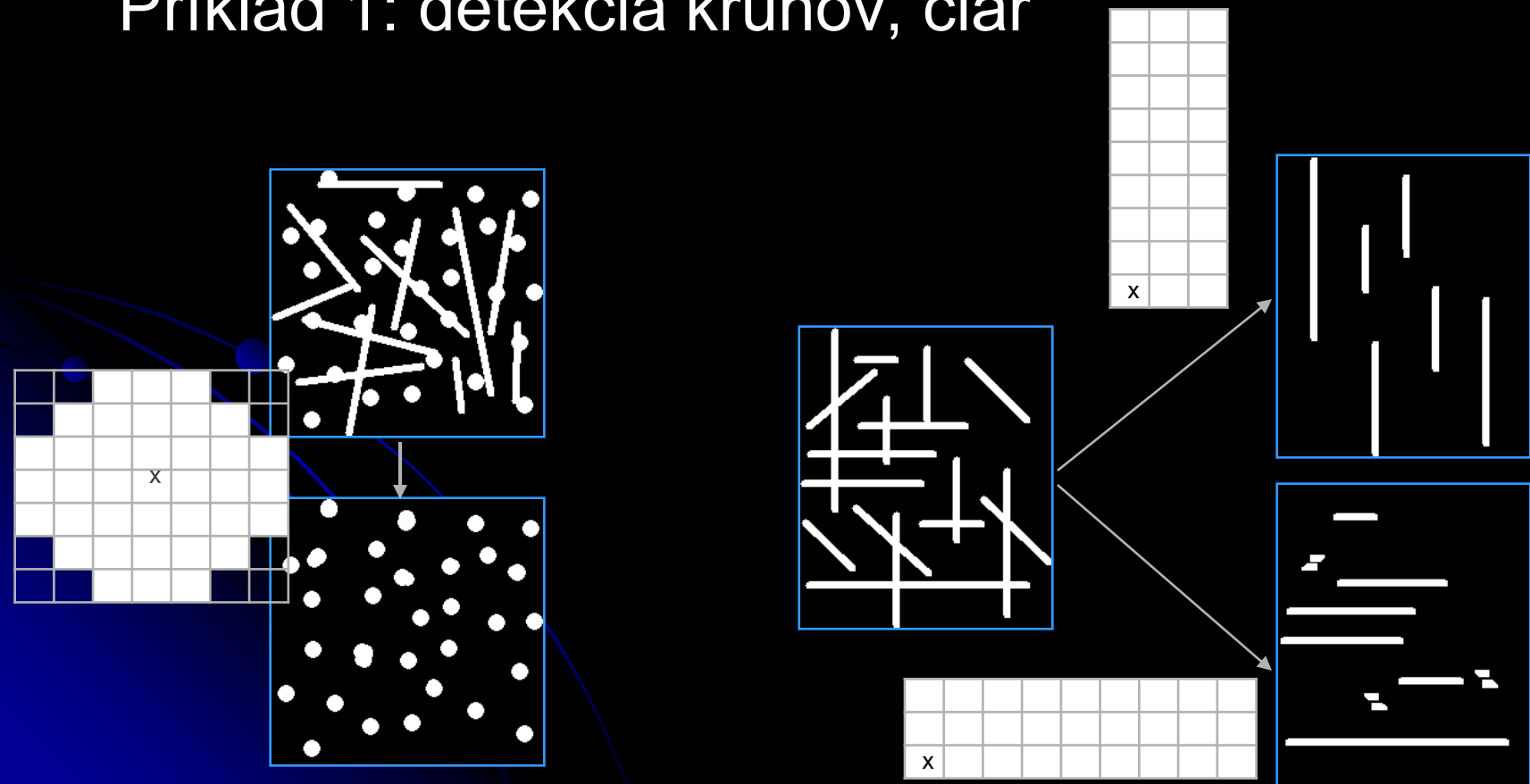
- vyhladzuje kontúry
- spája blízke oblasti
- vyplňa malé diery a tenké zálivy

Zachovávajú (približnú) veľkosť množiny

Detekcia tvarov

Otvorenie použitím daného štrukturálneho prvku

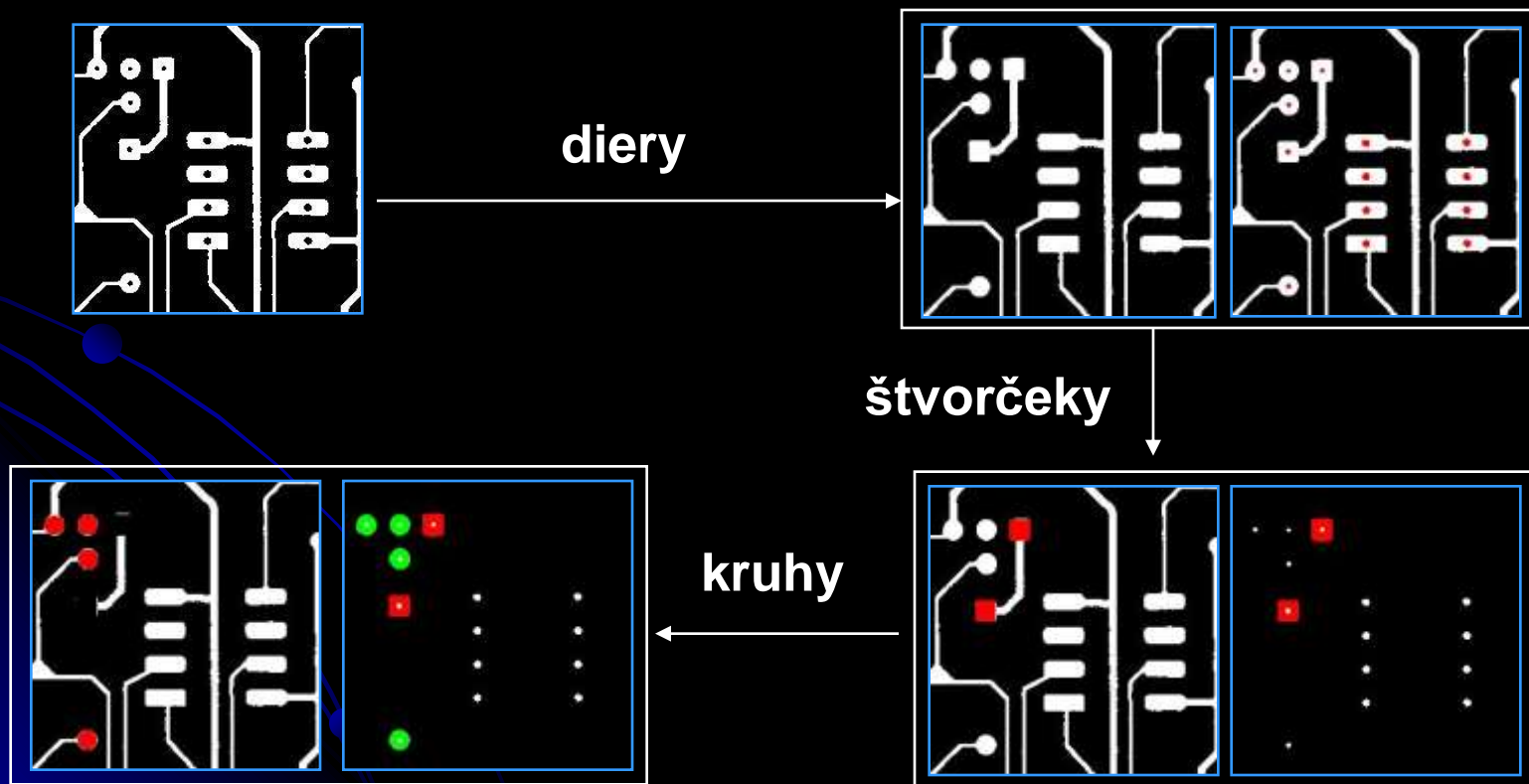
Príklad 1: detekcia kruhov, čiar



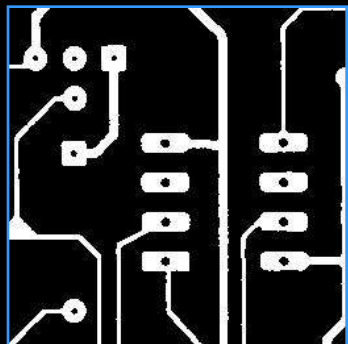
Detekcia tvarov

Príklad 2:

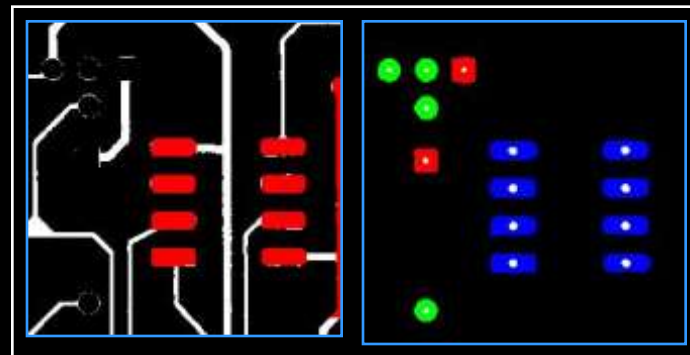
detekcia jednotlivých prvkov plošného spoja



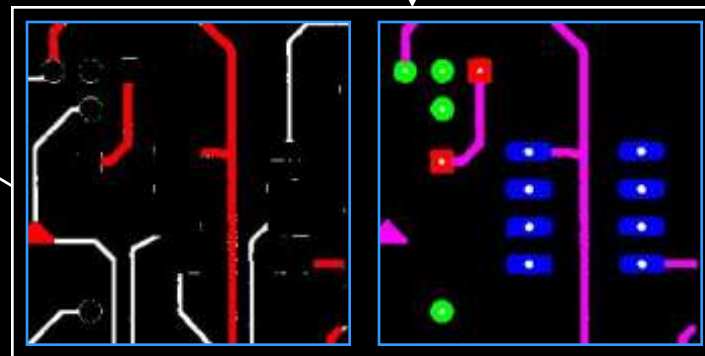
Detekcia tvarov



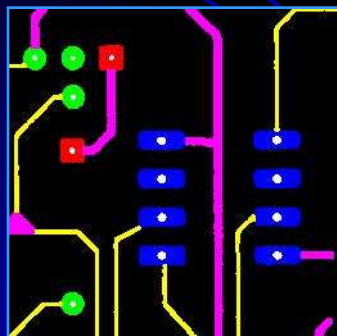
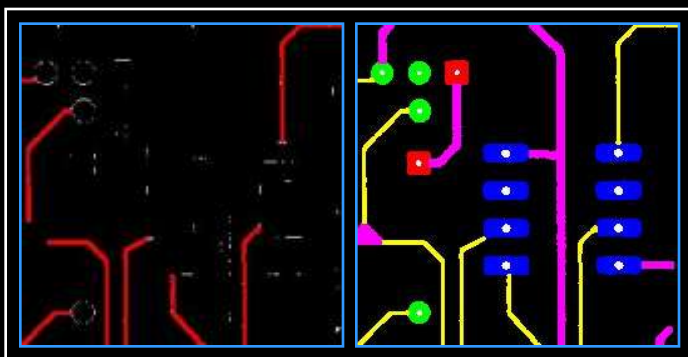
obdĺžniky



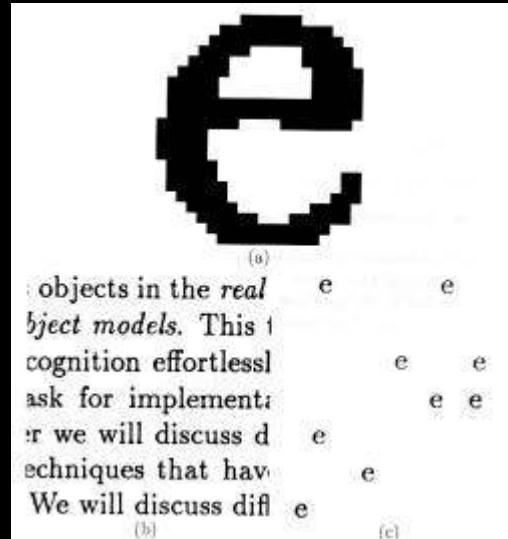
hrubé spoje



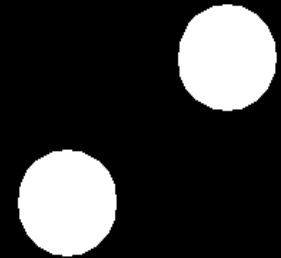
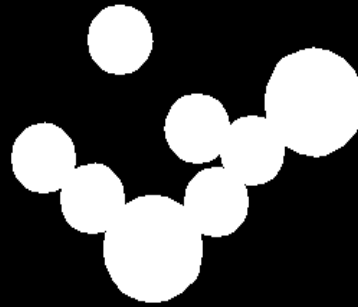
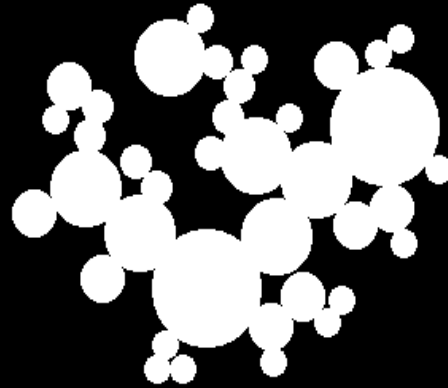
tenké spoje



Text



Granulometria



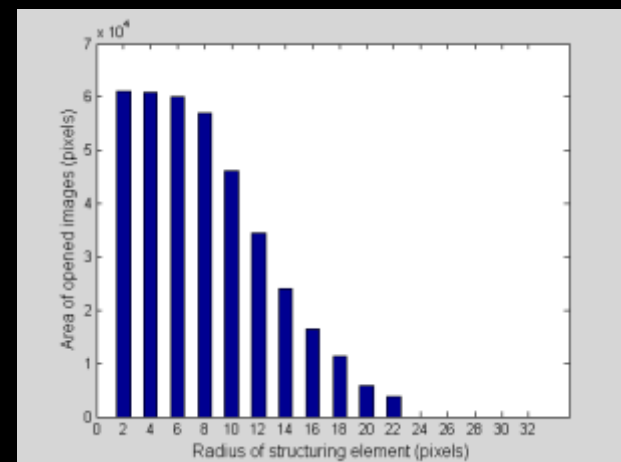
Otvorenie – kruh s priemerom 10, 15 a 25

Granulometria

Otvorenie so zväčšujúcim sa SE:



Distribúcia veľkosti granúl →



vstup:

štvorce veľkosti

1x1, 3x3, 5x5, 7x7,

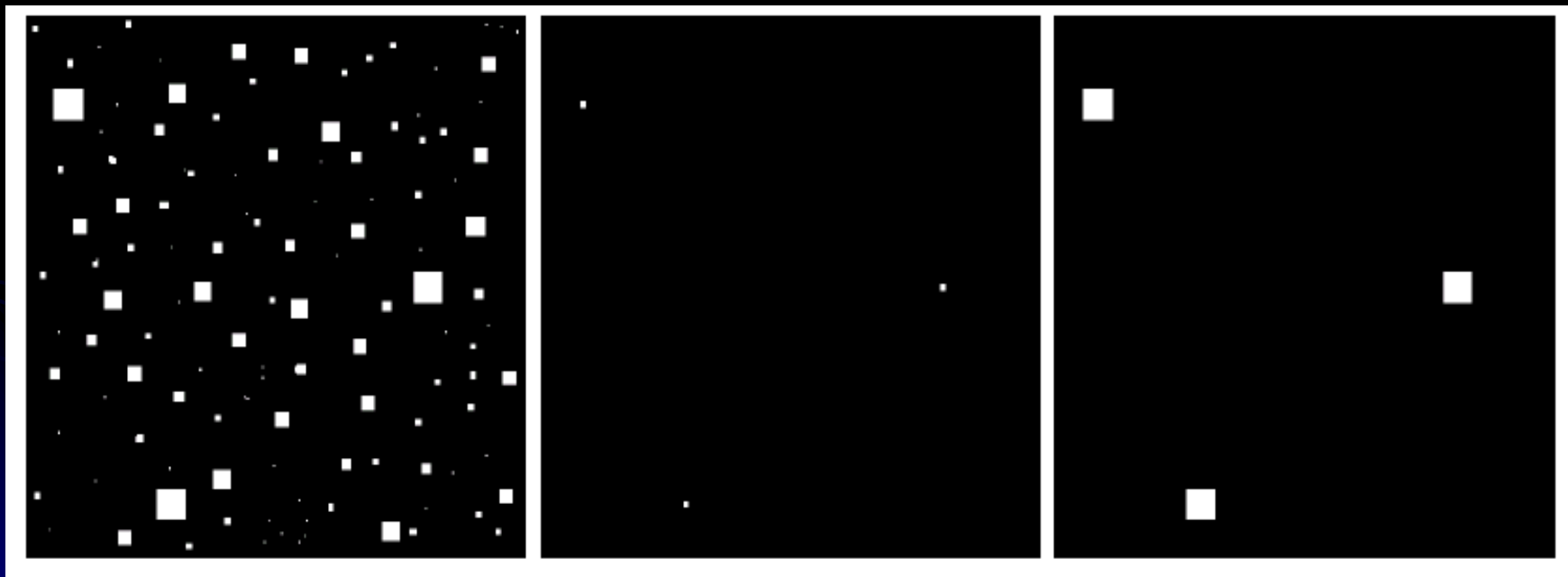
9x9 a 15x15 pixlov

erózia:

ŠP 13x13

dilatácia:

ŠP 13x13



Hit-and-Miss

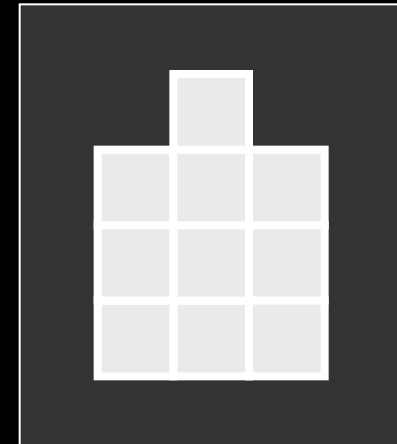
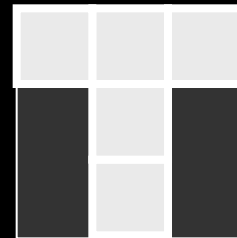
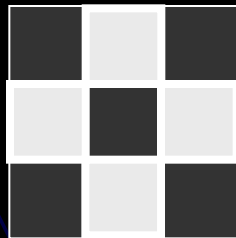
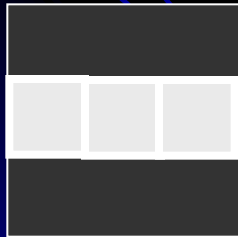
detektor tvarov

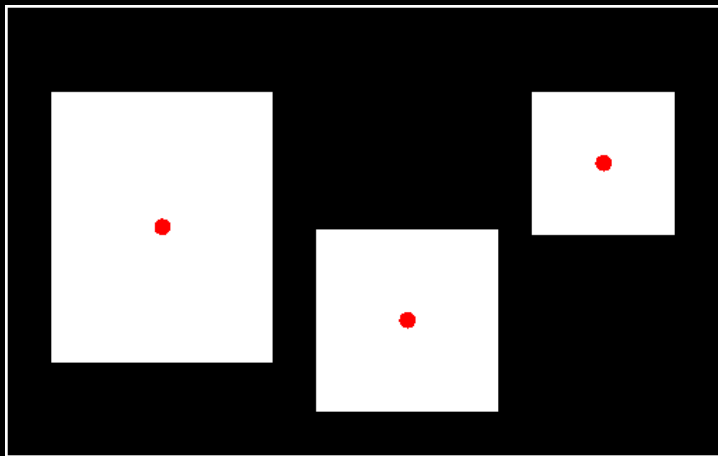
$$A \otimes B = (A \ominus B_1) \cap (A^c \ominus B_2),$$

$$B_1 \cap B_2 = \emptyset, B_1 \cup B_2 = B$$

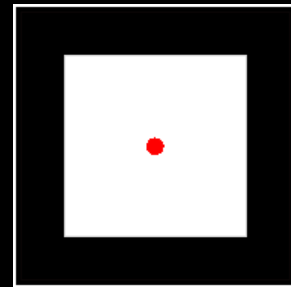
$$A \otimes B = (A \ominus B_1) \cap (A^c \ominus \hat{B}_2)$$

”template matching”

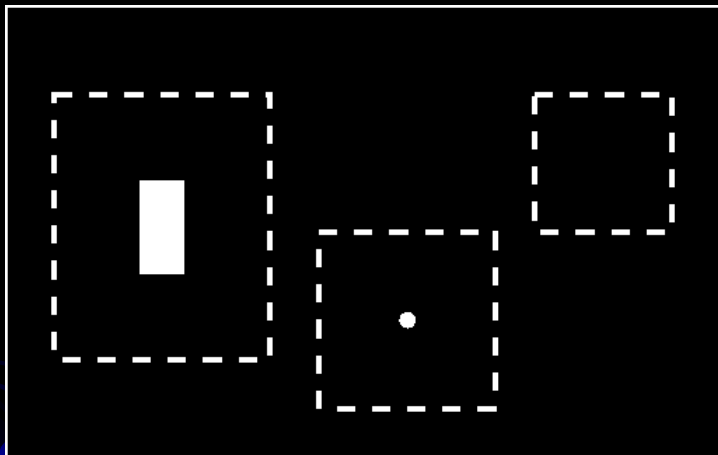




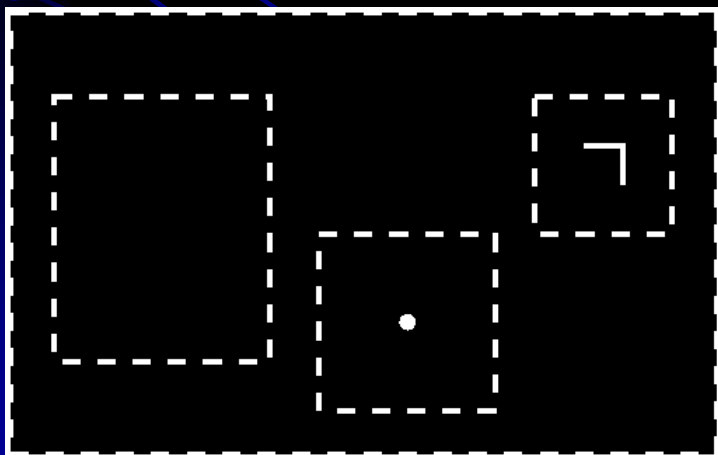
$$A = X \cup Y \cup Z$$



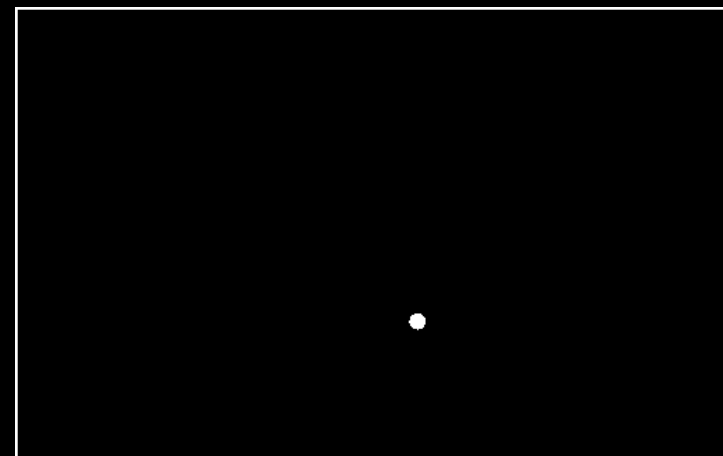
$$B_1 \cup B_2$$



$$A \ominus B_1$$

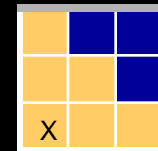
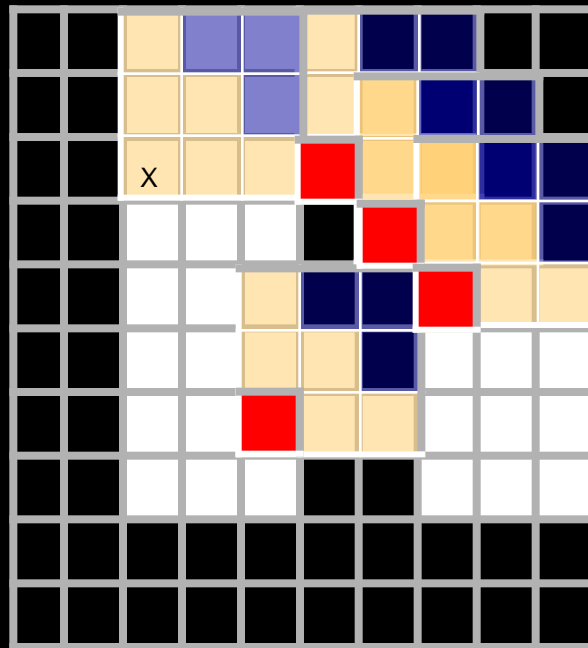


$$A^c \ominus B_2$$

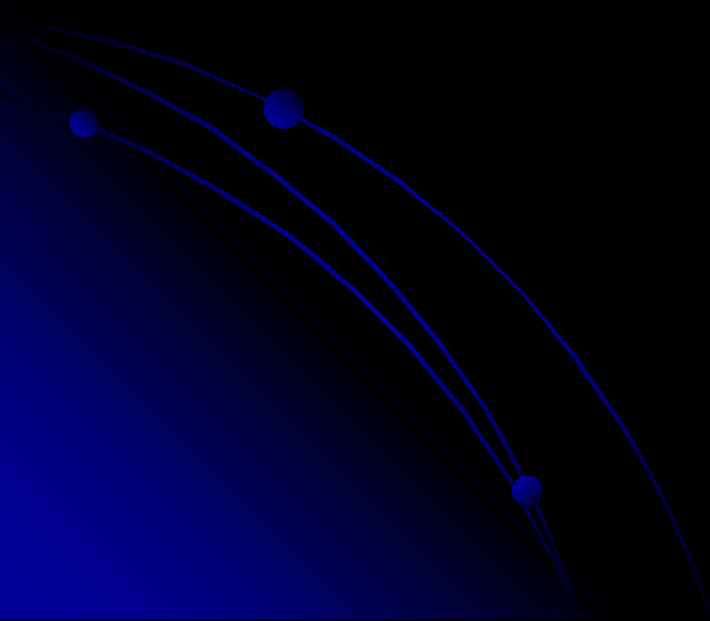
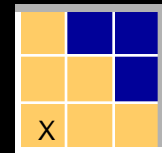
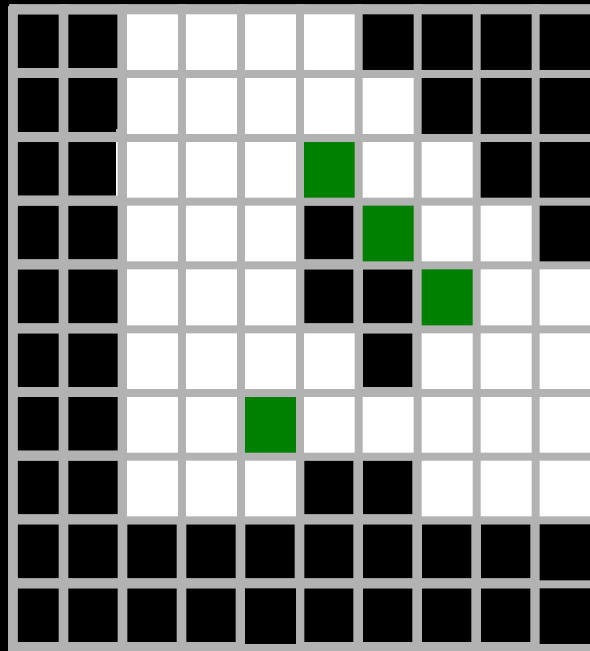


$$A \otimes X = (A \ominus B_1) \cap (A^c \ominus B_2)$$

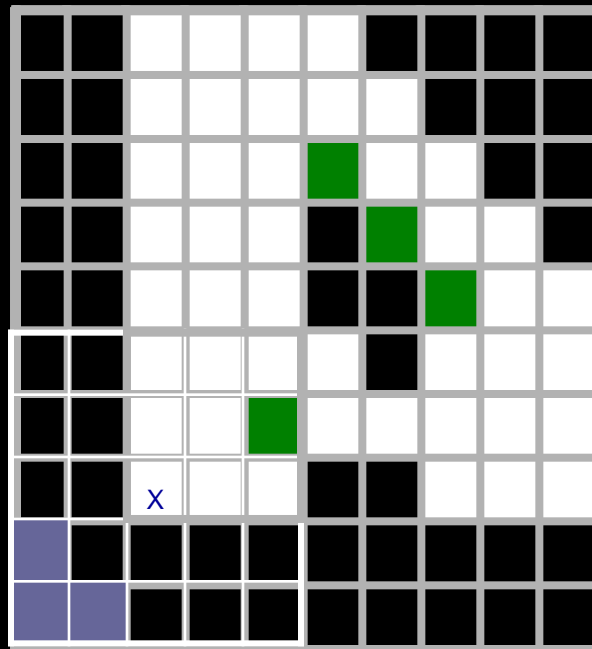
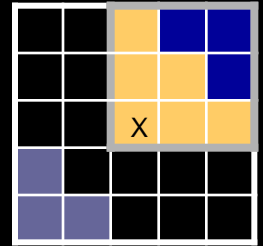
Hit-and-Miss



Hit-and-Miss



Hit-and-Miss



Hit-and-Miss

koncové body B_1



B_2



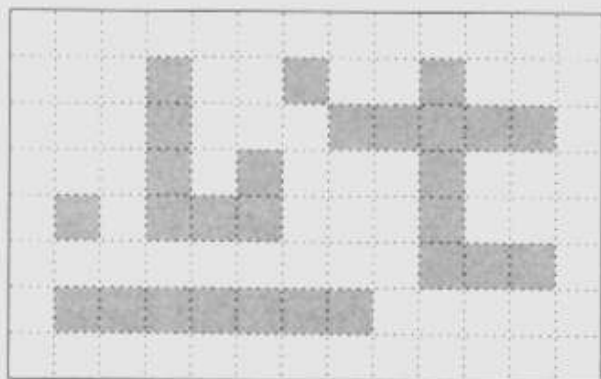
B_2



B_2



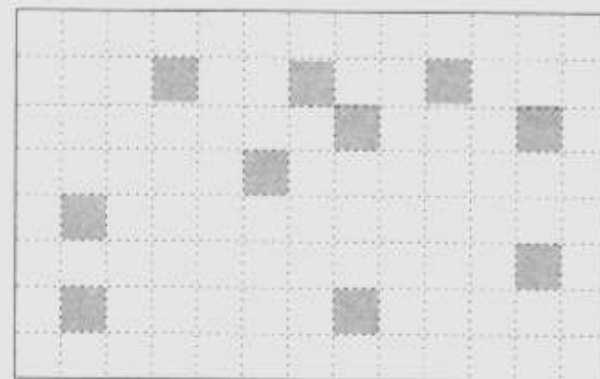
B_2



(a) Input image



(b) SEs for 4-connected endpoints

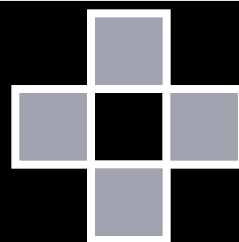


(c) Endpoints of input image

izolované body



B_1

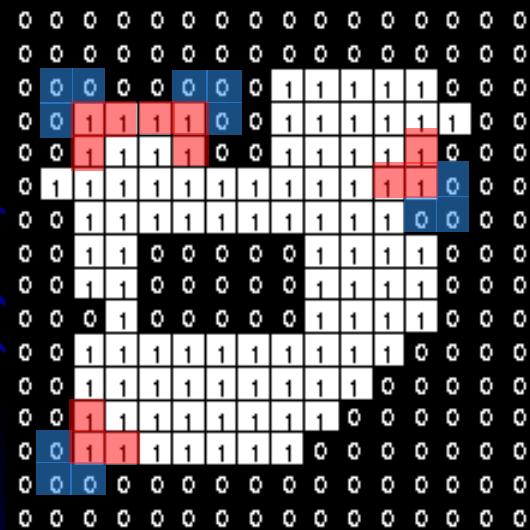


B_2

Hit-and-Miss

Detekcia rohov

	1				1				0	0			0	0	
0	1	1			1	1	0		1	1	0		0	1	1
0	0					0	0			1				1	



Konvexné rohy

Šedotónová morfológia



Obráz

$$X = \{ (\mathbf{a}; f_X(\mathbf{a})) \mid \mathbf{a} \in E^{n-1}, f_X(\mathbf{a}) \in R \cup \{\infty\} \cup \{-\infty\} \}$$

= n-dim graf

Nosič (support): $\text{supp}(X) = \{ \mathbf{a} \in E^{n-1}, f(\mathbf{a}) \in R \}$

mimo: ∞ alebo $-\infty$

Pre nás $n=3$

Obraz

Binárny obraz

$f(\mathbf{x}) = \text{konštanta}$

Množinové operácie

Šedotónový obraz

$f(\mathbf{x})$ – úrovne intenzity

min/max

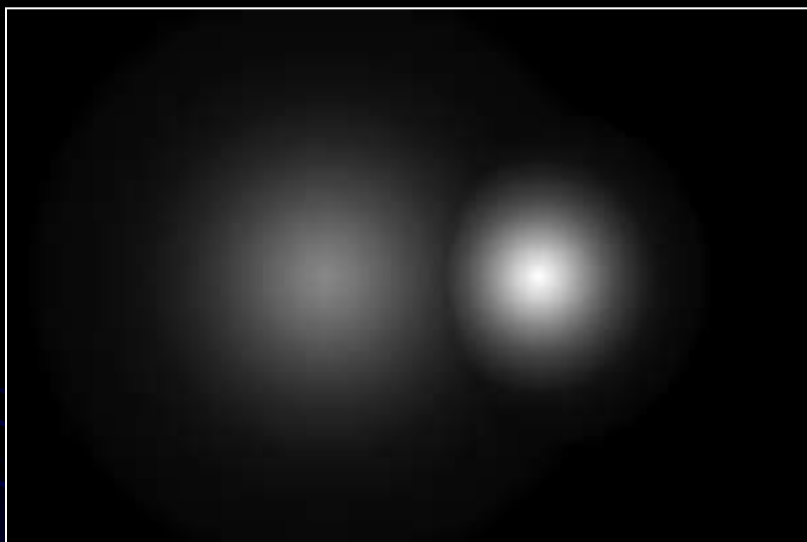
sup/inf

$X \subseteq Y$:

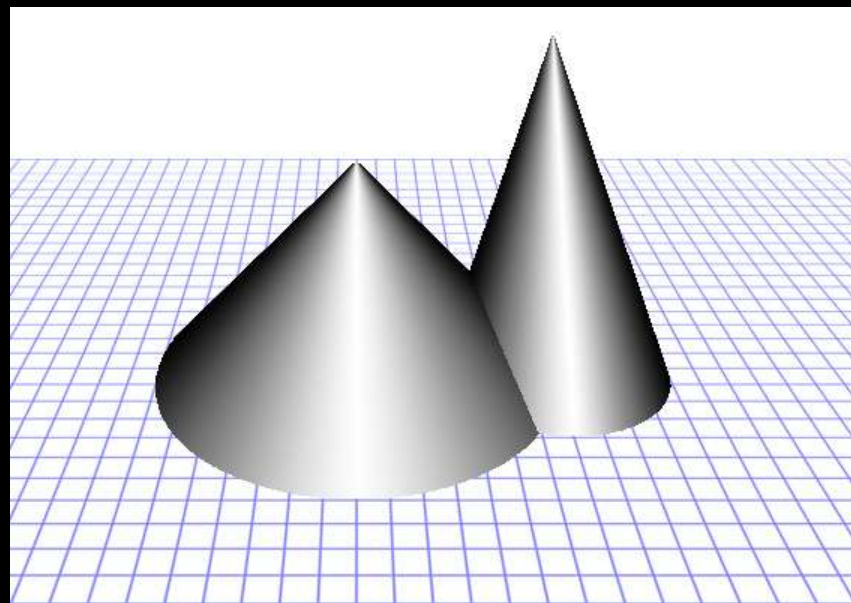
$\text{supp}(X) \subseteq \text{supp}(Y)$

$f_X(\mathbf{a}) \leq f_Y(\mathbf{a})$ pre $\mathbf{a} \in \text{supp}(X)$

Obraz

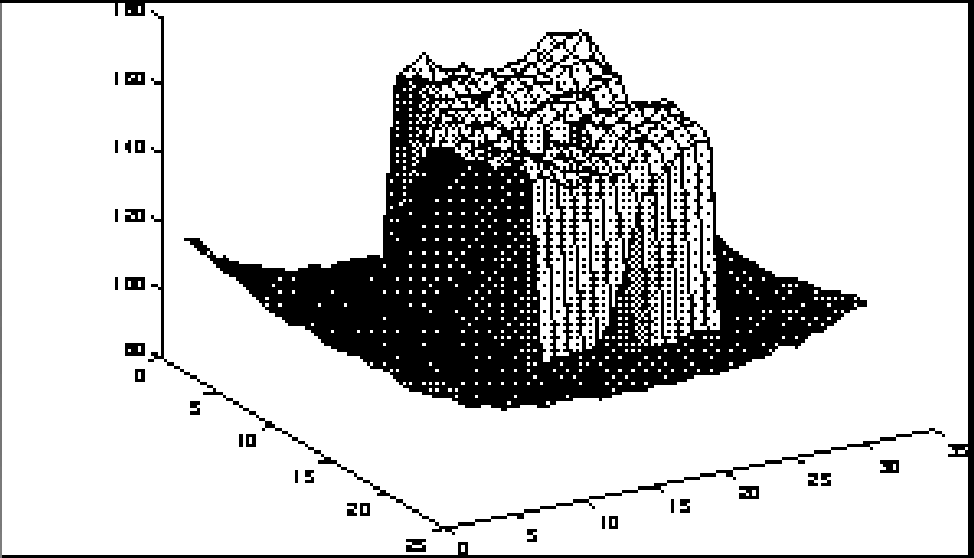
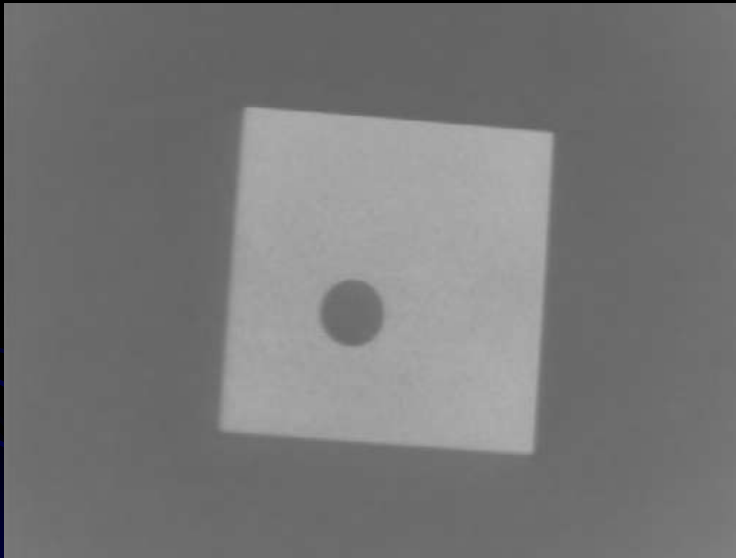


obraz



3D reprezentácia

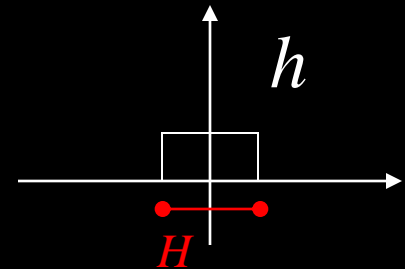
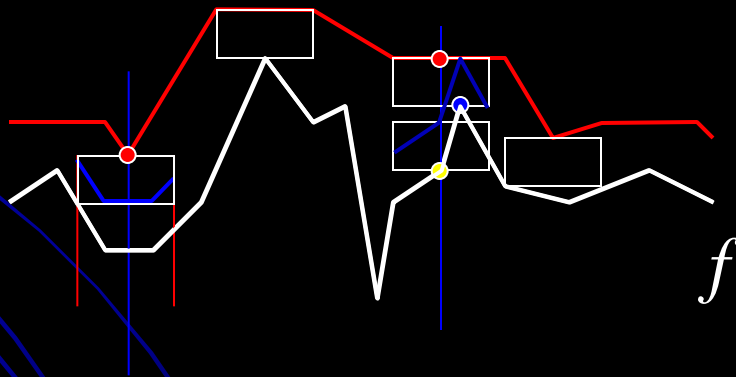
Obraz



Dilatácia

$$(f \oplus h)(x, y) = \max_{(r,s) \in H} f(x-r, y-s) + h(r,s)$$

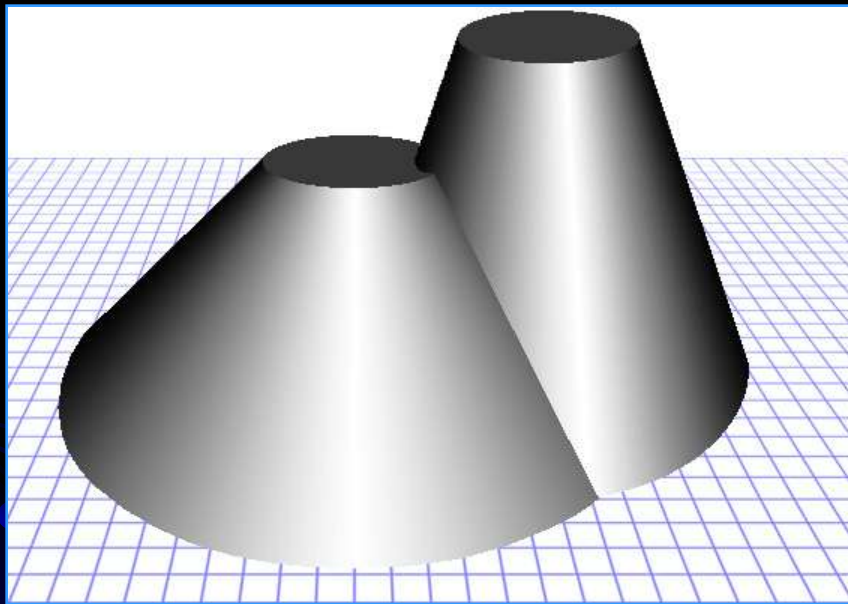
$$(f \oplus h)(x) = \max_{r \in H} f(x-r) + h(r)$$



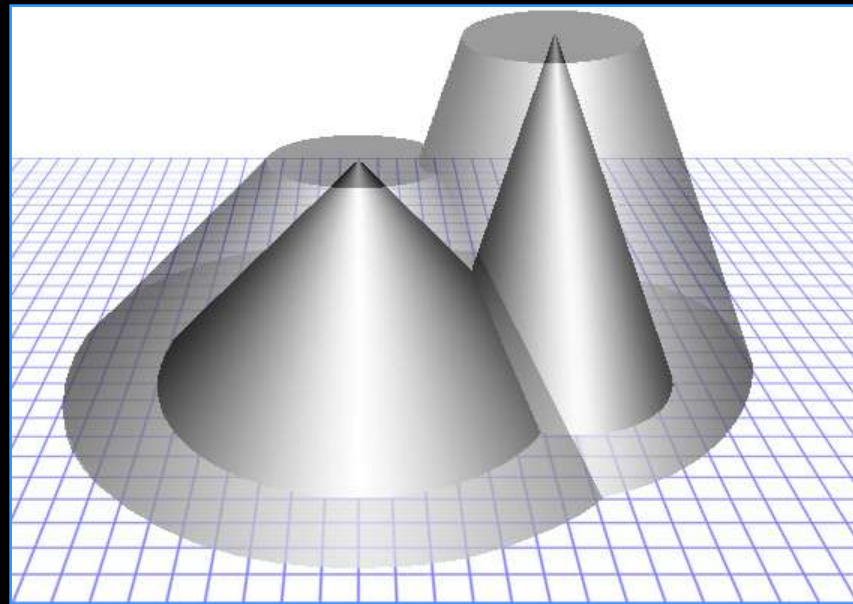
$H(x)$ - "structuring functions"

Dilatácia

ilustrácia v 3D



Dilatácia



Dilatácia vs. originál

Dilatácia

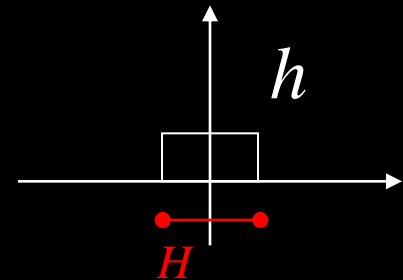
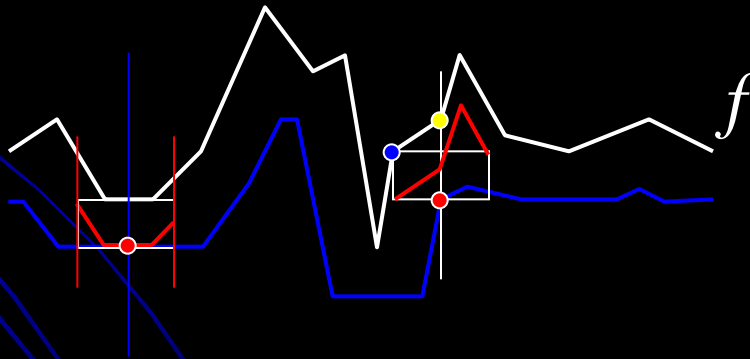


Zjasňuje obrázok – zvyšuje intenzitu

Erózia

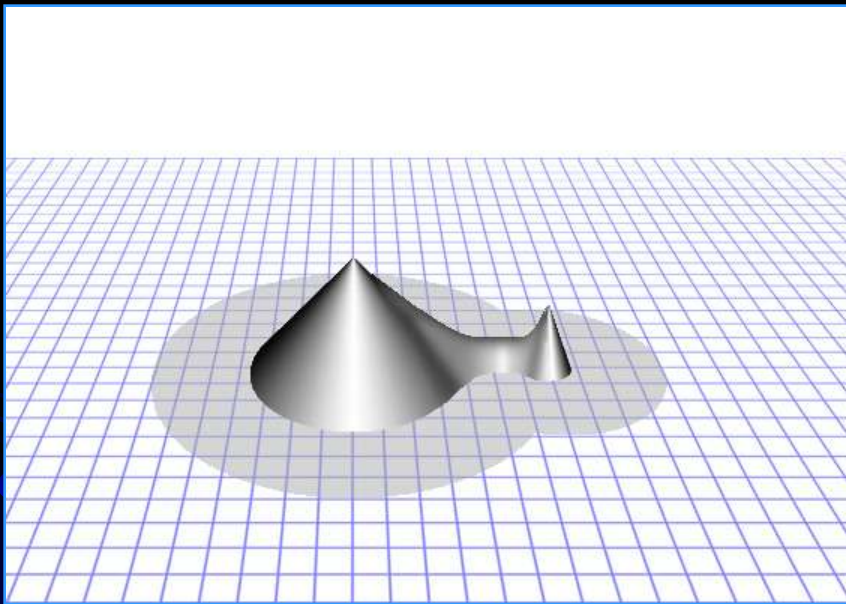
$$(f \ominus h)(x, y) = \min_{(r,s) \in H} f(x+r, y+s) - h(r,s)$$

$$(f \ominus h)(x) = \min_{r \in H} f(x+r) - h(r)$$

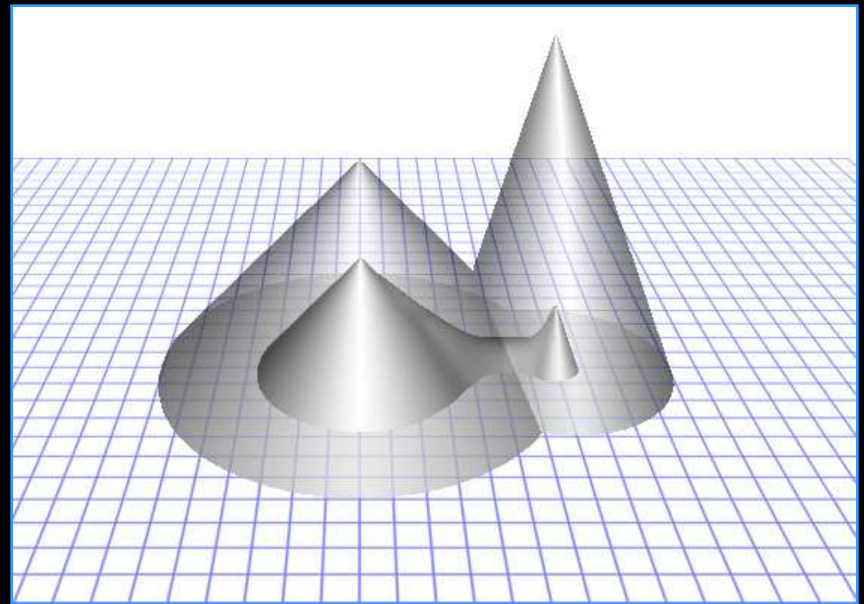


Erózia

ilustrácia v 3D

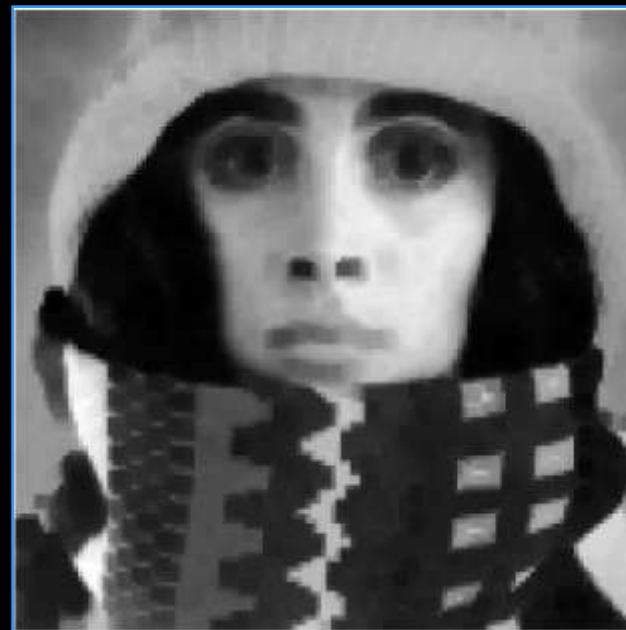


Erózia



Erózia vs. originál

Erózia



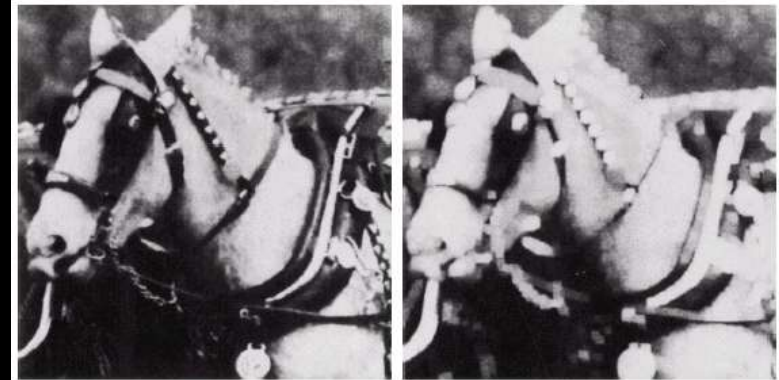
Ztmavuje obrázok – znižuje intenzitu

DE zhrnutie

D:

Jasnejší obrázok

Redukuje (odstraňuje)
tmavé detaily



E:

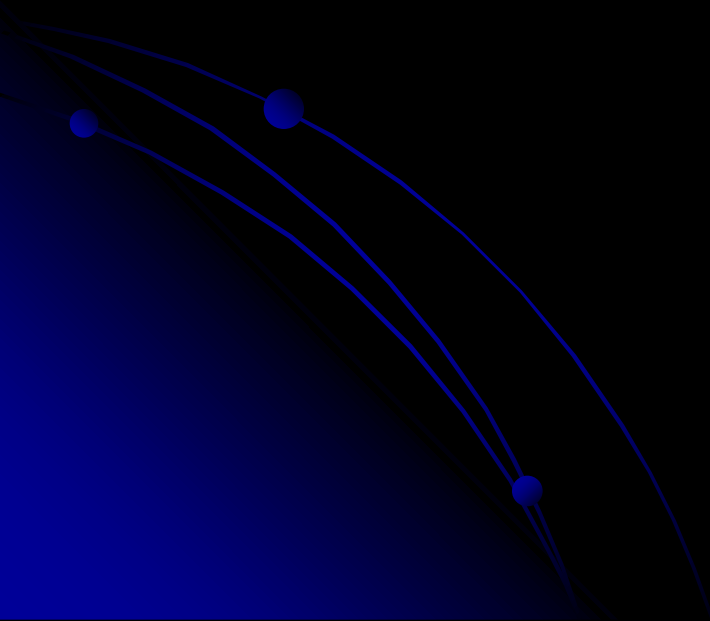
Tmavší obrázok

- Redukuje (odstraňuje)
svetlé detaily

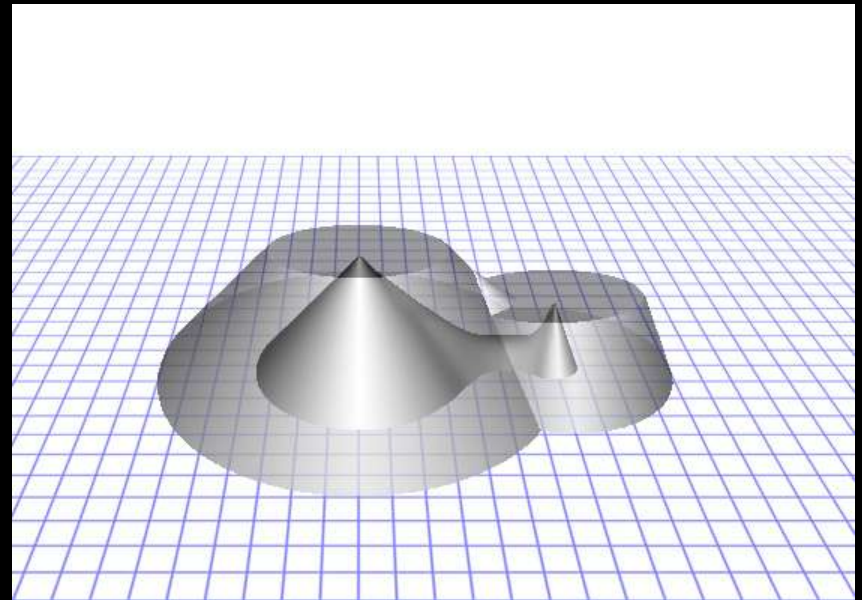
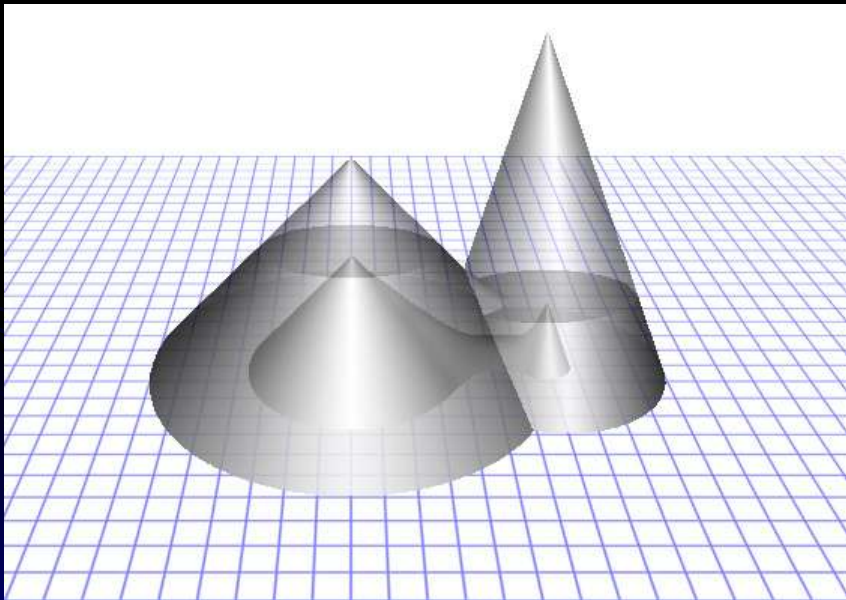


Otvorenie

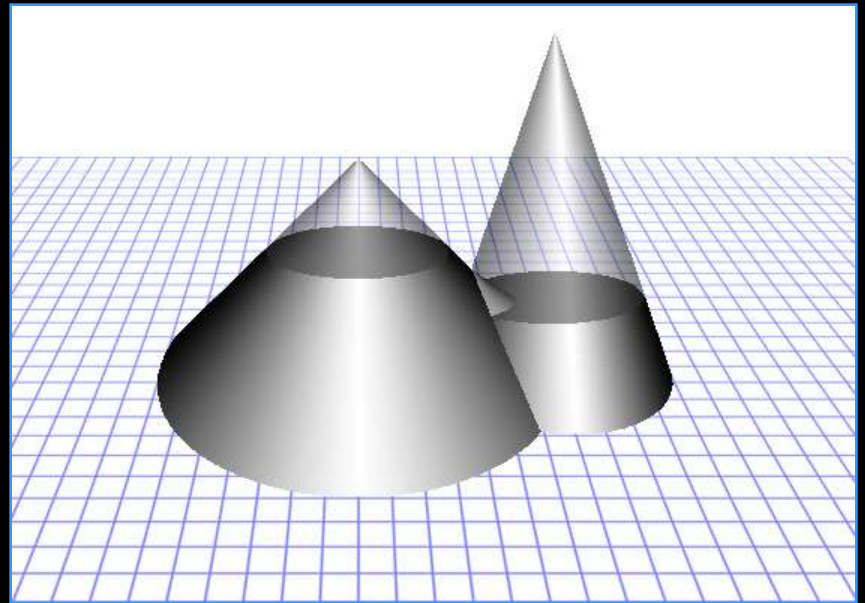
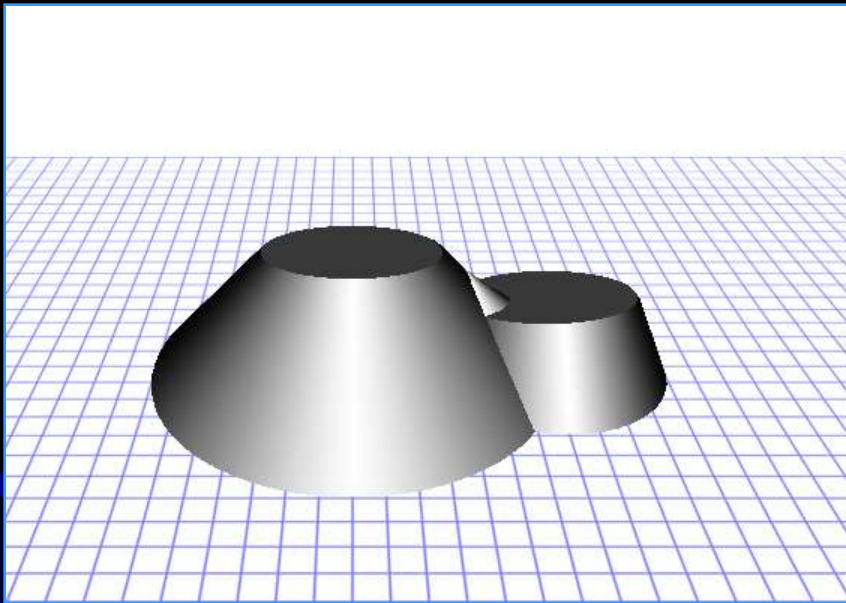
$$A \circ B = \overline{A \ominus B} \oplus B$$



Otvorenie



Otvorenie

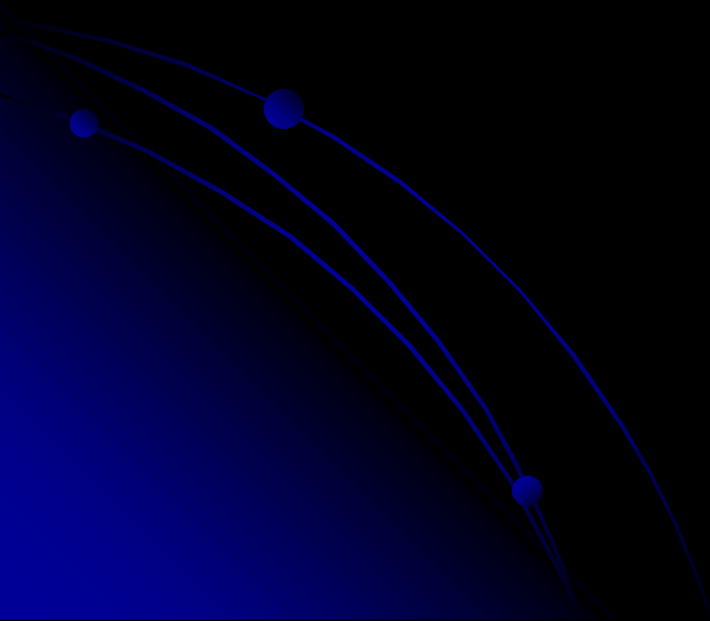


Otvorenie

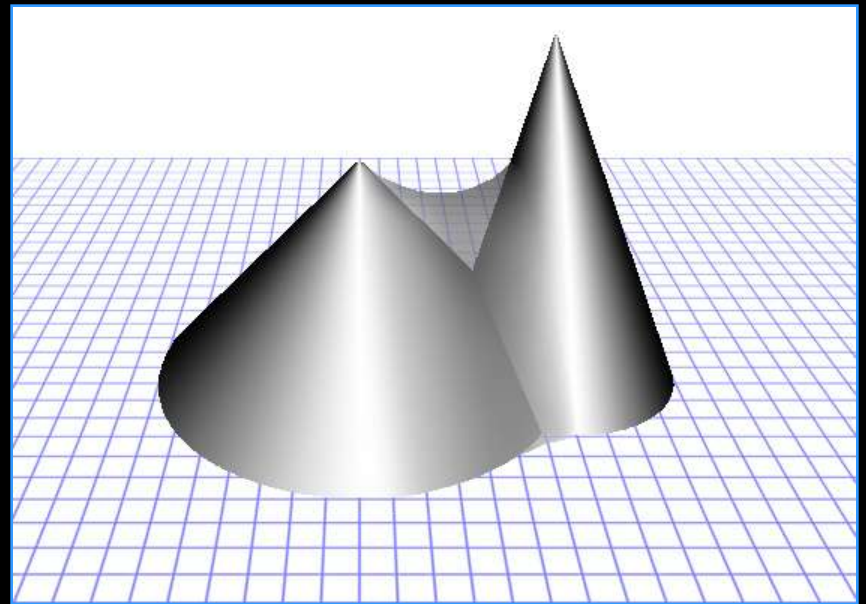
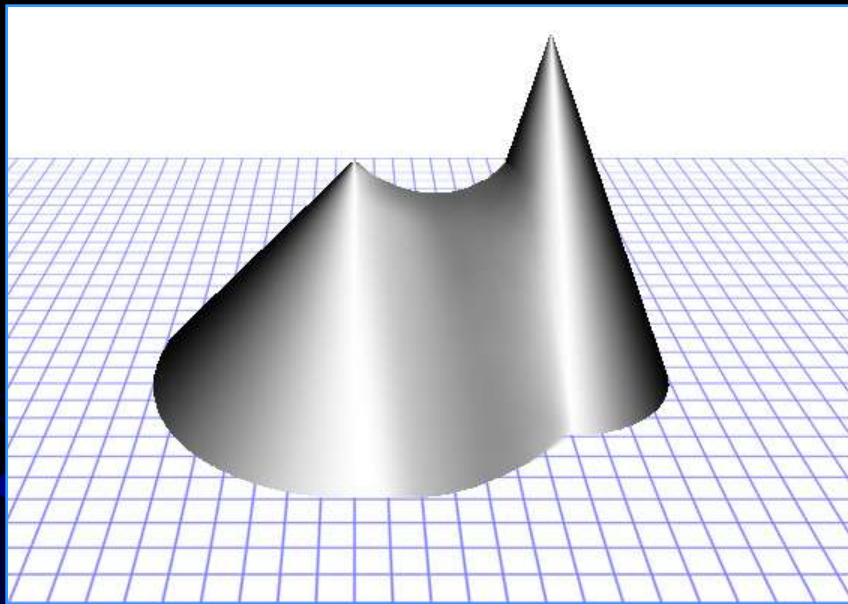


Uzavretie

$$A \bullet B = \overline{A \oplus B \ominus B}$$



Uzavretie



Uzavretie

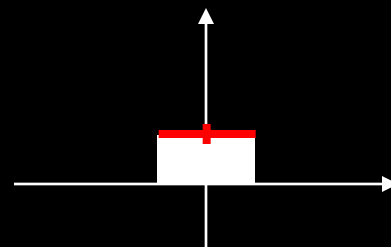
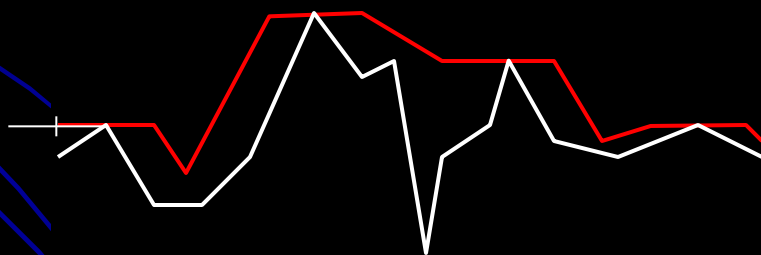
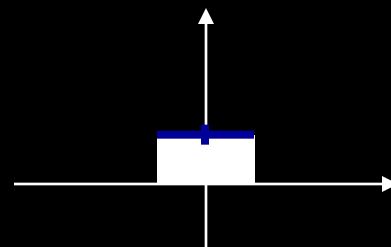
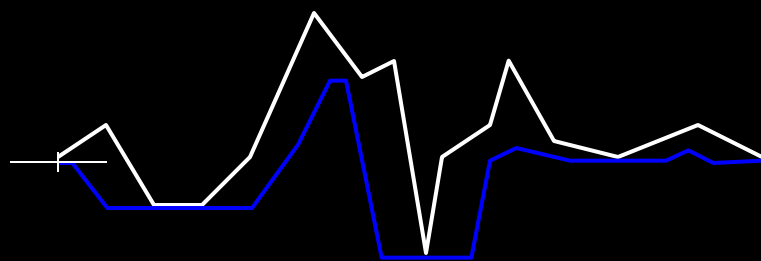


$$A \circ B = \overline{A \ominus B} \oplus B$$

OU

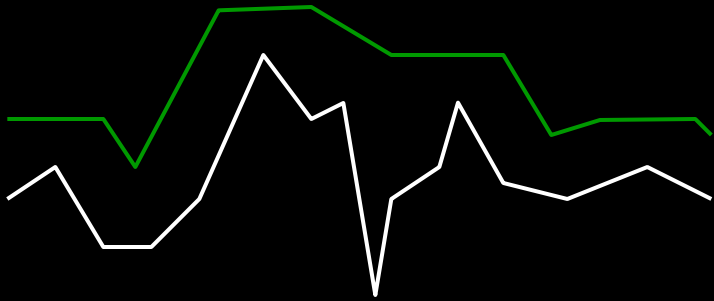
$$A \bullet B = \overline{A \oplus B} \ominus B$$

otvorenie

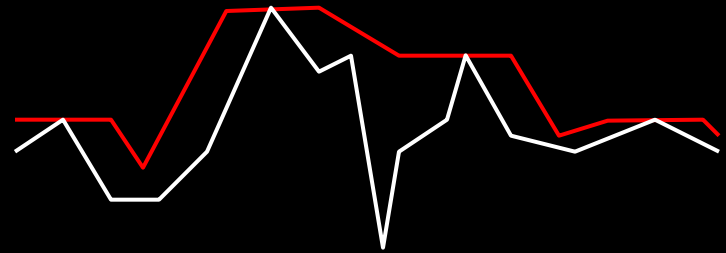


uzavretie

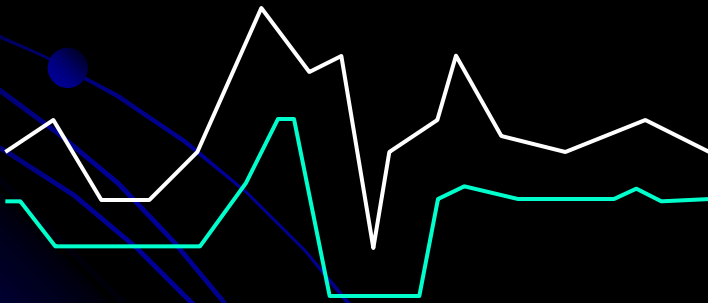
Zhrnutie



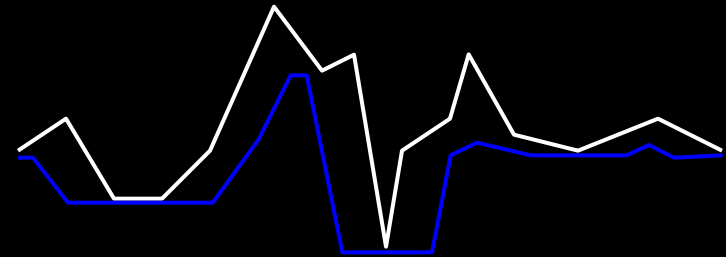
D



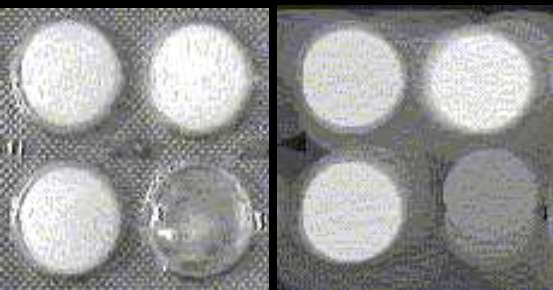
U



E



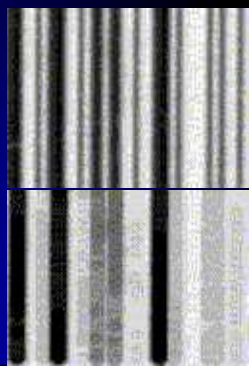
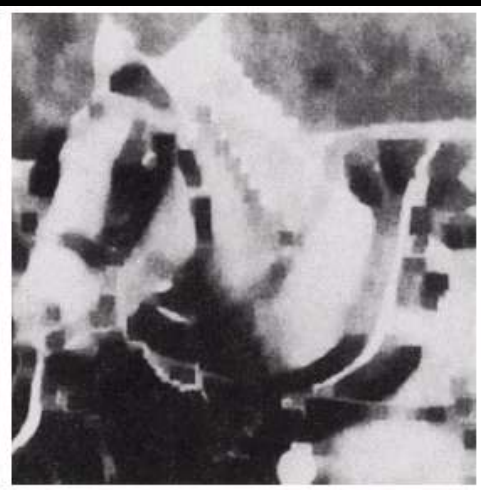
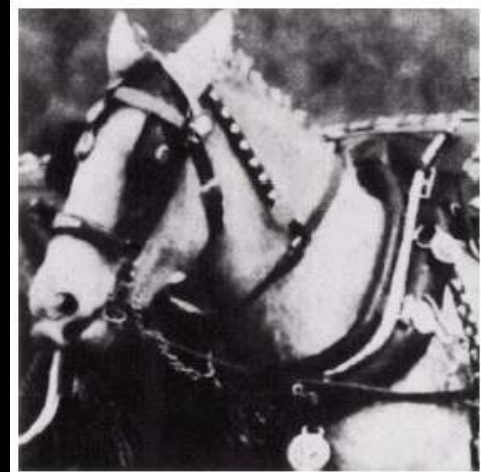
O



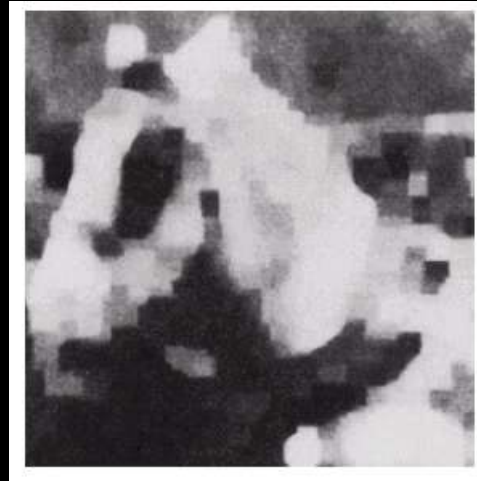
OU zhrnutie

O: odstraňuje malé svetlé objekty
odstraňuje šum

U: spája svetlé objekty
redukuje malé tmavé
oblasti



Príklad použitia



$(A \circ B) \bullet B$ – filtrácia obrazu

Opakovanie

\oplus dilatácia

$$A \oplus B = \bigcup_{b \in B} A_b$$

\ominus erózia

$$A \ominus B = \bigcap_{b \in B} A_{-b}$$

\circ otvorenie

$$A \circ B = (A \ominus B) \oplus B$$

\bullet uzavretie

$$A \bullet B = (A \oplus B) \ominus B$$

\otimes hit-and-miss

$$A \otimes B = (A \ominus B_1) \cap (A^c \ominus B_2)$$

Farebná morfológia

Šedotónový obraz

$$X = \{ f(\mathbf{a}; X(\mathbf{a})) \mid \mathbf{a} \in E_{n-1}, X(\mathbf{a}) \in \mathfrak{R} \cup \{\infty\} \cup \{-\infty\} \}$$

Dilatácia

$$(f \oplus h)(x, y) = \max_{(r,s) \in H} f(x-r, y-s) + h(r,s)$$

Erózia

$$(f \ominus h)(x, y) = \min_{(r,s) \in H} f(x+r, y+s) - h(r,s)$$

Farebný obraz

$$X = \{ f(\mathbf{a}; X(\mathbf{a})) \mid \mathbf{a} \in E_{n-1}, X(\mathbf{a}) \in \mathfrak{R}^3 \cup \{\infty\} \cup \{-\infty\} \}$$

min/max ???

Multivariate ordering

- Ako nájsť inf/min a sup/max vektorov ?

$$x_1 = (1, 1)$$

$$x_2 = (5, 3)$$

$$x_3 = (9, 2)$$

$$x_4 = (3, 3)$$

$$x_5 = (5, 4)$$

$$x_6 = (6, 5)$$

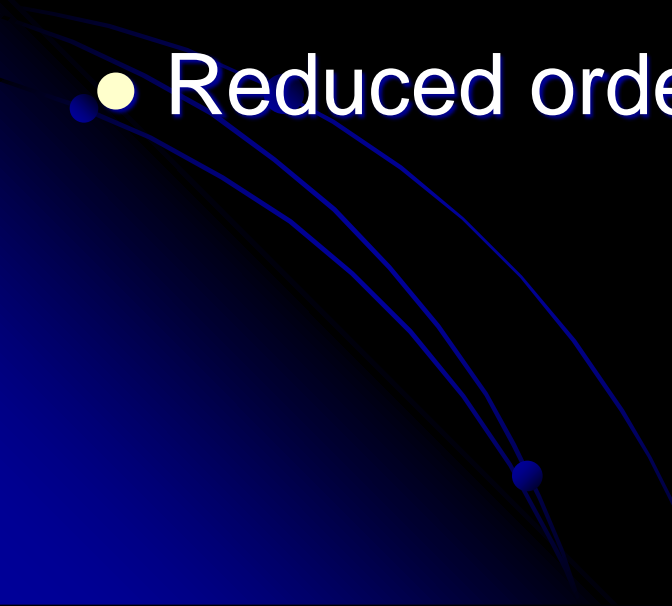
$$x_7 = (6, 8)$$

Min/max



?

Multivariate ordering

- Marginal ordering – M-ordering
 - Conditional ordering – C-ordering
 - Partial ordering – P-ordering
 - Reduced ordering – R-ordering
- 

Multivariate ordering

Marginal ordering – M-ordering

- Usporiadam jednotlivé zložky

$$x_1 = (1, 1)$$

$$x_2 = (5, 4)$$

$$x_3 = (9, 2)$$

$$x_4 = (3, 3)$$

$$x_5 = (5, 3)$$

$$x_6 = (6, 5)$$

$$x_7 = (6, 8)$$

$$1 \ 1$$

$$3 \ 2$$

$$5 \ 3$$

$$5 \ 3$$

$$6 \ 4$$

$$6 \ 5$$

$$9 \ 8$$

$$X_{\min} = (1, 1)$$

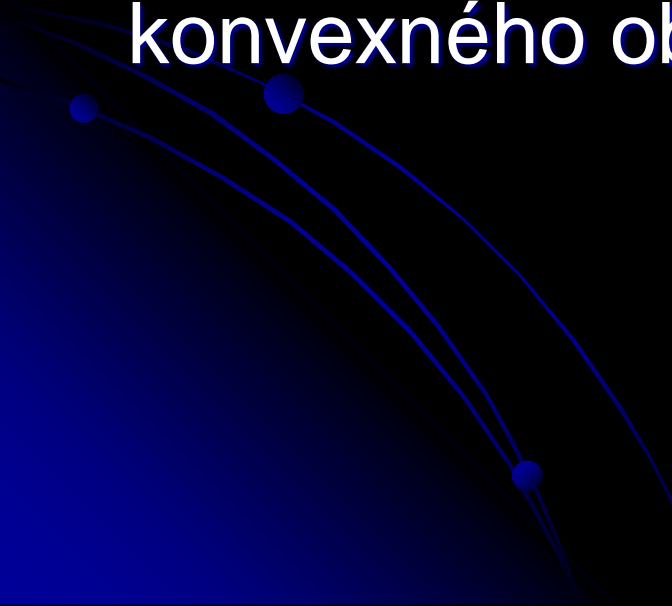
$$X_{\max} = (9, 8)$$

Môžu vzniknúť nové vektory!

Multivariate ordering

Partial ordering – P-ordering

Dáta sa rozdelia do podmnožín pomocou postupného vytvárania minimálneho konvexného obalu dát



Multivariate ordering

Reduced ordering – R-ordering

- Zredukujem vektor do skalára redukčnou funkciou

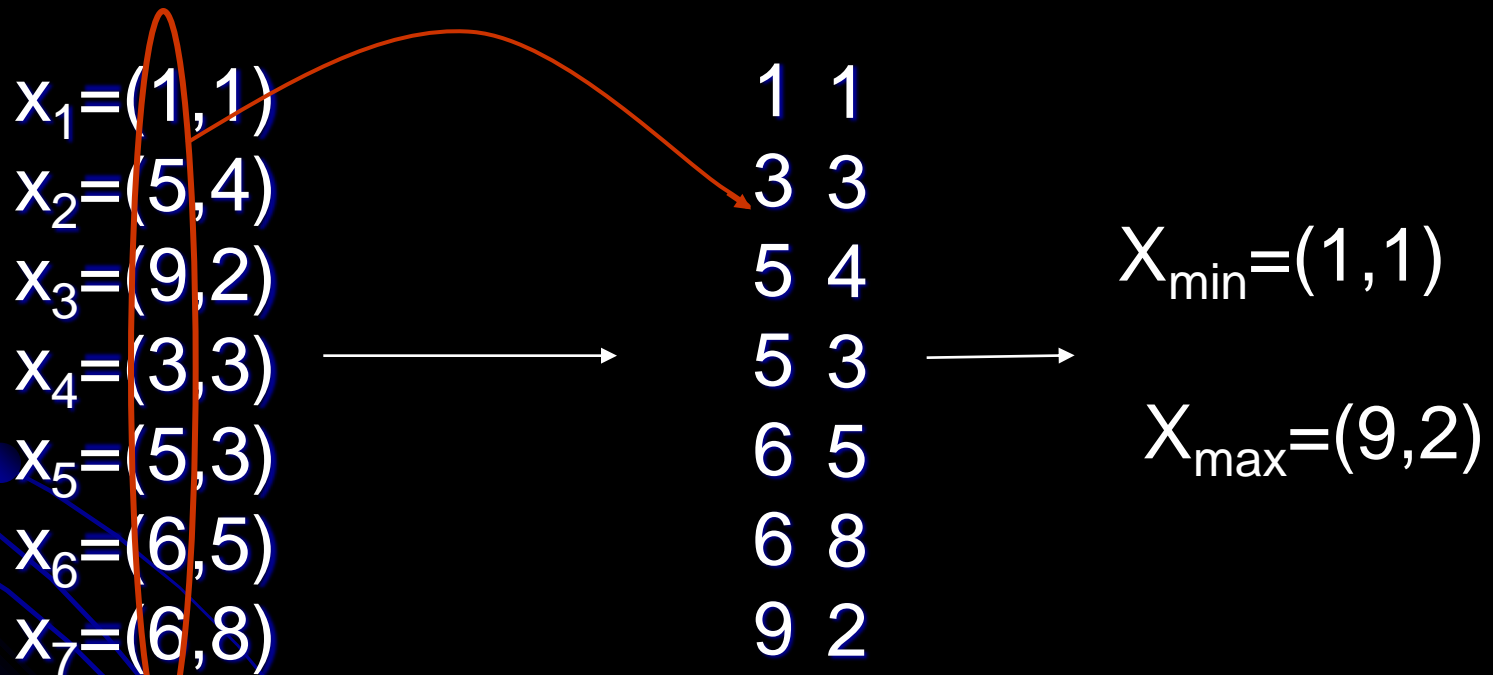
			usporiadam			
$x_1=(1,1)$		4,83		0,30		(5,4)
$x_2=(5,4)$	$q_i = \frac{x_i - \bar{x}}{s}$	0,30		0,70		(5,3)
$x_3=(9,2)$	$\bar{x} = \frac{1}{n} \sum_{i=1}^n x_i$	4,35		1,64		(6,5)
$x_4=(3,3)$		2,12	→	2,12	→	(3,3)
$x_5=(5,3)$	$\bar{x} = 3.7$	0,70		4,35		(9,2)
$x_6=(6,5)$		1,64		4,41		(6,8)
$x_7=(6,8)$		4,41		4,83		(1,1)
						$X_{\min}=(5,4)$
						$X_{\max}=(1,1)$

Vhodné na identifikáciu odľahlých bodov - outlier.

Multivariate ordering

Conditional ordering – C-ordering

- Usporiadam podľa **prvej** zložky



Nevytvára nové vektory.

Predpokladá že prvá zložka nesie najviac informácie.

Conditional ordering – C-ordering

lexikografické usporiadanie

$$(a_1, b_1, c_1) < (a_2, b_2, c_2) \quad \text{if} \quad \begin{cases} a_1 < a_2 \\ \text{or} \\ a_1 = a_2 \quad \text{and} \quad b_1 < b_2 \\ \text{or} \\ a_1 = a_2 \quad \text{and} \quad b_1 = b_2 \quad \text{and} \quad c_1 < c_2 \end{cases}$$

- Kládne dôraz na poradie zložiek
- Predpokladá že najviac informácie obsahuje prvá zložka podľa ktorej triedime
- Vylepšenie použitím napríklad PCA

Variácie lexikografického usporiadania

α – lexikografické usporiadanie

$$\forall \mathbf{v}, \mathbf{v}' \in \mathbb{R}^n, \mathbf{v} < \mathbf{v}' \\ \iff \begin{cases} v_1 + \alpha < v'_1, & \text{or} \\ v_1 + \alpha \geq v'_1 & \text{and } [v_2, \dots, v_n]^T <_L [v'_2, \dots, v'_n]^T \end{cases}$$

kde $\alpha \in \mathbb{R}^+$

Presúva porovnanie častejšie na druhú zložku

Variácie lexikografického usporiadania

- α -trimmed lexicographical extrema

Hľadám max z k vektorov:

Usporiadam podľa 1. zložky a nechám si iba $\alpha \times k$ vektorov kde $\alpha \in [0,1]$ novú množinu vektorov usporiadam podľa 2. zložky

- α -modulus lexicographical ordering

$$\forall v, v' \in \mathbb{Z}^n,$$

$$v < v' \iff \lceil [v_1/\alpha], v_2, \dots, v_n \rceil^T <_L \lceil [v'_1/\alpha], v'_2, \dots, v'_n \rceil^T$$

Farebná morfológia

Sekvenčný prístup:
Jednotlivé kanály samostatne

Intenzita R,G,B – min/max

Lab, HSV – L, S, V – OK

H, a, b – červená > zelená ???

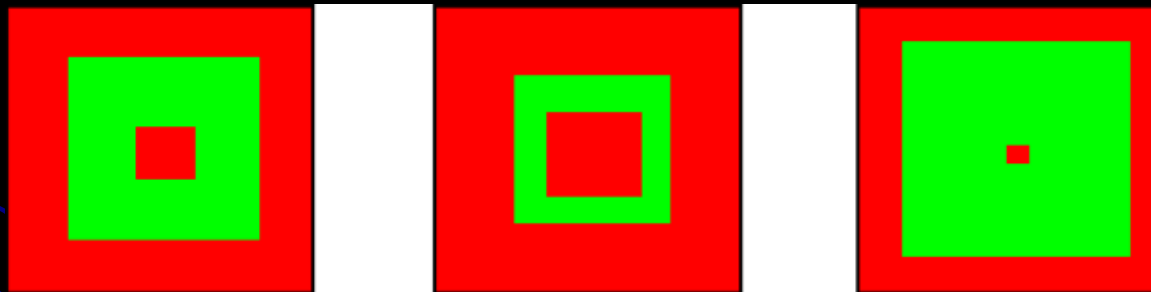
Problém?

$(R \oplus C, G \oplus C, B \oplus C)$

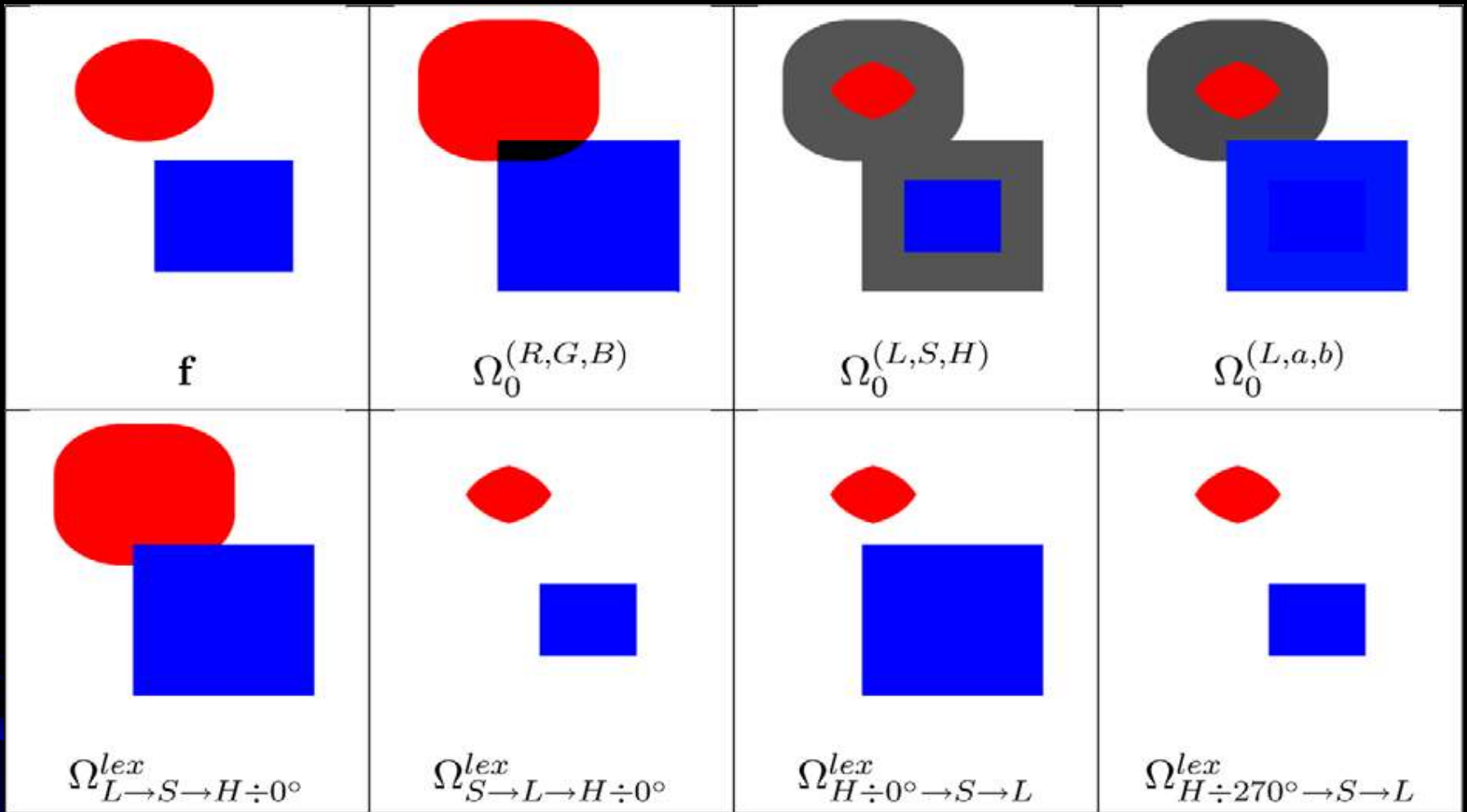
Farebná morfológia

$$\varepsilon_H f(\mathbf{x}) = \{\mathbf{c}_j : D(H_j, H_0) = \sup [D(H_i, H_0)], \mathbf{c}_i \in B_{\mathbf{x}}\}$$

$$\delta_H f(\mathbf{x}) = \{\mathbf{c}_j : D(H_j, H_0) = \inf [D(H_i, H_0)], \mathbf{c}_i \in B_{\mathbf{x}}\}$$



Original image (left), results of applying a vectorial dilation based on a lexicographical ordering (R->G->B, middle) (G->R->B, right) with a 21 x 21 square SE.



Comparison of colour erosion for the image f (the structuring element B is a square of size $n = 35$), $\varepsilon_{\Omega, n_B}(f)$, using different orderings Ω : 3 examples of marginal orderings Ω_0 in the RGB, LSH and $L^*a^*b^*$ colour spaces and 4 examples of total lexicographic-based orderings Ω^{lex} in LSH giving the priority to the L, or to S, or to h_0 -centred H (origins in the red 0 and in the purple 270).



The erosion and dilation results of a part of the macaws image with a square shaped SE of size 9 x 9 pixels, using a-modulus lexicographical ordering (in HSL color space)