

SCHEMAS

Definition: $s = s_1 \dots s_i$ with $s_i = 0, 1$ or $*$

- Schema s represent a subset of D
- Ex: $o(s)$ = number of defined bit and $s=01*1* \Rightarrow s$ contains $2^{(l-o(s))}$ chromosomes

S	0	1	*	1	*
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$X \in S$	0	1	0	1	0
			1		1

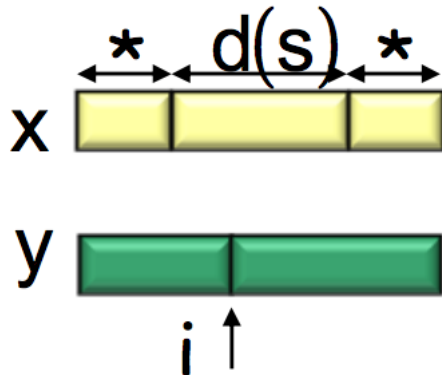
- A chromosomes belong to 2^i schema

SCHEMA THEOREM

- provide estimate of number of schemas during evolution
- Def : Population P , size n , at time t , schema s . $m(s,t)$ = number of chromosomes of s in P at time t
- Analysis schema change after GA
- **Selection:** $u^i(s,t)$ average value $f(x)$ over s . So good schema \Rightarrow ratio is high ~ 1

$$= \left[\frac{\hat{u}(s,t)}{\bar{f}(t)} \right] m(s,t)$$

- **Crossover:** prob p_c and $(1-p_c)$ just copied
+ $d(s)$ max dis between defined binary (between 2 *)



- + x is schema. If i outside $d(s)$ = **schema reserve** (at least 1) else possible both offspring are not in s and **schema is destroyed**
- + probability that chromosomes does not produce a chromosomes of s **at most** $p_c \cdot d(s) / (l-1)$ (l is length of representation of s)
- + remain chromosomes after crossover

$$E(m_2(s, t)) \geq \left(1 - p_c \frac{d(s)}{l-1}\right) m_1(s, t)$$

- **Mutation:**
- $o(s)$ = number of defined bit. p_m mutation prob
- x mutated belongs to $s \Rightarrow$ survival prob $s_m(s) = (1 - p_m)^{o(s)}$

$$E(m(s, t + 1)) \geq m_2(s, t) \cdot [1 - p_m]^{o(s)}$$

FINALLY,

$$E(\underbrace{w(z, f + J)}_{f+J}) \geq \underbrace{w(z, f)}_f \cdot \underbrace{\frac{f(f)}{q(z, f)}}_{\leq J} \cdot \underbrace{\left[1 - b^c \frac{l-J}{q(z)}\right]}_{\leq J} \cdot \underbrace{[1 - b^w]_{o(z)}}_{\leq J}$$

- Evolution will **increase** the size of **good schema**. (average $f(x)$ of $s \gg \gg$ average $f(x)$ of Population)

The N^3 Argument

Theorem: Under reasonable assumptions, random population of size N **sample N^3 schemas** (100 chromo \Rightarrow 10^6 schemas)

Demonstration:

- let s be a schema of k -order (k defined bits), 2^{l-k} chromosomes, 2^{l-k} belong to $s \Rightarrow$ random N chromosomes, $N \cdot 2^{l-k}$ belongs to s
- k is **highest order** of schema which is represented in population of size N , schema of k -order has **least θ copies (number of chromosomes / $\theta \leq \text{combination}(L, k)$)**. $\Rightarrow N / \theta = 2^k$ (number of ways to assign value to k defined bits)
- now need to show that number of schema of order $k > N^3$ (hypothesis) $\Leftrightarrow 2^k \text{combination}(L, k) \geq (2^k / \theta)^3$