

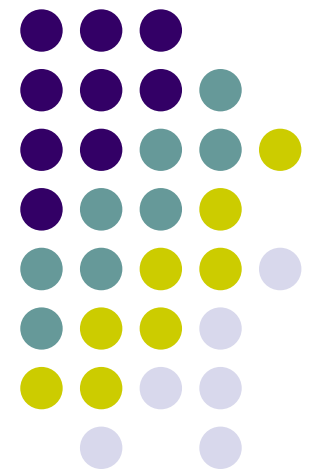
# CS257

## Introduction to Nanocomputing

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Undifferentiated NW Decoders

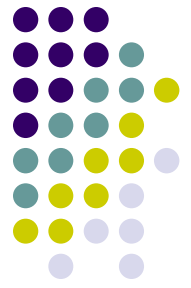
John E Savage



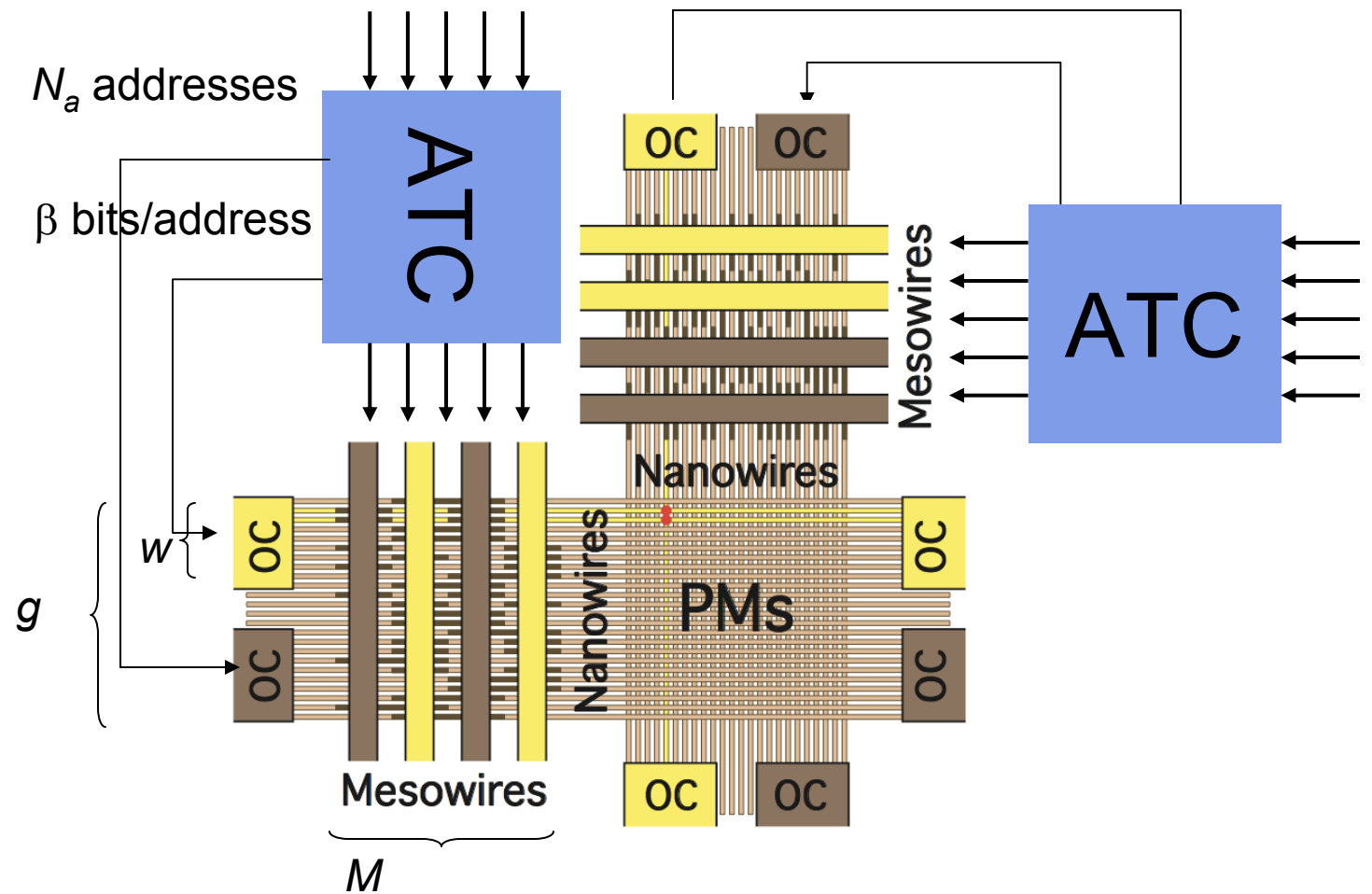


# Lecture Outline

- Two undifferentiated NW Decoders
  - Randomized-contact decoder
  - Randomized mask-based decoder
- Analysis of “Take What You Get”



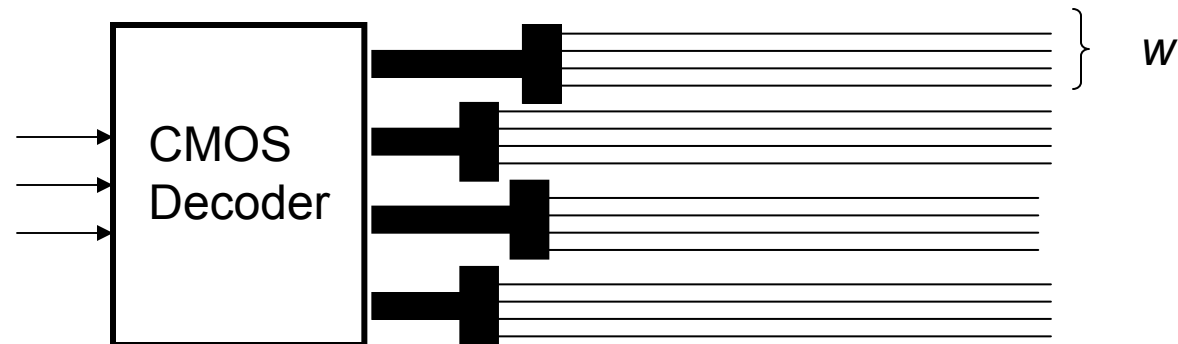
# The Crossbar Memory





# Reducing the Area of the ATC

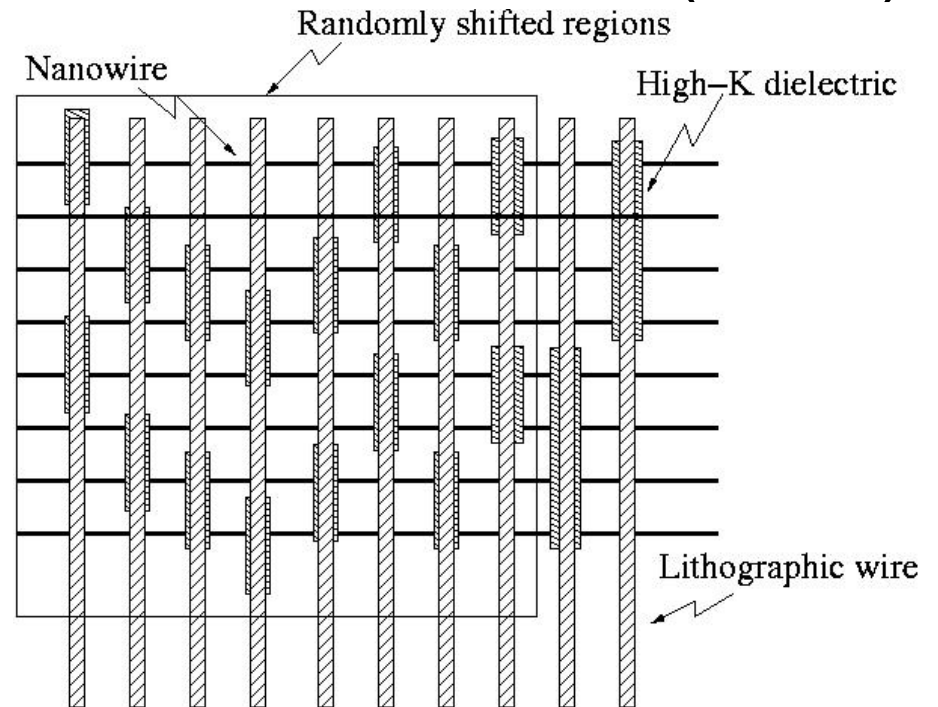
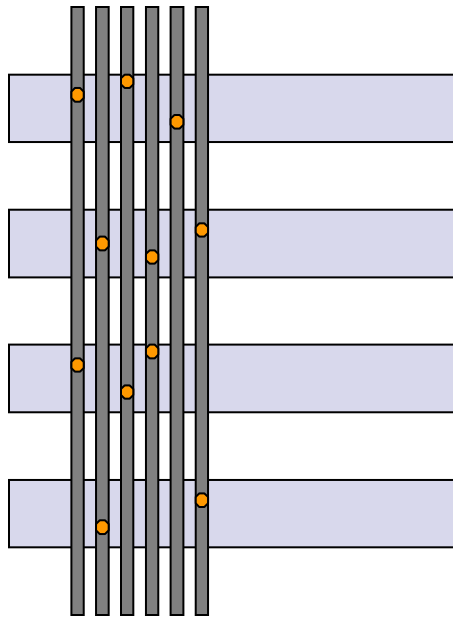
- The ATC has one word for each of the  $N_a$  addressable NWs.
- Area of the ATC can be reduced by storing inputs to a CMOS decoder, not one bit per contact group.





# How to Differentiate NWs?

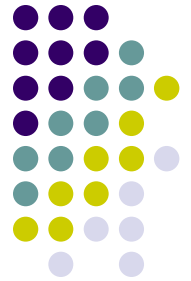
- Randomized-contact decoder (RCD)
- Randomized mask-based decoder (RMD)



# Codewords Assigned During Decoder Assembly



- RCD and RMD both assign codewords stochastically.
  - In RCD codeword bits are uncorrelated
  - In RMB codeword bits are correlated.
- What effect does correlation among codeword bits have on the number of MWs needed to ensure that all codewords are individually addressable?

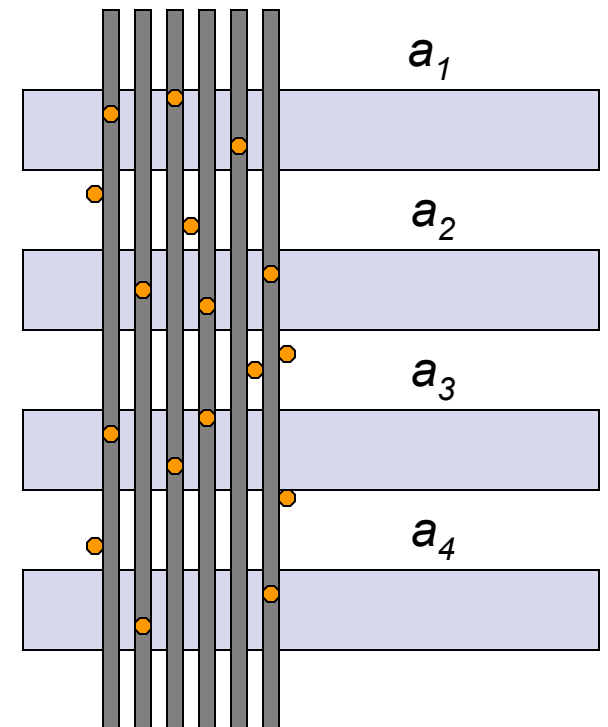


# Randomized-Contact Decoder

# Randomized-Contact Decoder



- Contacts made at random between NWs and MWs.
- If contact made, MW controls NW, i.e. NW resistance is increased.
- Control of NW may not be complete, source of error.



# Issues in Assembling NW Decoders



- NW decoders are assembled stochastically.
- Can't predict which NW addresses will occur.
- Some NWs cannot be controlled.
- Under what conditions can many NWs be addressed?
  - What's the probability that a decoder has  $N_a$  addressable NWs?
  - How do  $N_a$  and probability depend on addressing strategy?

# Ideal and Non-Ideal Decoder Models



- If NW is controlled, uncontrolled, ambiguous by  $j^{th}$  MW,

$$c_j = 1, 0, e$$

- NW codeword  $\mathbf{c} = (c_1, c_2, \dots, c_M)$
- Ideal (non-ideal) resistive model
  - $c_j = 1$  if resistance =  $\infty$  ( $> r_{high}$ ) when  $j^{th}$  MW active
  - $c_j = 0$  if resistance =  $0$  ( $< r_{low}$ ) when  $j^{th}$  MW active
  - $c_j = e$  (error) otherwise.



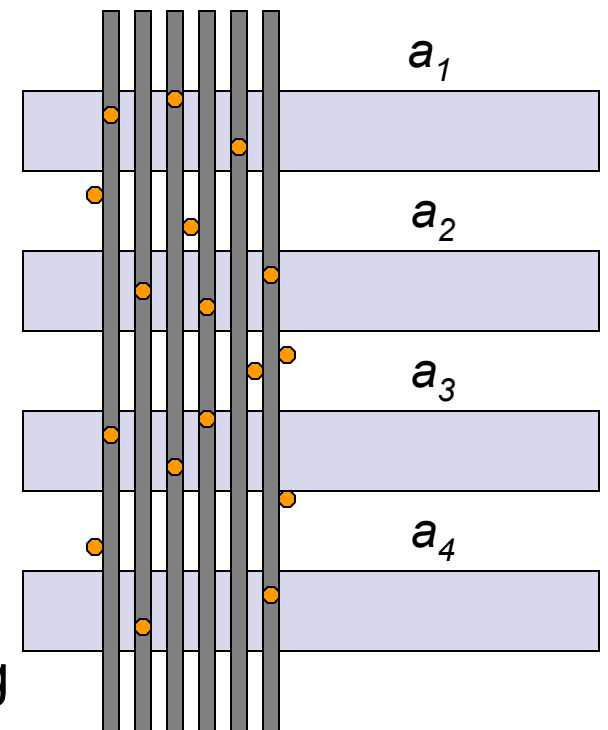
# NW Addressability

- MW address
  - $\mathbf{a} = (a_1, a_2, \dots, a_M)$  where  $a_j = 1$  if  $j^{\text{th}}$  MW is active
  - NW is “on” if its resistance is “low.”
  - A set of NWs is “off” if cumulative resistance is “high.”
- A NW is **individually addressable** (i.a.) if for some address  $\mathbf{a}$  it is “on” & all others are “off.”
- In ideal model, codeword  $\mathbf{c}$  activated by address  $\mathbf{a} = \bar{\mathbf{c}}$  (Boolean complement).

# History of the Randomized-Contact Decoder (RCD)



- Kuekes and Williams 2001 patent.
- Hoggs, *et al* (IEEE Trans. Nano, March 2006)
  - Analyzed idea using simulation & empirical analysis
- Our contributions
  - Tight probabilistic analysis of RCD.
  - Application to decoder with errors.
  - Identification of a very good addressing strategy.



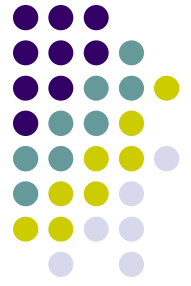
[Nanowire Addressing with Randomized-Contact Decoders](#)<sup>1</sup>, Eric Rachlin, John E. Savage, Proc. IEEE/ACM Int. Conf. on Computer-Aided Design (ICCAD), pp. 735-742, 2006.



# RCD Model

- $g$  contact groups,  $w$  NWs/group,  $N = gw$  NWs
- $N_a$  = number of i.a. NWs
- Calculate probability that  $N_a$  NWs are i.a.
  - $p$  = probability a MW controls a NW
  - $q$  = probability a MW doesn't controls a NW
  - $r = 1-p-q$  = probability error in MW controlling NW
  - An error occurs if MW control is uncertain.

# Three Decoder Addressing Strategies



- **All Wires Addressable (AWA)**
  - In every contact group all wires are i.a.
- **All Wires Almost Always Addressable (AWA<sup>3</sup>)**
  - Most contact groups satisfy AWA.
- **Take What You Get**
  - Use all i.a. NWs in all contact groups.
- Determine  $N_a$ , number of i.a. NWs
- Use  $N_a$  to calculate area of ATC.



# Hoeffding's Inequality

- Analyze number of different NW codewords using Hoeffding's Inequality. Let  $S = n_1 + \dots + n_t$  where  $\{n_i\}$  are ind. r.v.s in  $a_i \leq n_i \leq b_i$ . For  $d > 0$  and  $c_i = b_i - a_i$ .

$$P(E[S] - S \geq d) \leq e^{-2d^2 / \sum c_i^2}$$



# “Take What You Get” Strategy

$$P(E[S] - S \geq d) \leq e^{-2d^2 / \sum c_i^2}$$

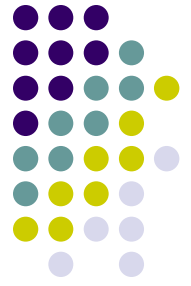
**Theorem** Let  $N_a$  be total no. addressable NWs in a decoder with  $g$  contact groups,  $w$  NWs per group, and  $N = gw$  NWs.

$$P(N_a \leq E[N_a] - Nk) \leq e^{-2k^2 Nw / (w-1)^2} = e^{-2k^2 g^*}$$

for  $k > 0$  and  $g^* = g(w/(w-1))^2$ .

**Proof** Let  $t = g$ ,  $d = Nk$ ,  $S = N_a$ ,  $c_i = (w-1)$  and  $B$  be lower bound to  $E[N_a]$ . Set  $\kappa N = B - kN$

# Bounds on Addressable Wires Using Hoeffding's Inequality



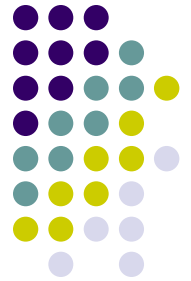
**Theorem** Let  $N_a$  be the no. of addressable NWs in an RCD with  $g$  contact groups,  $w$  NWs per group, and  $N = gw$  NWs in total. If  $\kappa \leq 1 - \sqrt{-\ln(\epsilon/(2g^*))} - (w-1)(1-pq)^M$ ,

$$P(N_a > \kappa N) \geq 1 - \epsilon$$

**Proof**  $k = B/N - \kappa$ . Set  $\kappa$  such that  $e^{-2k^2g^*} = \epsilon$

To bound  $E[N_a]$  let  $x_j = 1$  if  $n_j$  is i.a., else 0. Event  $e_{k,j}$  is true if  $n_k$  is on whenever  $n_j$  is on. Thus,  $n_j$  is not i.a. if  $e_{k,j}$  is true for some  $k$  not  $j$ .  $E[N_a] = gw P(x_j = 1)$ .

# Bounds on Addressable Wires Using Hoeffding's Inequality



**Proof (cont.)** But  $P(x_1 = 1) = 1 - P(x_1 = 0)$ .

$$\begin{aligned} P(x_1 = 0) &= P(e_{2,1} \cup e_{3,1} \cup \dots \cup e_{w,1}) \\ &\leq P(e_{2,1}) + \dots + P(e_{w,1}) = (w-1)P(e_{2,1}). \end{aligned}$$

But  $P(e_{2,1}) = (1-pq)^M$ . Thus,

$$P(x_1 = 1) \geq 1 - (w-1)(1-pq)^M \text{ and}$$

$$\begin{aligned} E[N_a] &\geq B = gw (1 - (w-1)(1-pq)^M) \\ &= N (1 - (w-1)(1-pq)^M) \end{aligned}$$

$$\text{or } \kappa \leq 1 - \sqrt{-\ln(\varepsilon/(2g^*))} - (w-1)(1-pq)^M.$$



# “Take What You Get” Strategy

**Note:** Let  $p = q = \frac{1}{2}$ ,  $w = 8$ ,  $g = 175$ ,  $N = 1,400$ ,  $\varepsilon = .01$ , and  $\kappa = .733$ .

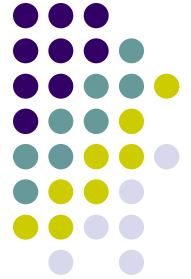
Since  $g^* = g \frac{(w/(w-1))^2}{\sqrt{-\ln(\varepsilon/(2g^*))}}$  the following condition

$$\kappa \leq 1 - \sqrt{-\ln(\varepsilon/(2g^*))} - (w-1)(1-pq)^M$$

is satisfied with  $M = 13$  and  $\kappa N = 1027$ .

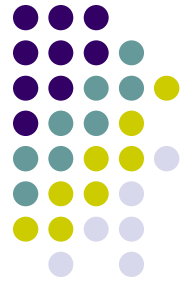
- That is,  $N_a \geq 1,027$  with probability  $\geq .99$  when starting with 1,400 NWs,  $w = 8$ ,  $M = 13$ .

# Bounds for Other Strategies



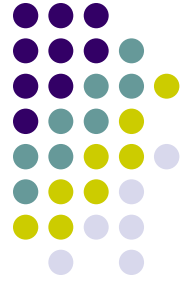
See paper.

# Comparison of Addressing Strategies



- Assumptions
  - Area of ATC used to make comparisons
  - Error-free comparisons ( $p+q = 1$ )
  - Goal – obtain about  $N_a = 1,000$  addressable NWs.
- **All Wires Addressable**
  - In every contact group all wires are i.a.
- **All Wires Almost Always Addressable**
  - Only use contact groups in which all wires are i.a.
- **Take What You Get**
  - Use all i.a. NWs in all contact groups.

# Comparison of Addressing Strategies



- Strategies
  - All Wires Addressable (AWA)
    - $N_a = 1,024$  for  $M = 47$ ,  $g = 128$ ,  $N = 1,024$ .
  - All Wires Almost Always Addressable (AWA<sup>3</sup>)
    - $N_a = 1,024$  for  $M = 30$ ,  $g = 133$ ,  $N = 1,064$ .
  - Take What You Get (TWYG)
    - $N_a = 1,027$  for  $M = 13$ ,  $g = 175$ ,  $N = 1,400$ .
- Which strategy is best?
  - Second better than first. Is third better than 2<sup>nd</sup>?

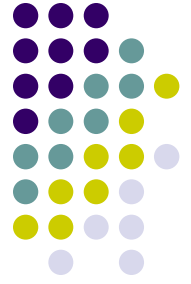


# Area Estimates

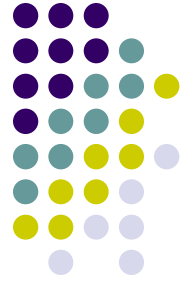
- Area of crossbar
  - ATC –  $\rho N_a (M + \log_2 g)$ ,  $\rho$  = area of a CMOS bit
  - Standard decoder –  $\lambda_{meso}^2 g \log_2 g$
  - NWs + MW area –  $(M \lambda_{meso} + N \lambda_{nano})^2$
  - Assume  $\lambda_{meso} = 10 \lambda_{nano}$ ,  $\rho = 100 \lambda_{nano}^2$
- Area Comparisons Between AWA, AWA<sup>3</sup>, TWYG
  - Can ignore area of standard decoders
  - ATC: AWA  $\gg$  AWA<sup>3</sup>  $\gg$  TWYG
  - NWs + MW area: AWA  $>$  AWA<sup>3</sup>; TWYG  $>$  AWA, AWA<sup>3</sup>
  - However, sum of areas is smallest for TWYG.

# Take What You Get Strategy

## RCD vs Uniform NW Decoders



- RCD
  - $N_a = 1,027$  for  $M = 13$ ,  $g = 175$ ,  $w = 8$ .
- Encoded NW Decoder
  - $M/2$ -hot NWs (with .8 penalty for misalignment)
    - $N_a = 1,033$  for  $M = 8$ ,  $g = 180$ ,  $w = 8$ .
  - Core-shell NWs (no misalignment penalty)
    - $N_a = 1,013$  for  $M = 12$ ,  $g = 190$ ,  $w = 8$ .
- RCD competitive ( $M$  is reasonable).



# The Effect of Faults

- The effect of faults measured by  $r = 1-(p+q)$ .
- $M$  set so  $\kappa = 1 - \sqrt{-\ln(\epsilon/(2g^*))} - (w-1)(1-pq)^M = .733$
- Number of MWs for **Take What You Get**

$$M \geq \frac{-\ln(\kappa - \sqrt{-\ln(\epsilon/2g^*)})}{-\ln(1-pq)}$$

- Errors change  $M$  by factor  $\ln(3/4)/\ln(1-pq)$ .

$p = q$	$\alpha$	$M$
.5	1	13
.4	1.69	22
.3	1.82	40



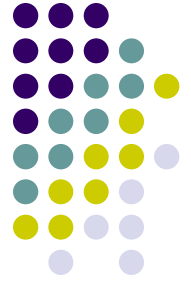
# Conclusions About RCDs

- An area efficient NW RCD addressing strategy identified.
- Analysis shows the impact of faults.
- RCD shown to be a competitive decoder.
  - May be easier to implement than other methods.
- Because **Take What You Get** needs no more than  $M = 13$ , simulation is possible.
  - Simulation shows that  $M \approx 10$  suffices!
- The importance of analysis firmly established.

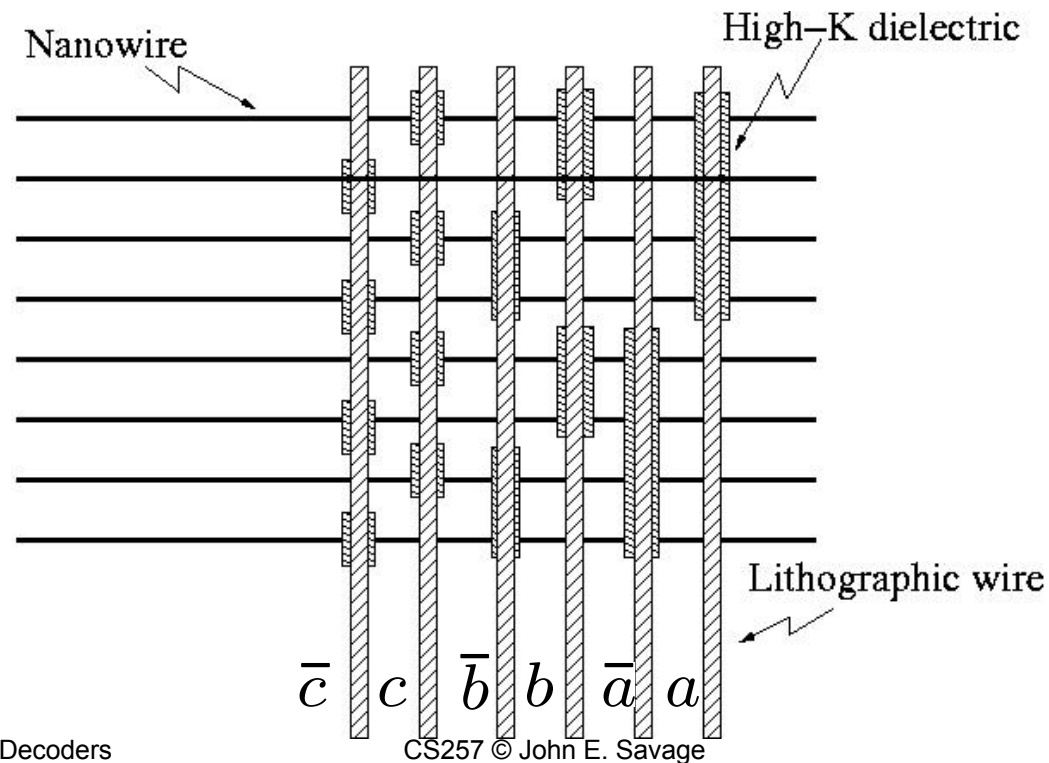


# Randomized Mask-Based Decoder

# Logarithmic Mask-Based Decoder



- High-K dielectric regions couple NWs & MWs
- Deposit high-K dielectric regions under MWs



# Problems with Logarithmic Mask-Based Decoder



- Can't make regions as small as NW pitch
  - Lithography can't reach nm dimensions
- Can't position regions deterministically
  - At nanometer scales, positional inaccuracy is large
  - Inaccuracy is fractions to multiples of a NW pitch
- Approach: exploit natural randomness



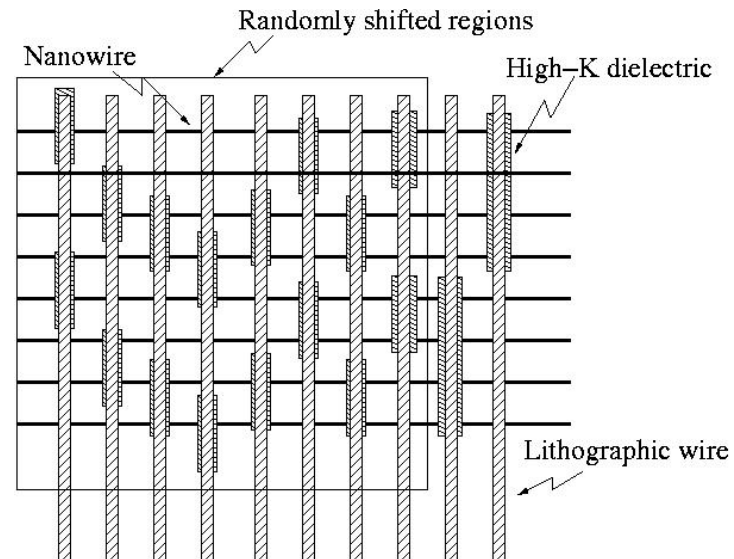
# Role of Logarithmic Decoder

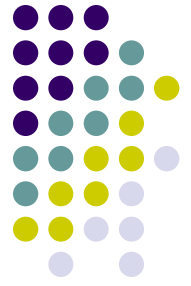
- Use standard decoder to resolve uncertainty from  $N$  NWs to sets of  $w$  NWs.
  - #MWs =  $2 \log_2 (N/w)$  for mask-based decoder
- Use randomized *linear* decoder (coming) to resolve decoding down to one NW.
  - Method can guarantee success to within some predetermined probability



# Randomized Linear Decoder

- Randomly shift smallest litho regions (LRs).
  - Placement of LRs via masks is random
- $w$  is width and separation of LRs.
  - $w$  is fixed!

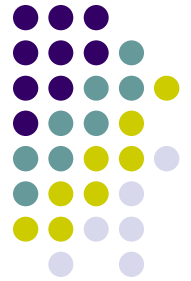




# Model of Linear Decoder

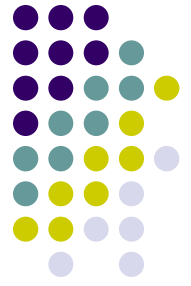
- Deterministic logarithmic decoder resolves set of conducting NWs down to  $2w$  NWs
  - It deterministical leaves  $2w$  NWs conducting
  - The remaining NWs are non-conducting
- Random linear decoder resolves uncertainty down to one NW with high probability
  - It uses multiple randomly displaced LRs

# Controllability of NWs by MWs Due to Placement of LRs



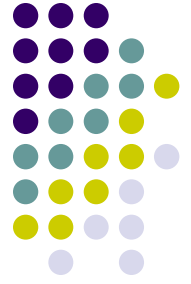
- A NW region is **controllable** by a MW if an LR under it covers the NW enough so a MW field can turn it off
- A NW region is **noncontrollable** by a MW if an LR under the MW doesn't cover the NW enough that a MW field can turn it off
  - This condition can be avoided by making LRs long enough
- A NW region is **ambiguous** w.r.t. a MW if it is neither controllable or noncontrollable.

# Conditions for Individually Controllable Linear Decoder NWs

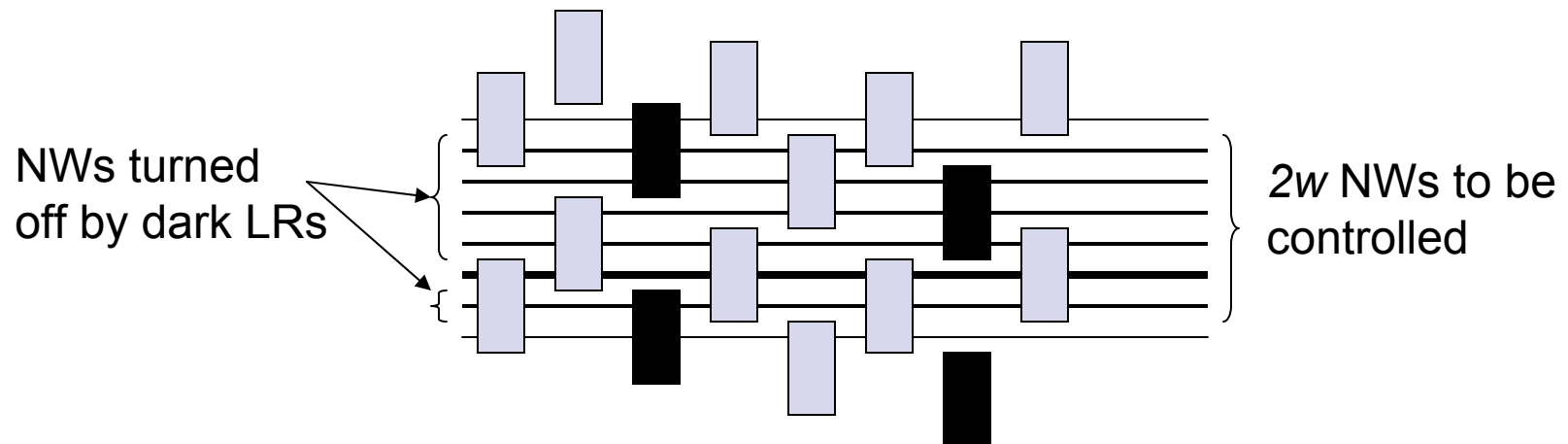


- Under what conditions can a NW be turned on without turning on other NWs?
  - Let  $I_{a,j}$  be intersection between NW  $n_a$  and MW  $j$ .
  - Let  $C(I_{a,j}) = 0$  ( $1$ ) if MW  $j$  can (cannot) control  $n_a$ .
- Let  $J_a = \{j \mid C(I_{a,j}) = 0\}$
- If  $J_a \subseteq J_b$  and  $n_a$  is on, then  $n_b$  must also be on
- Thus, all NWs can be individually addressed if for no two NWs  $n_a$  and  $n_b$  is  $J_a \subseteq J_b$

# Restating Controllability Conditions



- When are all  $2w$  NWs controllable?
  - $J_a \subseteq J_b$  cannot hold if there are top and bottom ends of LRs between every pair of NWs.
  - For any NW, all NWs above it can be turned off (see dark LRs). Same for NWs below given NW.

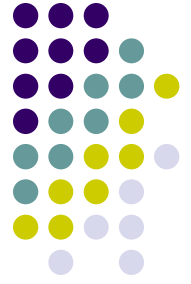




# Coupon Collector Problem

- C coupon types
- Each box equally likely to contain any type of coupon
- How many boxes should be purchased to collect all C coupons with probability at least  $1-\epsilon$ ?

# Equivalence to Coupon Collector Problem



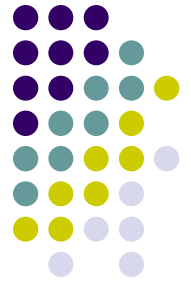
- LR top (bottom) endpoint coupons:
  - A coupon corresponds to the space between a pair of consecutive NW.
  - There are  $2w-1$  top (bottom) endpoint coupons
- Failure coupon:
  - Failure corresponds to an ambiguous NW, which occurs when an LR endpoint lands on a NW
  - $p_f$  is probability of failure



# LR Displacement Model

- Simple model for the randomized mask-based decoder:
  - The LRs are equally likely to fall anywhere.
  - $p_f \approx 0.5$  and  $p_s = 1 - p_f \approx 0.5$
  - Probability that  $i$ th coupon collected  $p_i = (1 - p_f)/C$
  - $C = 2w - 1$ , the number of consecutive NW pairs

# Coupon Collector Problem with Failures



**Theorem** Let  $T$  = number trials to ensure all  $C$  coupons collected with probability =  $1-\epsilon$  when trial fails with prob  $1-p_s$  and  $i$ th coupon collected with prob  $p_i = p_s/C$ .  $T$  satisfies

$$\frac{C}{p_s(1+p_s/C)} \ln \left( \frac{C}{\epsilon(1+\epsilon)} \right) \leq T \leq \frac{C}{p_s} \ln \left( \frac{C}{\epsilon} \right)$$

- This result bounds # MWs in linear decoder.

# Performance of Mask-Based Decoder



- $2 \log_2 (N/(2w))$  MWs in logarithmic decoder
- Approx  $\frac{C}{p_s} \ln \left( \frac{C}{\epsilon} \right)$  MWs in linear decoder where  $C = 2w-1$ .
- Mask-based decoder uses  $M = 2 \log_2 (N/(2w)) + ((2w-1)/p_s) \log_2 (2w-1)/\epsilon$  MWs.
- When  $p_s = .5$ ,  $w = 10$ ,  $\epsilon = .01$ ,  **$M = 2 \log_2 N + 320$**  MWs needed to control  $N$  NW!
  - This improves to  $M = 156$  if we assume that standard decoder used for contact groups and we tighten bounds. (See [Analysis of Mask-Based Nanowire Decoders](#) 1, Eric Rachlin, John E. Savage, to appear IEEE Transactions on Computers, 2007.)