

# How the number of alleles influences gene autoregulation

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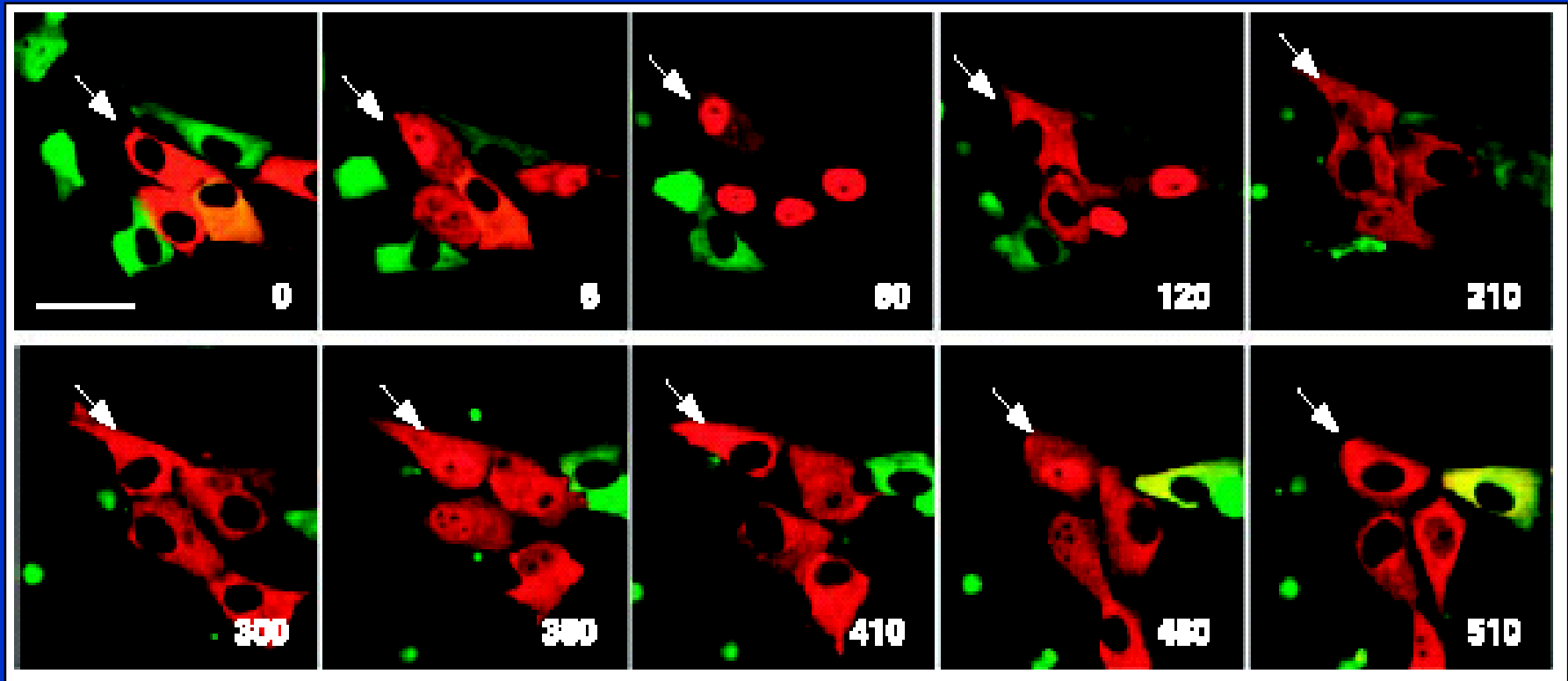
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Gliwice, Poland

# Single cell experiments

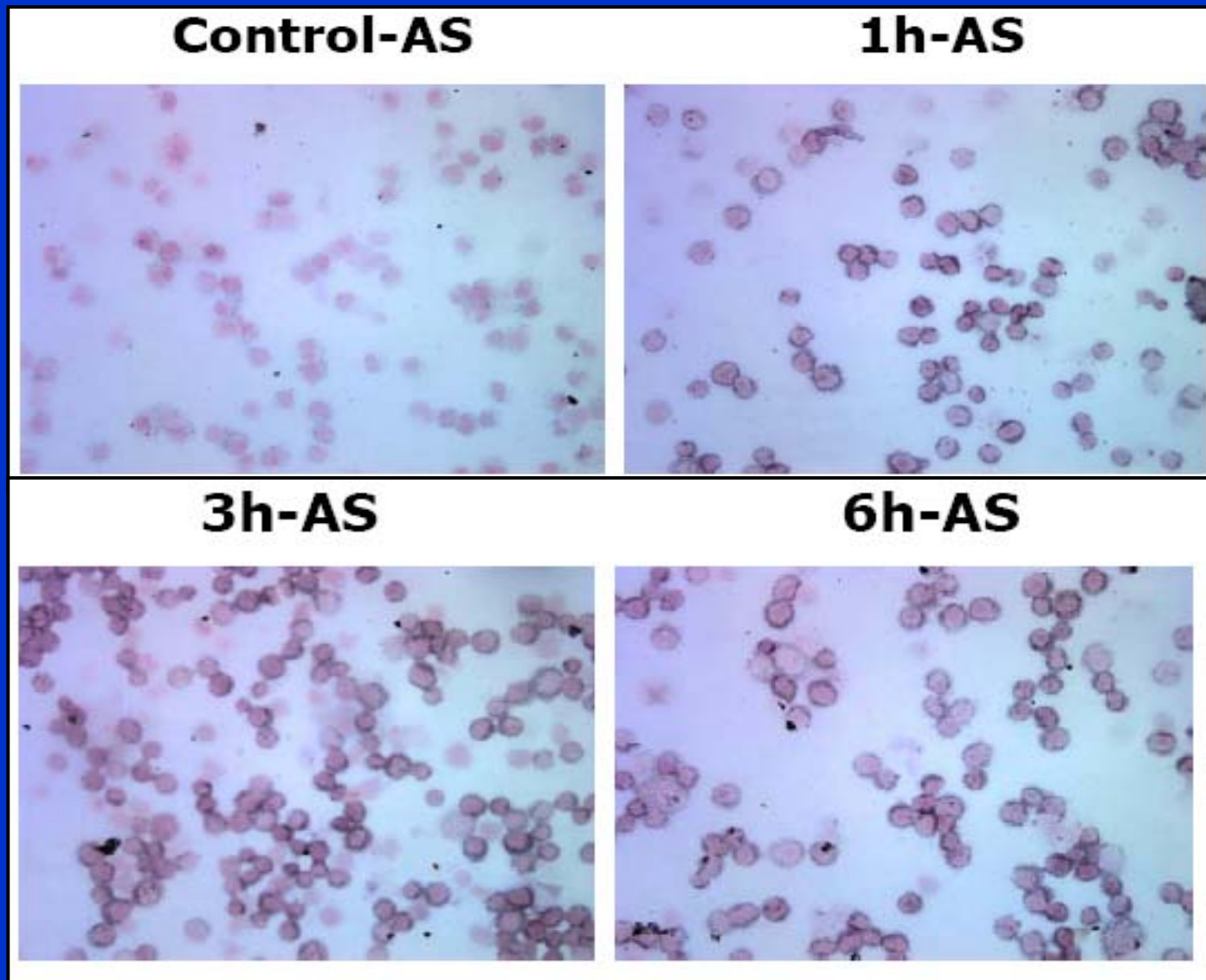
Nelson et al., Science 2004, Prof. M.R.H. White group (Liverpool)

Single cell experiment - immortal cancer cell line (SK-N-AS cells)



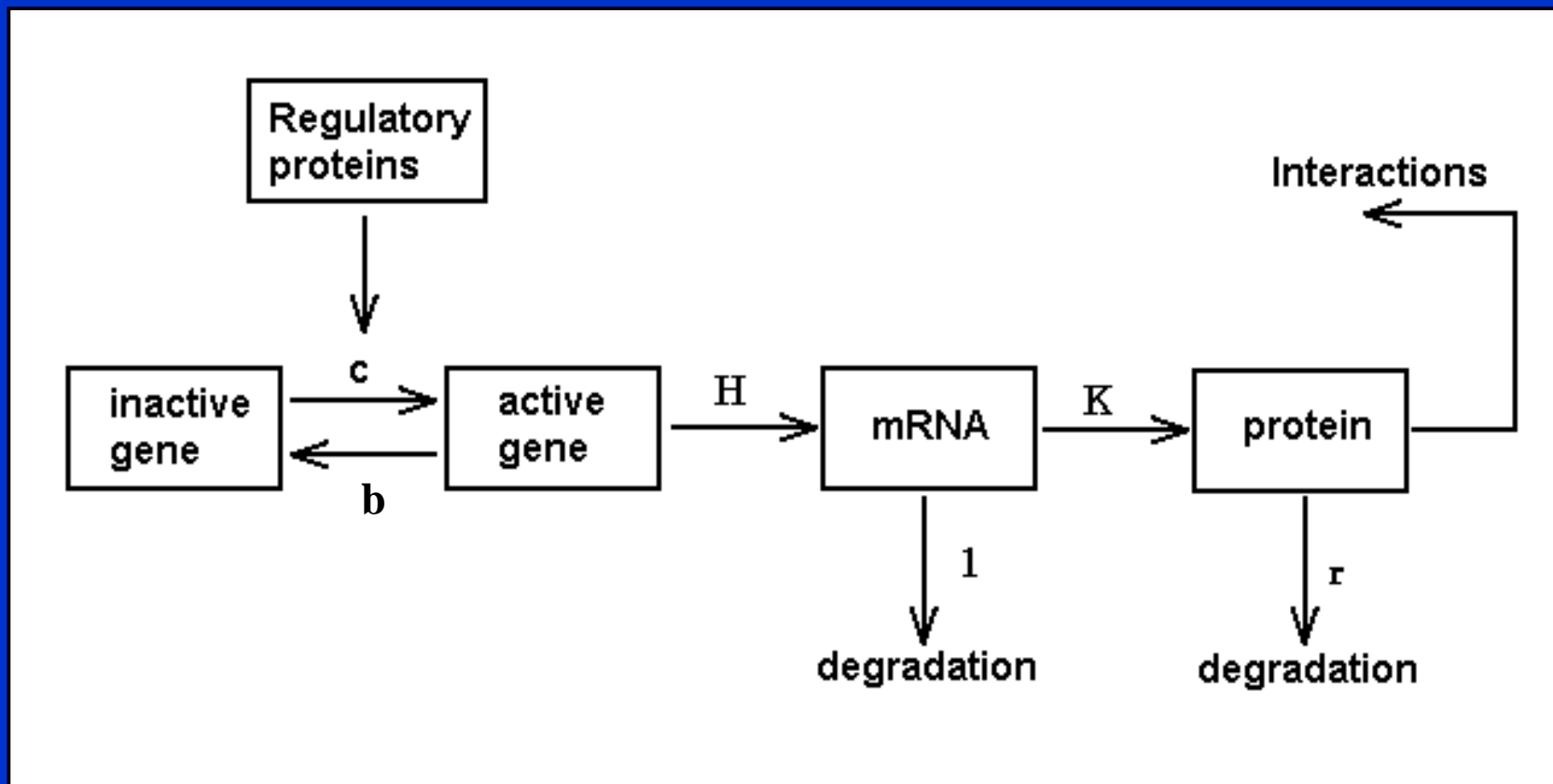
Cytoplasm - Nucleus oscillations of the red fluorescent protein NF- $\kappa$ B ,  
degradation and rebuilt of (green) I $\kappa$ B $\alpha$

## Single cell experiment - immortal cancer cell line (HeLa cells)



IL8 mRNA transcript after TNF treatment

# The main steps in gene expression



The number of molecules involved:

$$1 \leq DNA \leq mRNA \leq protein \leq 10^6$$

## The Aim of This Work

- How increase in number of gene alleles due to the cancer development or genome duplication in a cell cycle influences its regulation
- How the loss of one allele or its transcriptional inactivity can result in haploinsufficiency disease for autoregulated genes
- To deduce the behaviour of „normal” cells from experiments on the transfected cells
- Consequences for modeling. Can we approximate two-copy-gene system by one-copy-gene system?

# A single haploidal gene without feedback regulation



$$G(\mathbf{I}) = 0, \quad G(\mathbf{A}) = 1$$

$G$  - gene state

$H$  - transcription rate

$K$  - translation rate

$r$  - protein degradation rate

## Continuous approximation

$$\frac{dx(t)}{dt} = HG(t) - x(t)$$

$x(t) :=$  # of mRNA molecules

$$\frac{dy(t)}{dt} = Kx(t) - ry(t)$$

$y(t) :=$  # of protein molecules

## Probability density functions

$$f = f(x, y, t) = P(\# \text{ of mRNA} = x, \# \text{ of protein} = y, G(t) = 0)$$

$$g = g(x, y, t) = P(\# \text{ of mRNA} = x, \# \text{ of protein} = y, G(t) = 1)$$

The continuity equations for  $f(x, y, t)$  and  $g(x, y, t)$

$$\frac{\partial f}{\partial t} + \text{div}\left[f\left(\frac{dx}{dt}, \frac{dy}{dt}\right)\Big|_{G=0}\right] = byg - cf$$

$$\frac{\partial g}{\partial t} + \text{div}\left[g\left(\frac{dx}{dt}, \frac{dy}{dt}\right)\Big|_{G=1}\right] = -byg + cf$$

$$\frac{\partial f}{\partial t} - \frac{\partial}{\partial x}(xf) + r \frac{\partial}{\partial y}((Kx - ry)f) = byg - cf$$

$$\frac{\partial g}{\partial t} + \frac{\partial}{\partial x}((H - x)g) + r \frac{\partial}{\partial y}((Kx - ry)g) = -byg + cf$$

# Haploidal gene with feedback

- The protein degradation time is much larger than mRNA one (the protein is synthesized directly from the gene and regulates its own expression)



$y(t)$  - protein level

$$\frac{dy(t)}{dt} = G - y(t)$$

We have the following continuity equations for  $f(y,t)$  and  $g(y,t)$

$$\frac{\partial f}{\partial t} + \frac{\partial}{\partial y} (-y \cdot f) = b(y)g - c(y)f$$

$$\frac{\partial g}{\partial t} + \frac{\partial}{\partial y} ((1-y) \cdot g) = -b(y)g + c(y)f$$

$$f(y,t) := \Pr(\text{prot. level} = y, G = 0)$$

$$g(y,t) := \Pr(\text{prot. level} = y, G = 1)$$

For  $\frac{\partial f}{\partial t} = \frac{\partial g}{\partial t} = 0$  we obtain

$$f(y) = \exp \left[ \int_0^y \left( \frac{b(z)}{1-z} + \frac{c(z)-1}{z} \right) dz \right]$$

$$g(y) = \frac{yf(y)}{1-y}$$



# Diploidal gene with feedback

$$\frac{d}{dy}(-y \cdot f_0) = b \cdot f_1 - 2c \cdot f_0$$

$$\frac{d}{dy}((1-y) \cdot f_1) = 2c \cdot f_0 - (b+c) \cdot f_1 + 2b \cdot f_2$$

$$\frac{d}{dy}((2-y) \cdot f_2) = c \cdot f_1 - 2b \cdot f_2$$

$$f_0(y) := \Pr(\text{prot level} = y, G=0)$$

$$f_1(y) := \Pr(\text{prot level} = y, G=1)$$

$$f_2(y) := \Pr(\text{prot level} = y, G=2)$$

In the case without feedback

$$(c(y) = c_0 \text{ and } b(y) = b_0)$$

the functions  $f_0(y)$ ,  $f_1(y)$ ,  $f_2(y)$

are given by the convolution formulas

$$f_0(y) = \int_{s_1}^{s_2} f(z)f(y-z)dz$$

$$f_1(y) = 2 \int_{s_1}^{s_2} g(z)f(y-z)dz$$

$$f_2(y) = \int_{s_1}^{s_2} g(z)g(y-z)dz$$

where  $s_1 = 0$  and  $s_2 = y$  for  $0 \leq y \leq 1$   
 $s_1 = y-1$  and  $s_2 = 1$  for  $1 < y \leq 2$

## Mean and variance of the protein in the system without feedback

$Y_n$  - amount of protein molecules for  $n$ -copy-gene system,  $n \in N$

System with one-copy-gene

$$E(Y_1) = \frac{c}{c+b}$$

$$\text{Var}(Y_1) = \frac{c \cdot b}{(1+c+b) \cdot (c+b)^2}$$

System with  $n$ -copy-gene

$$E(Y_n) = n \cdot E(Y_1)$$

$$\text{Var}(Y_n) = n \cdot \text{Var}(Y_1)$$

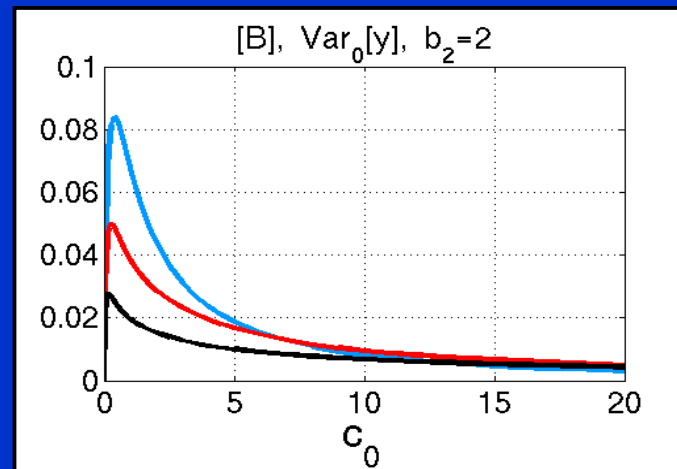
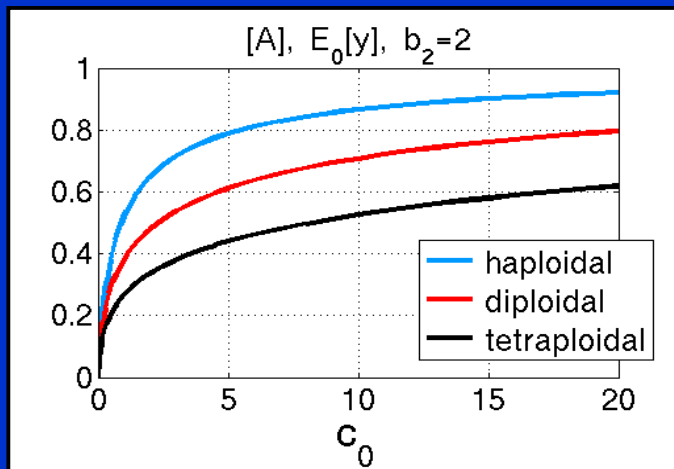
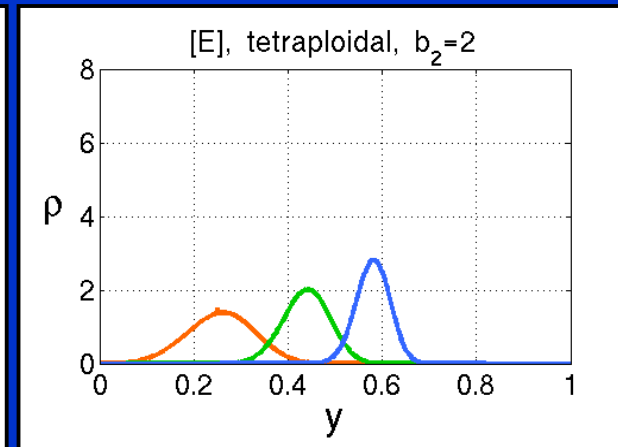
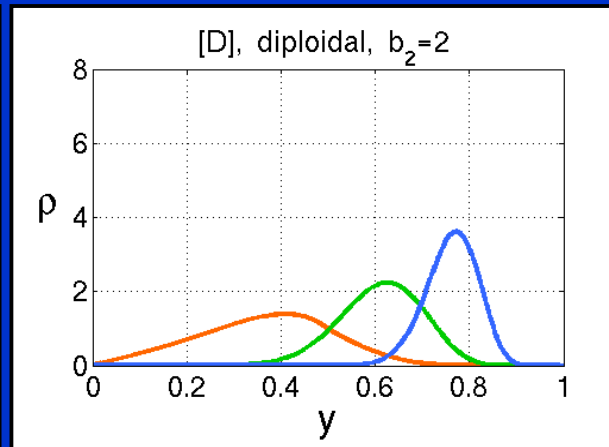
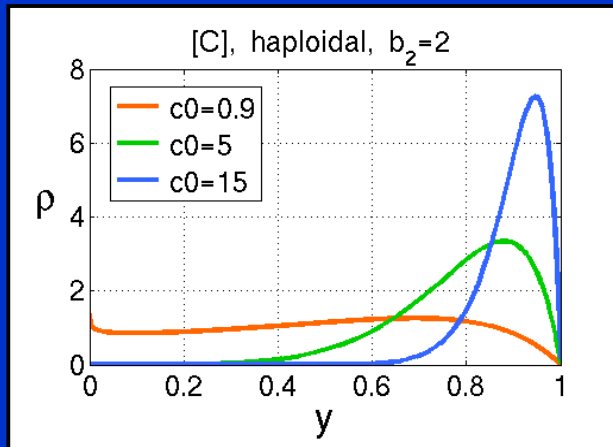
In the system without feedback mean and variance (per gene copy) are equal for arbitrary number of alleles

# Negative Feedback

We consider the external induction of self-repressing gene



$$c(y) = c_0, \quad b(y) = b_2 \cdot y^2$$



# Positive Feedback

We consider the external induction of self-activating gene



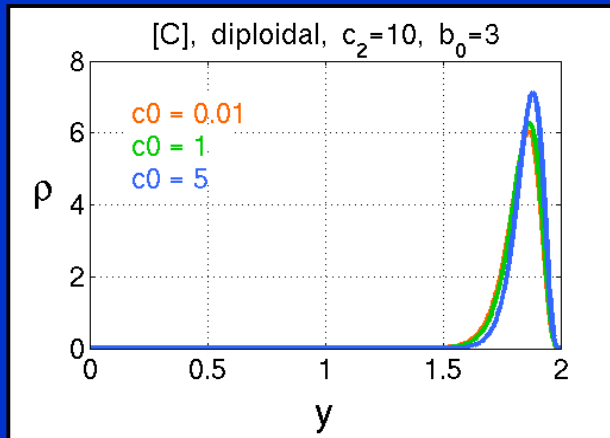
$$c(y) = c_0 + c_2 \cdot y^2, \quad b(y) = b_0$$

There are three patterns of  $N$ -allelic ( $N = 1, 2, 4$ ) gene activation corresponding to different pairs of  $c_2$  and  $b_0$  in  $(c_2, b_0)$  - plane

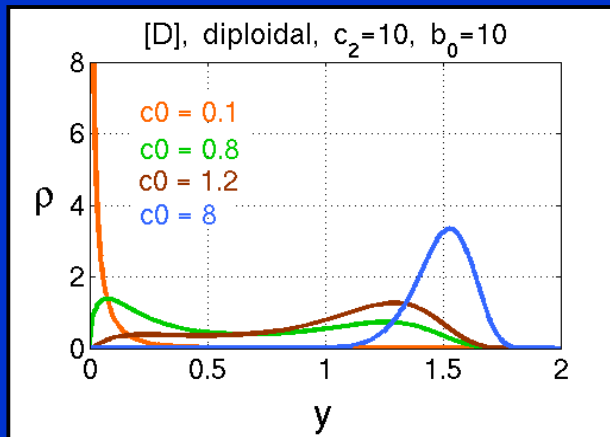
- {A} - mode in which gene remains Active (i.e.  $E_0(y) > \frac{1}{2}$ ) for all  $c_0$
- {B} - mode in which gene activates for some  $c_0$  and distribution  $\rho(y)$  is transiently Bimodal
- {U} - mode in which gene activates for some  $c_0$  and its distribution remains Unimodal

## 3 modes of diploidal gene activation

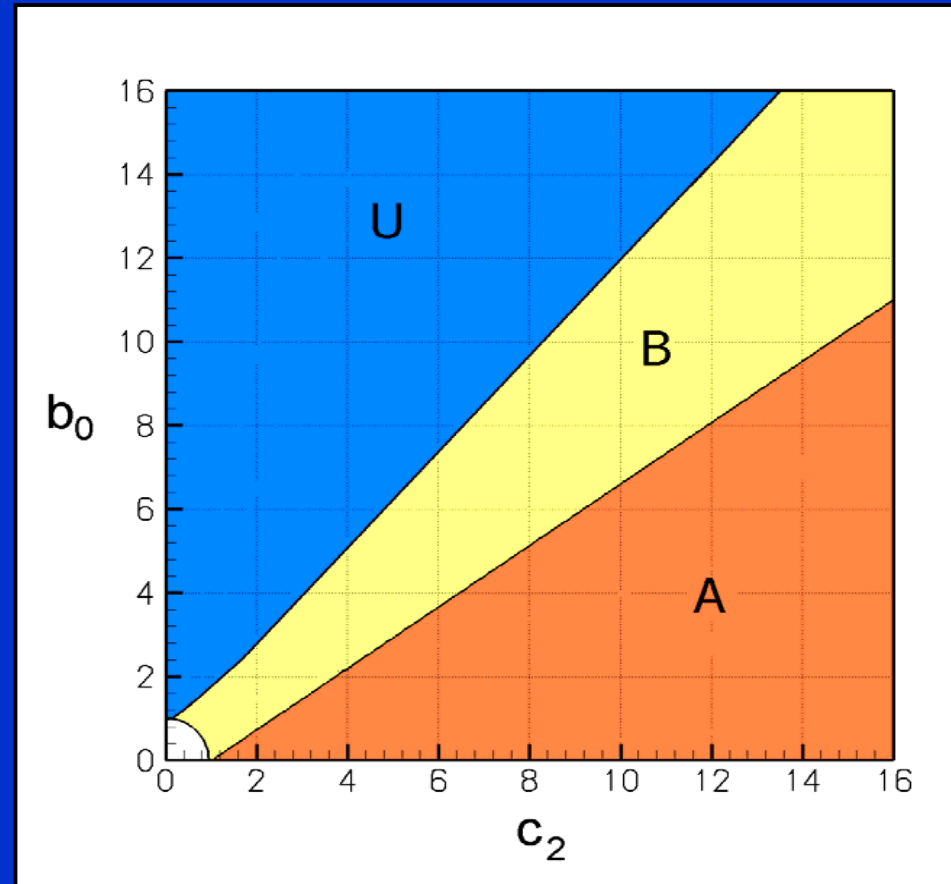
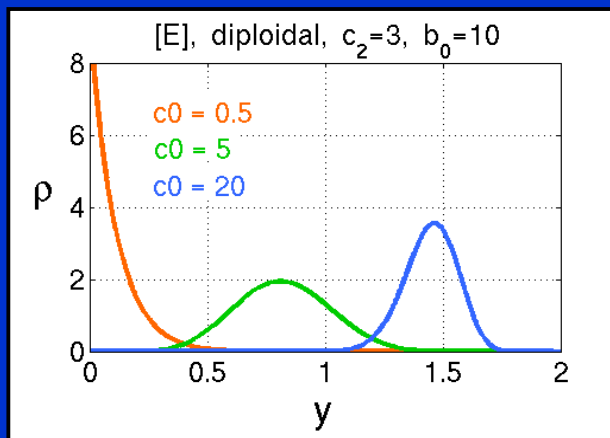
{A} - mode



{B} - mode



{U} - mode

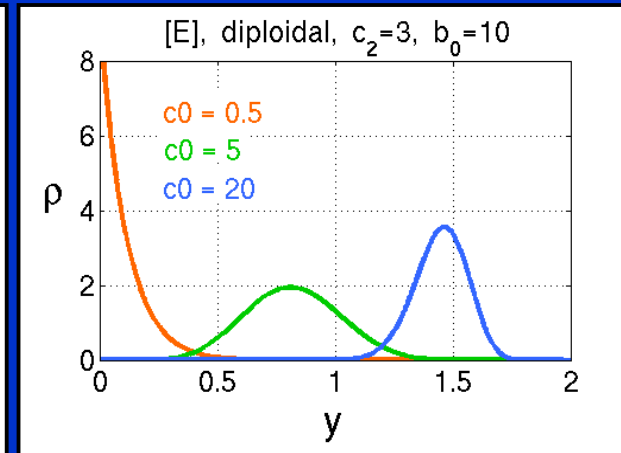
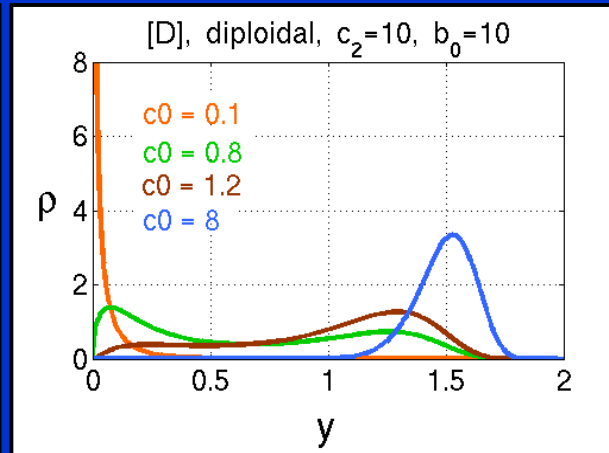
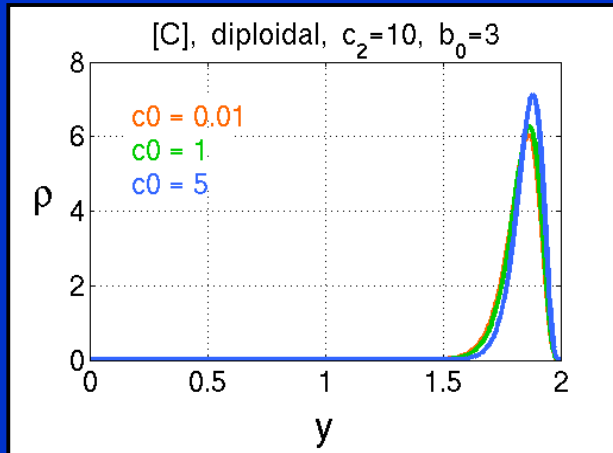


# Protein distributions for diploidal system

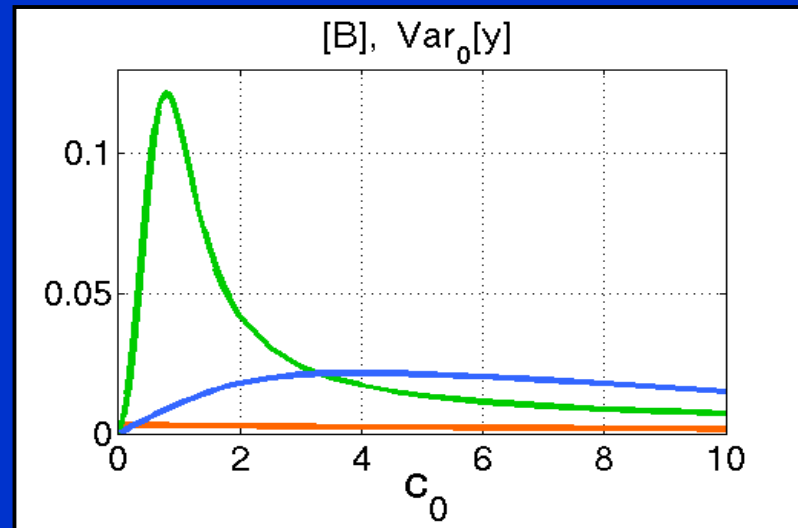
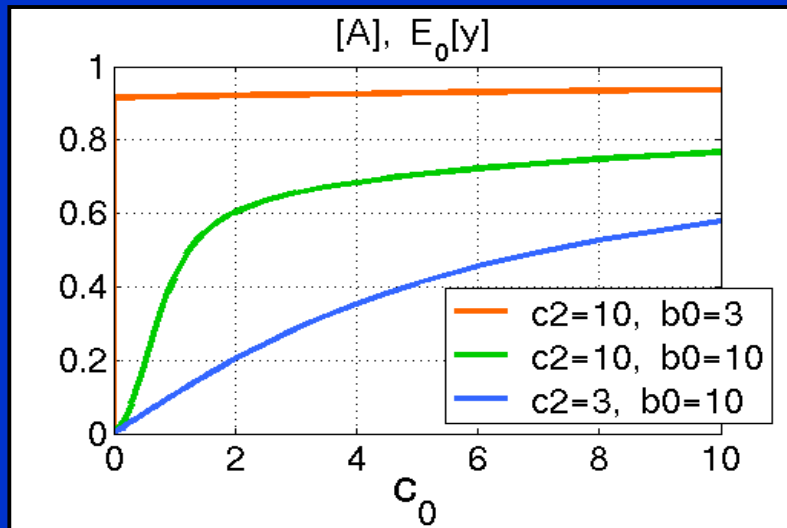
{A} - mode

{B} - mode

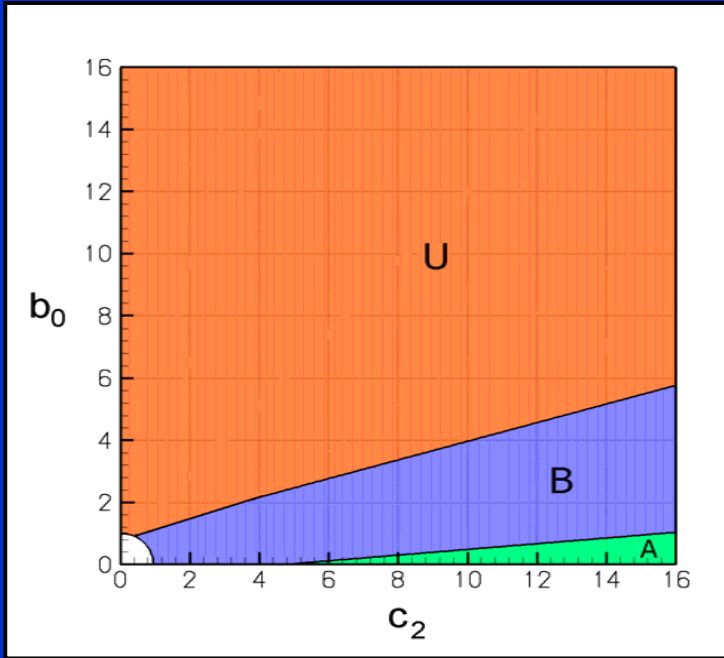
{U} - mode



## Mean and Variance (per gene copy) for diploidal system

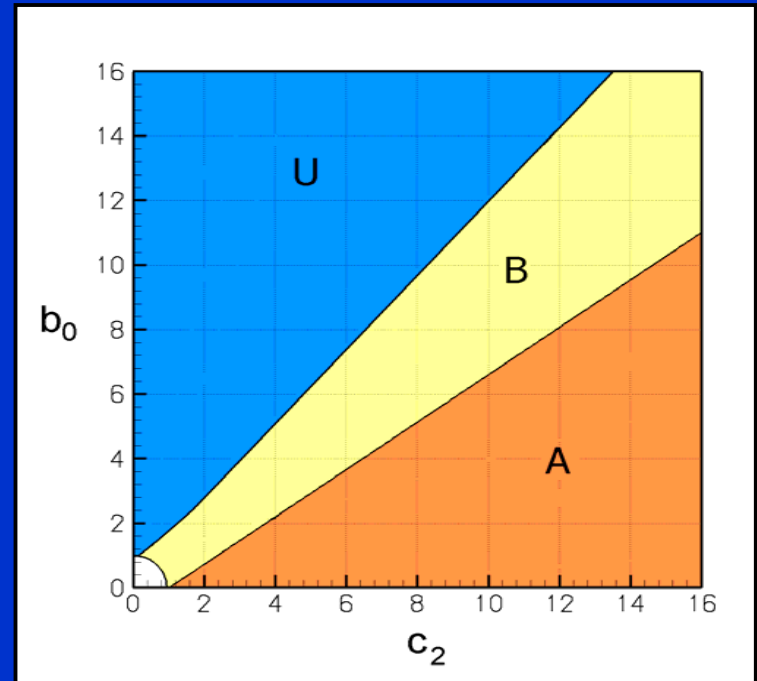


haploidal gene

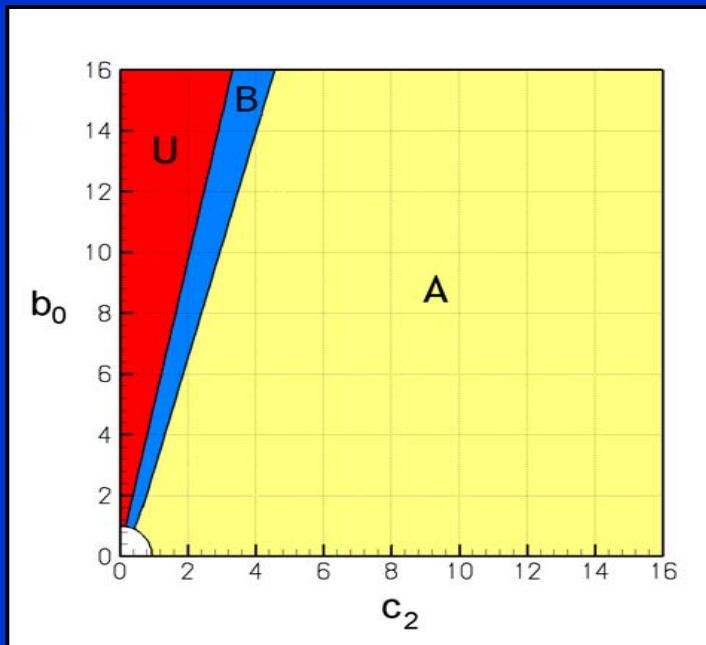


3 regions in  $(c_2, b_0)$ - plane corresponding to 3 modes of activation

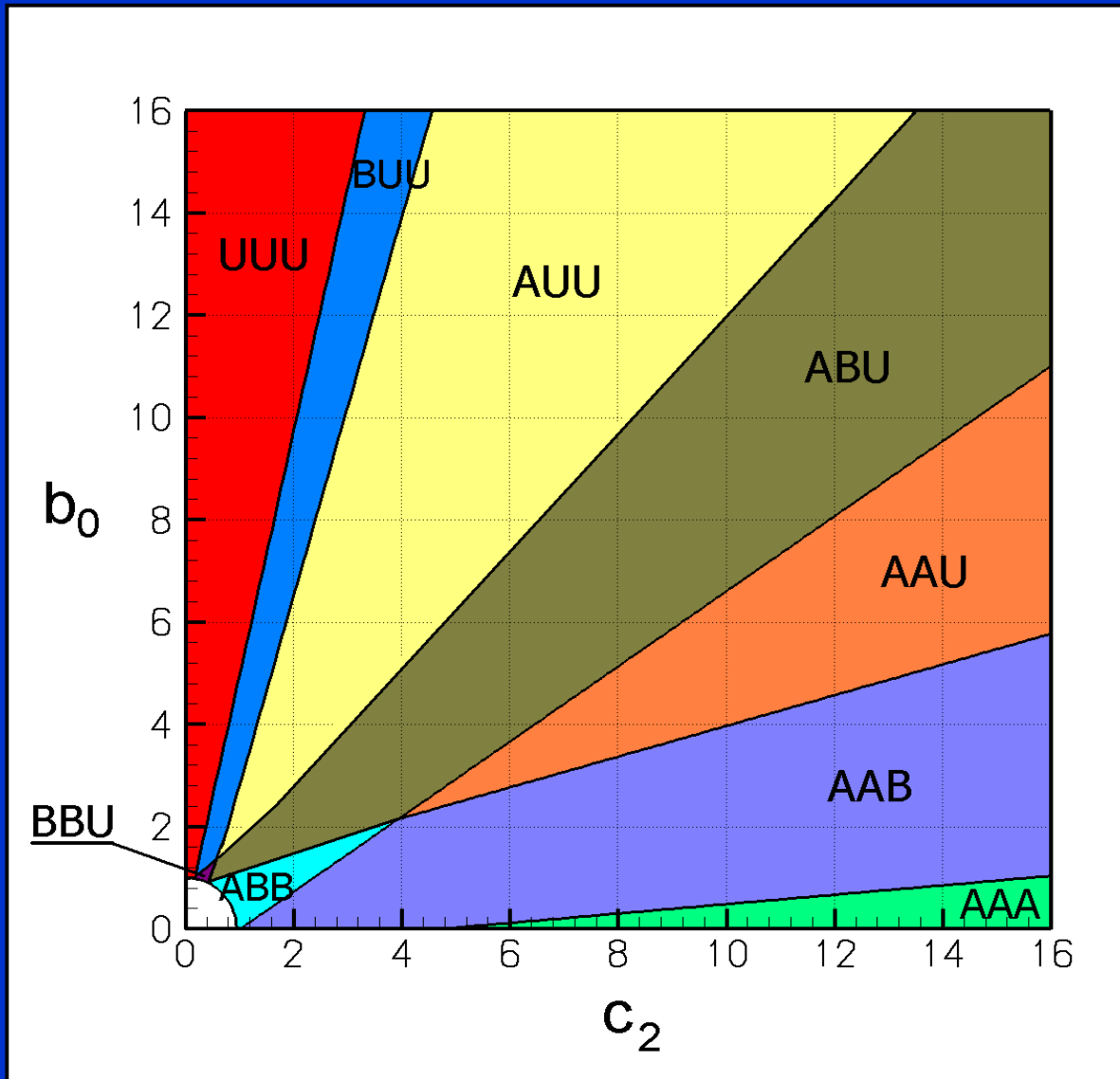
diploidal



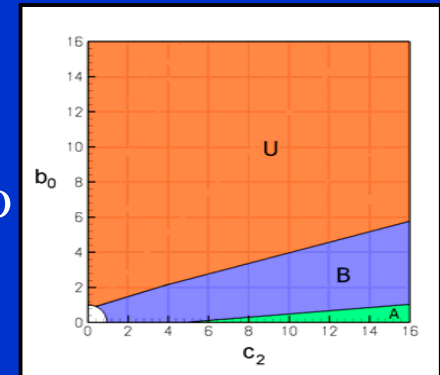
tetraploidal



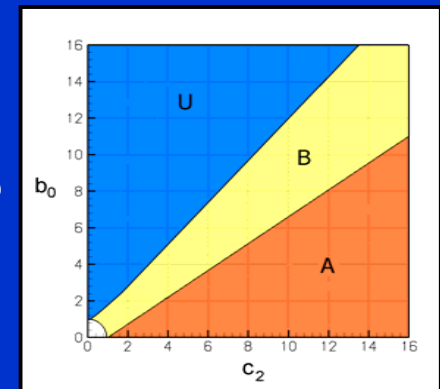
# 9 possible patterns of 1-,2- and 4-copy-gene-system activation



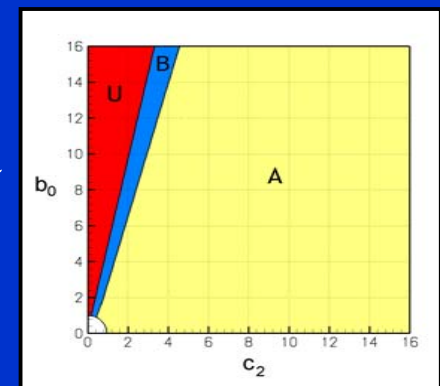
haplo



diplo



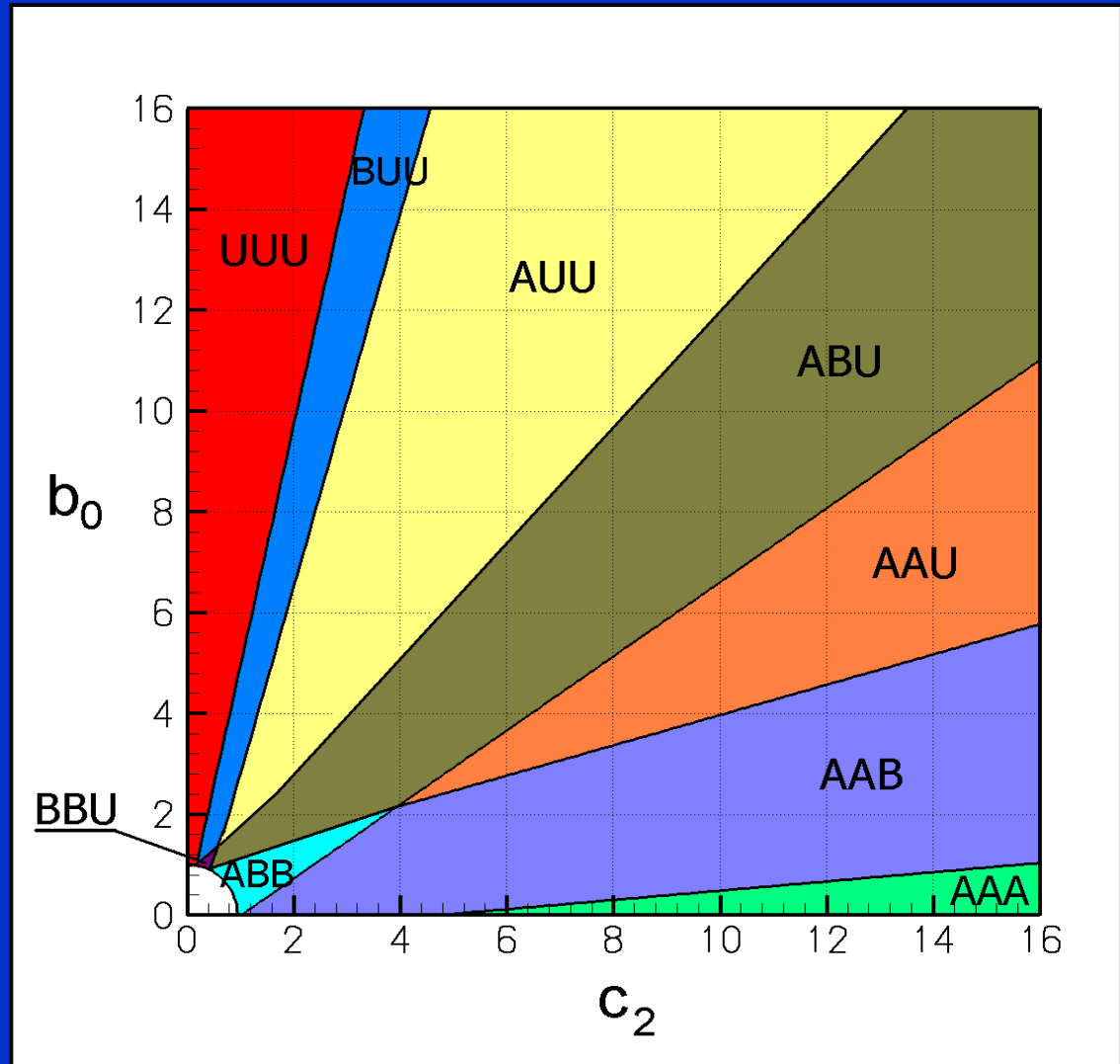
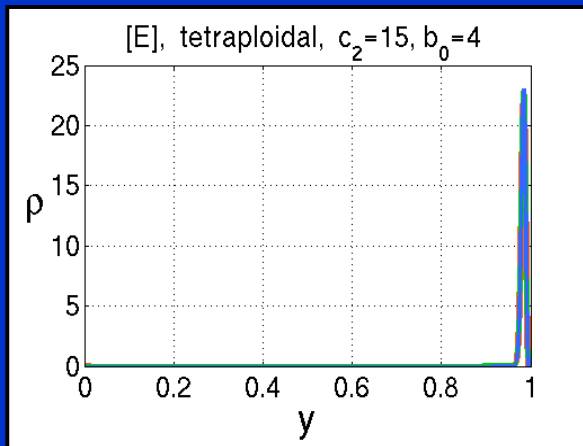
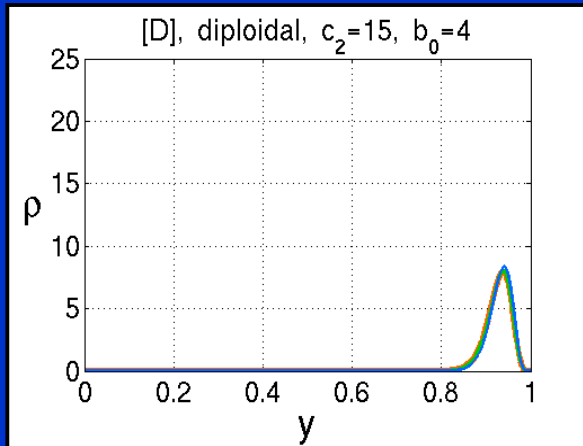
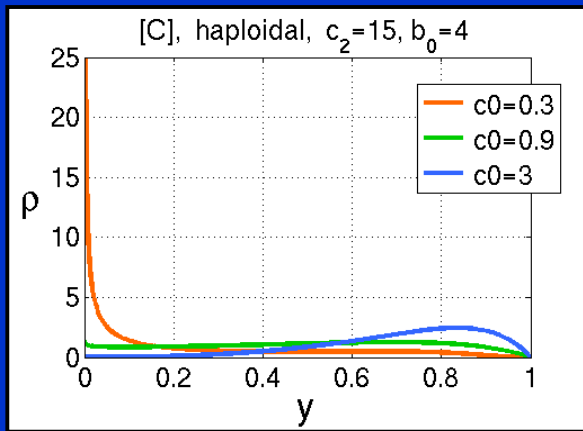
tetra



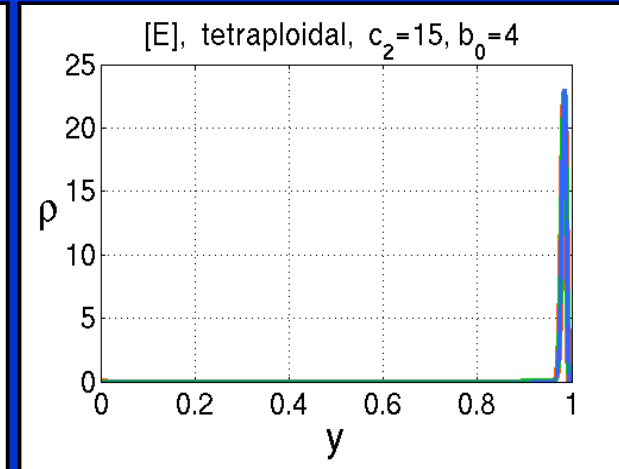
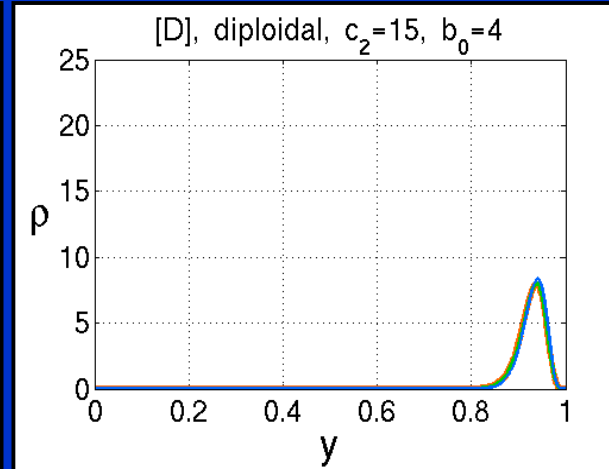
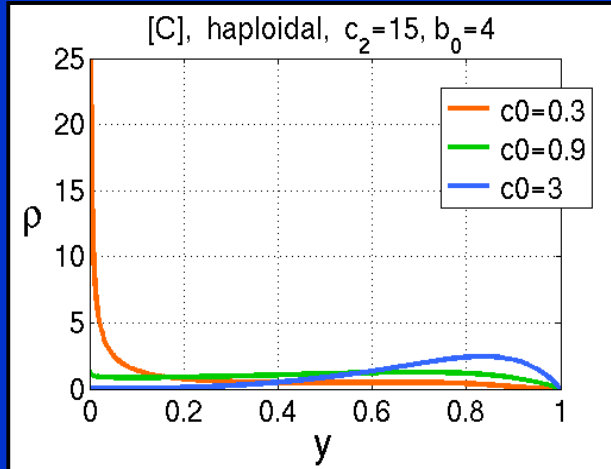
{ABU} sector denotes that tetraploidal gene is in the {A}-mode, diploidal - in the {B}-mode, haploidal - in the {U}-mode



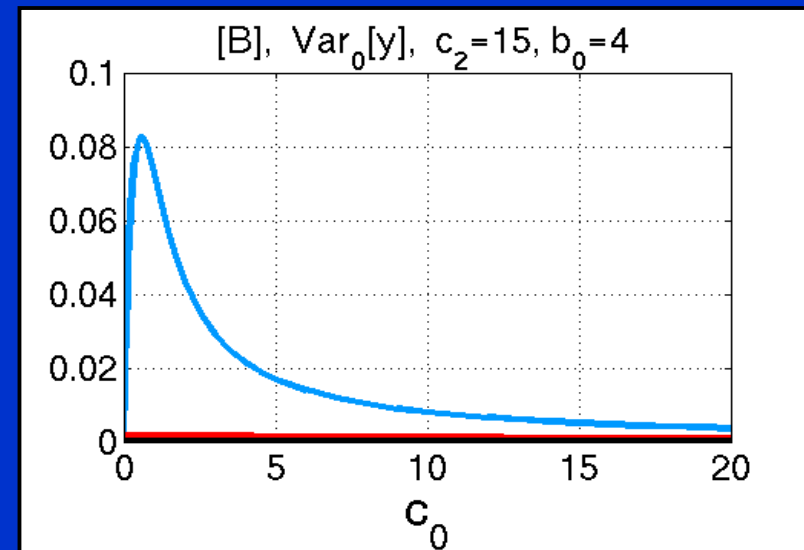
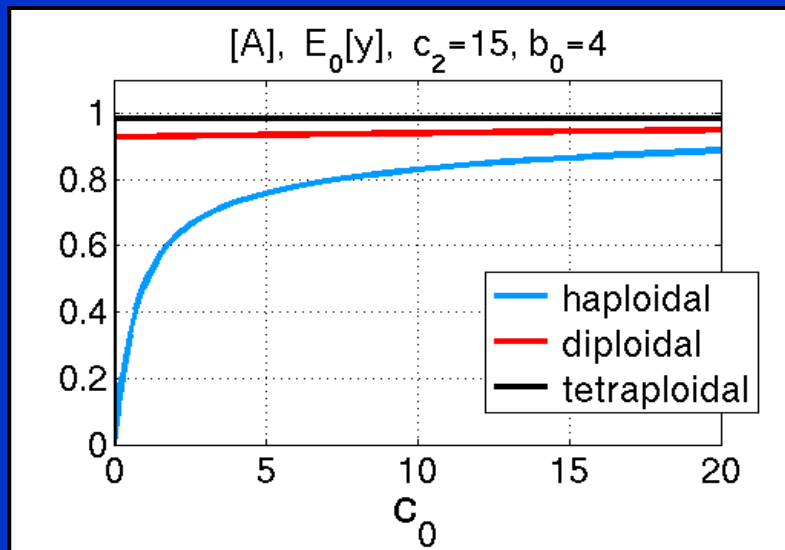
# Mode {AAB}, $c_2 = 15, b_0 = 4$



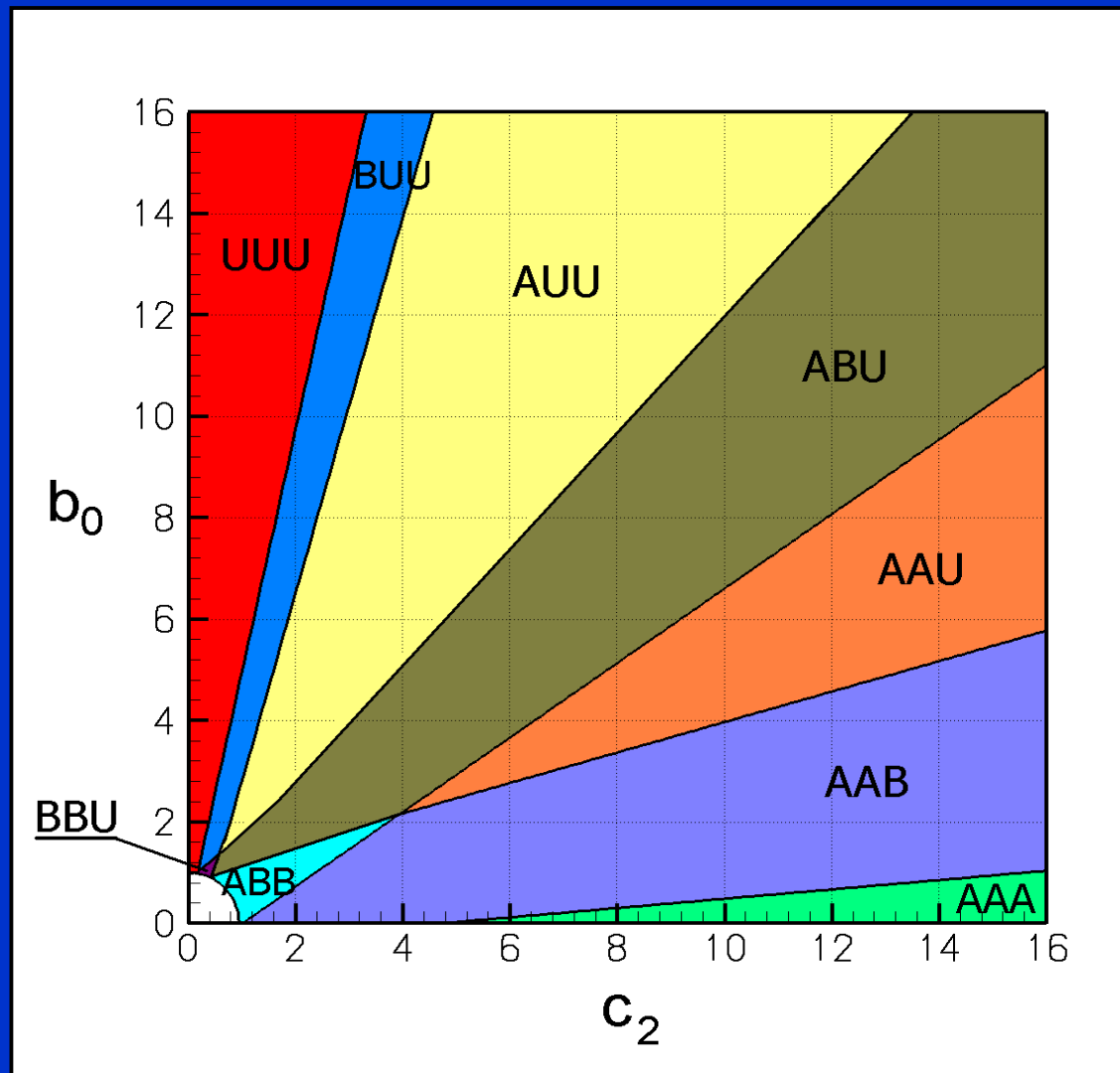
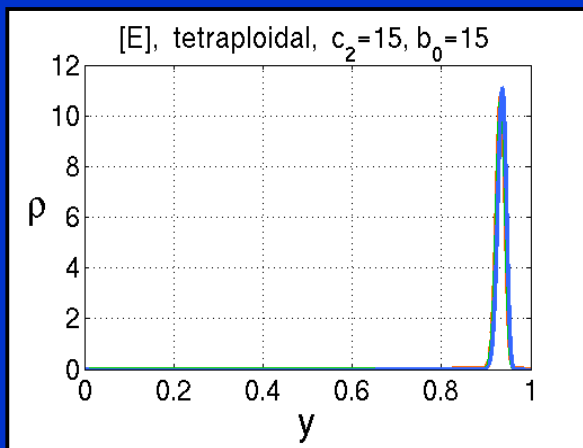
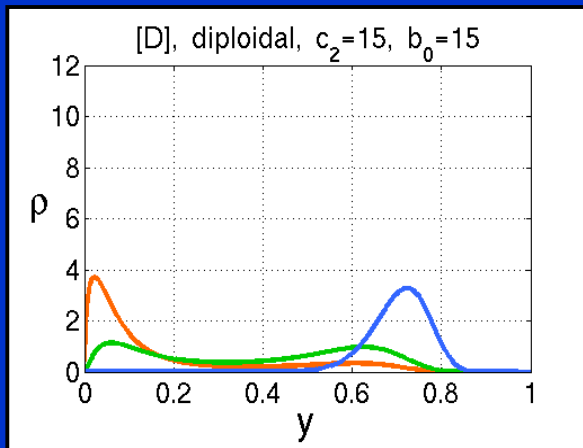
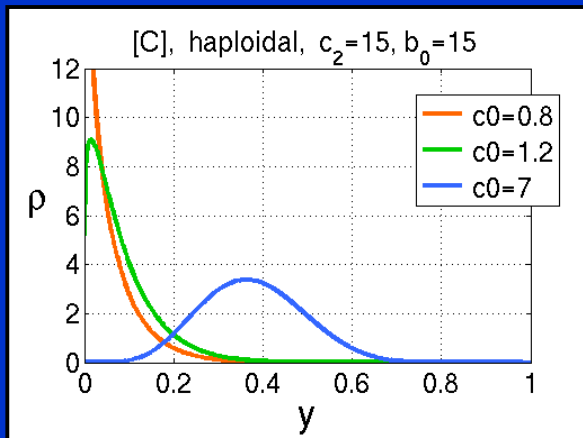
## Protein distributions for 1-,2-,4-copy-gene system



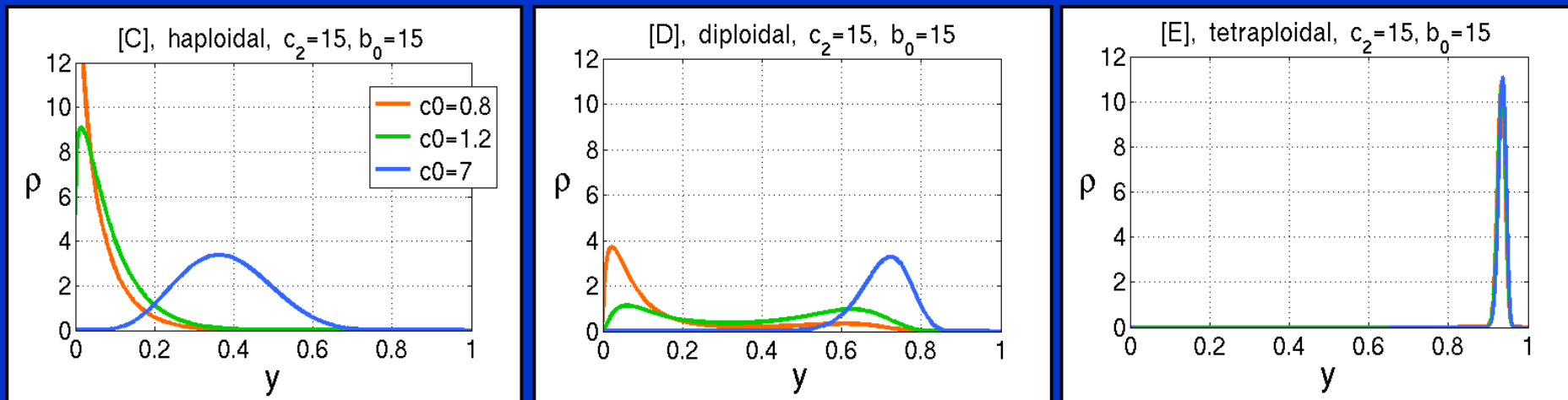
## Mean and Variance (per gene copy) of the protein



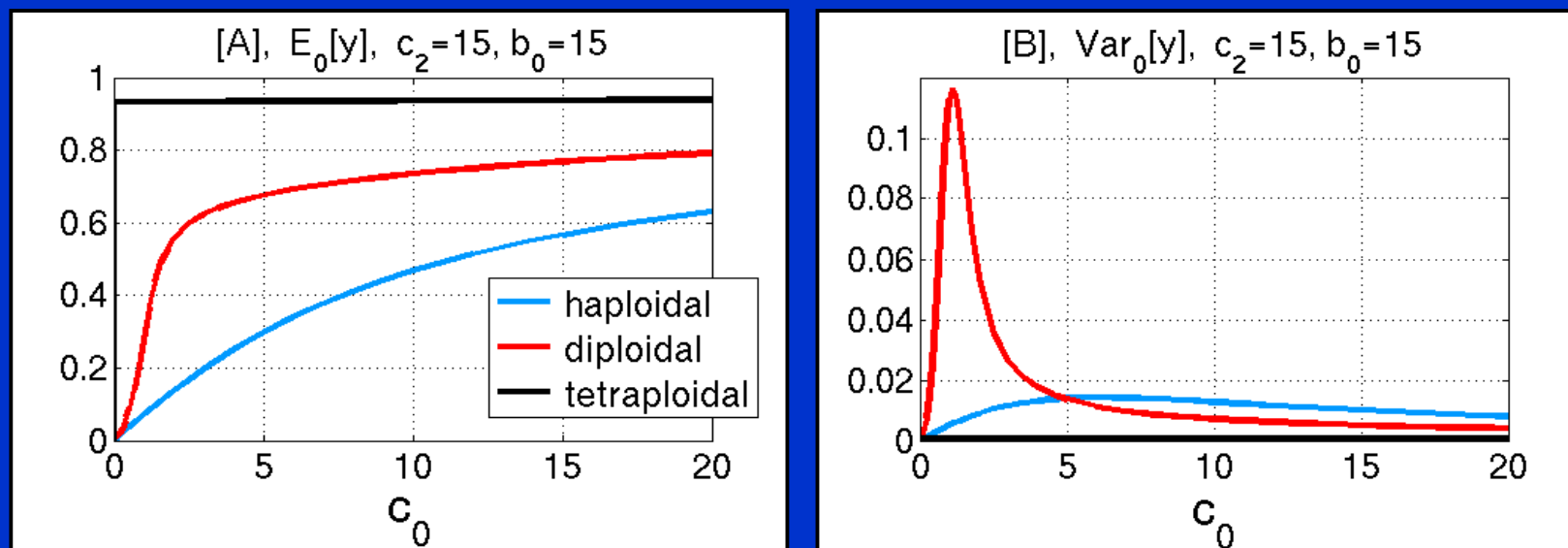
# Mode {ABU}, $c_2 = 15, b_0 = 15$



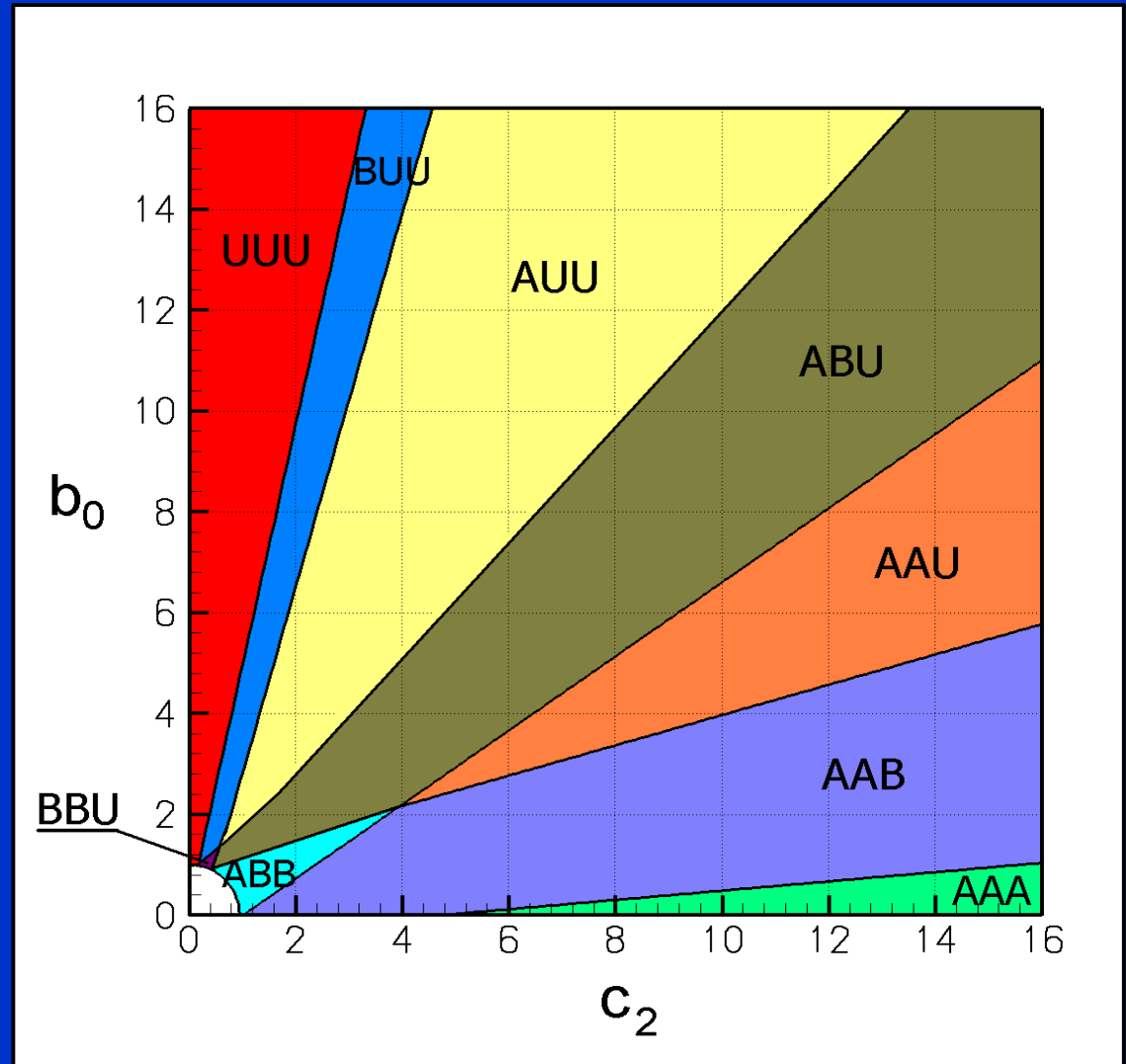
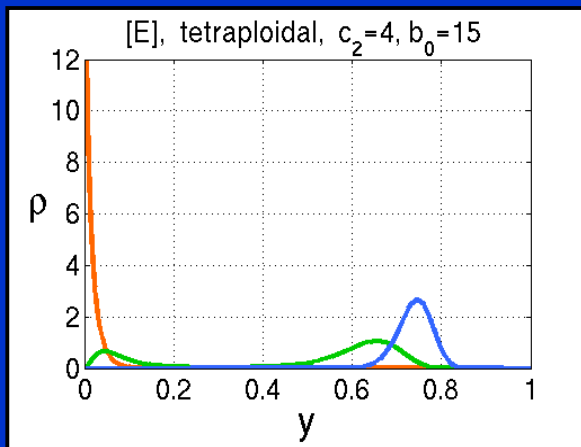
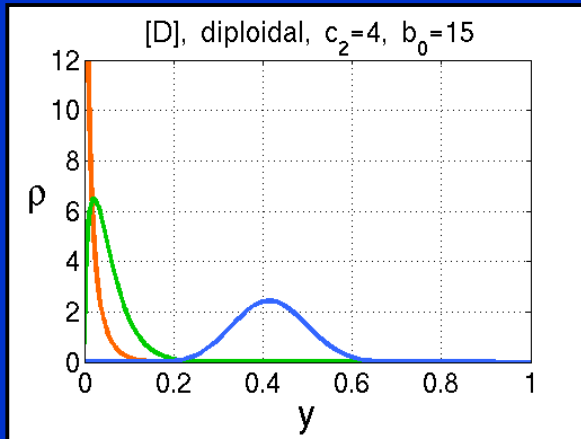
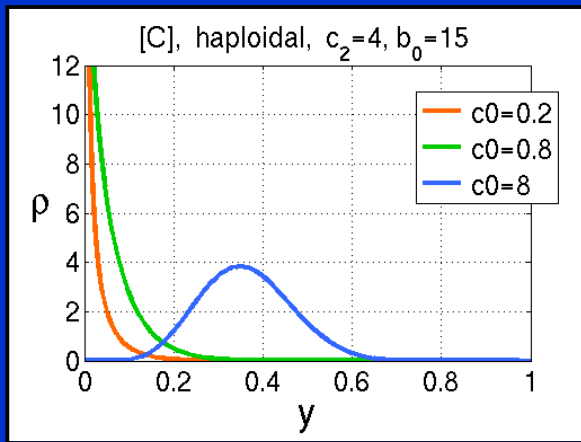
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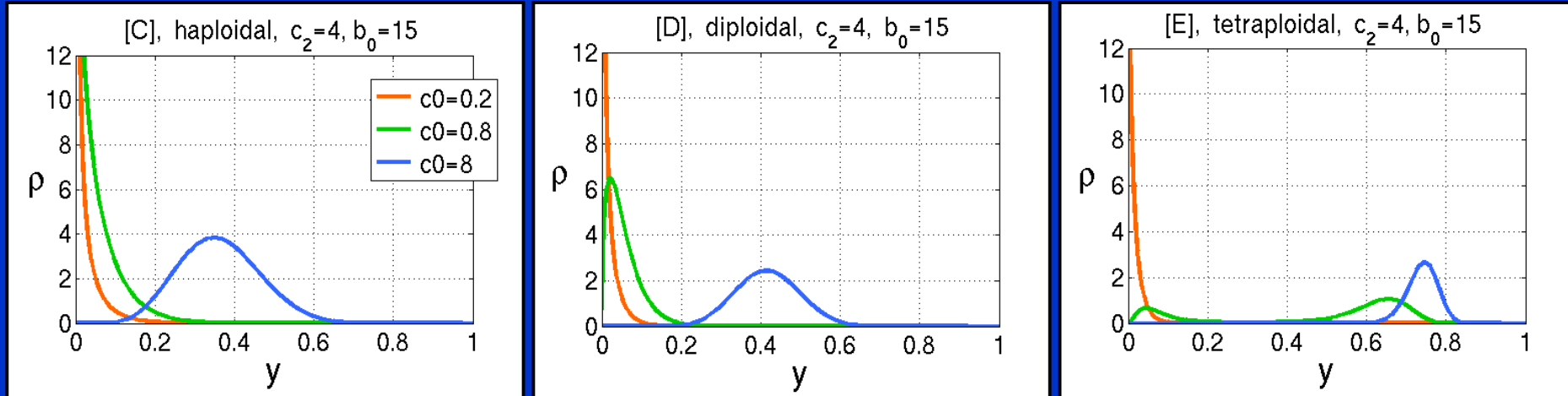
## Mean and Variance (per gene copy) of the protein



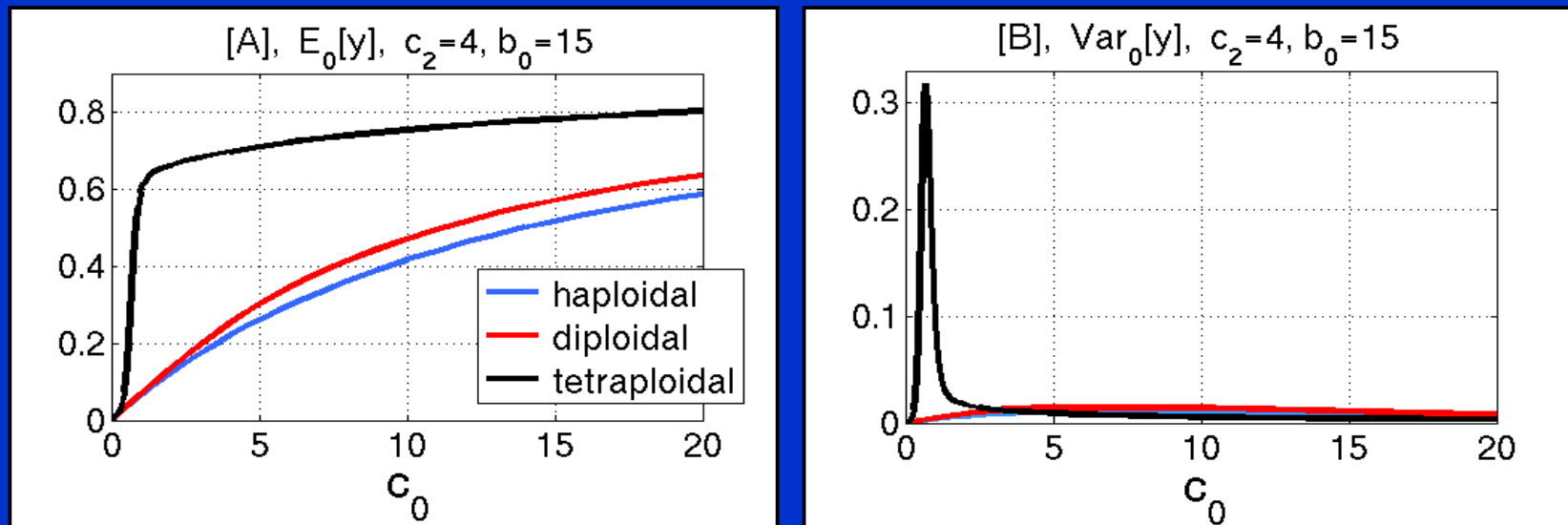
# Mode {BUU}, $c_2 = 4, b_0 = 15$



## Protein distributions for 1-,2-,4-copy-gene system

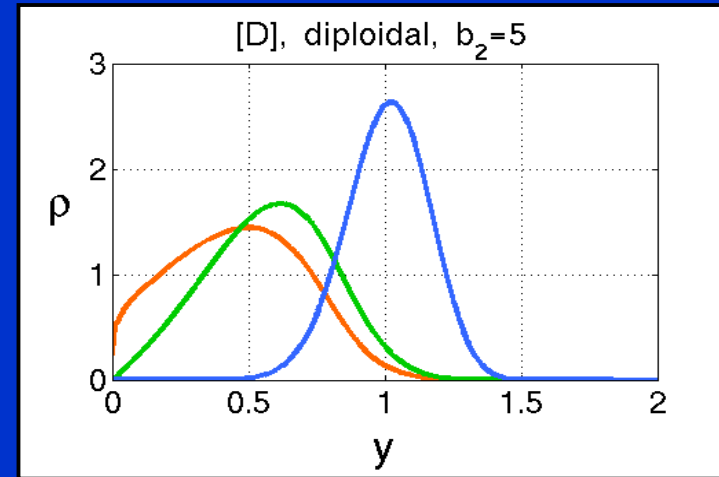
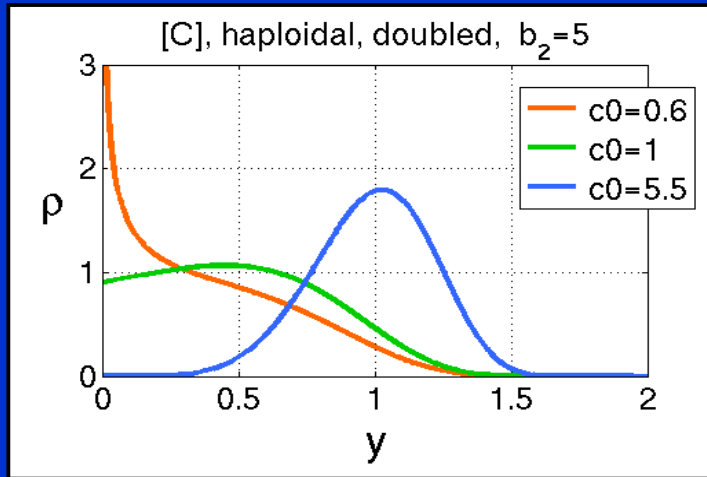


## Mean and Variance (per gene copy) of the protein

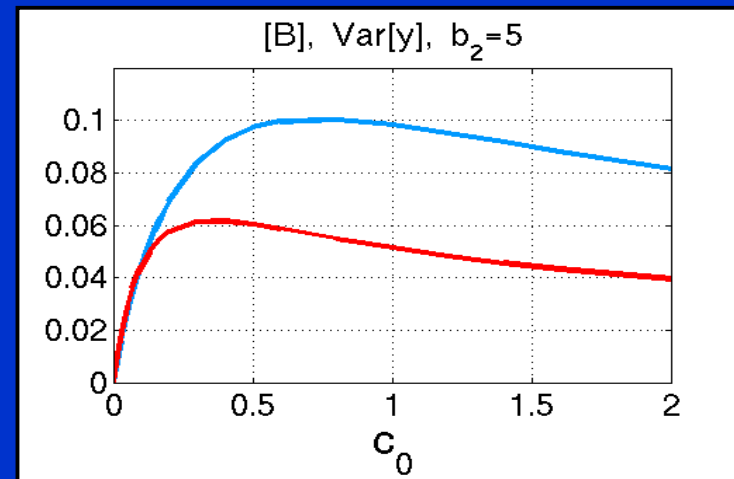
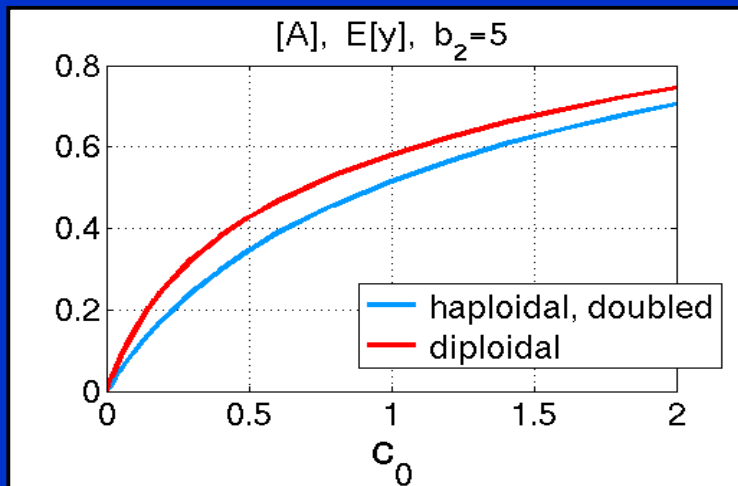


# Compensation of missing allele by the higher expression of the remaining one, $b_2 = 2$ (negative feedback)

Marginal distributions for haploidal gene (doubled prod.) and diploidal one

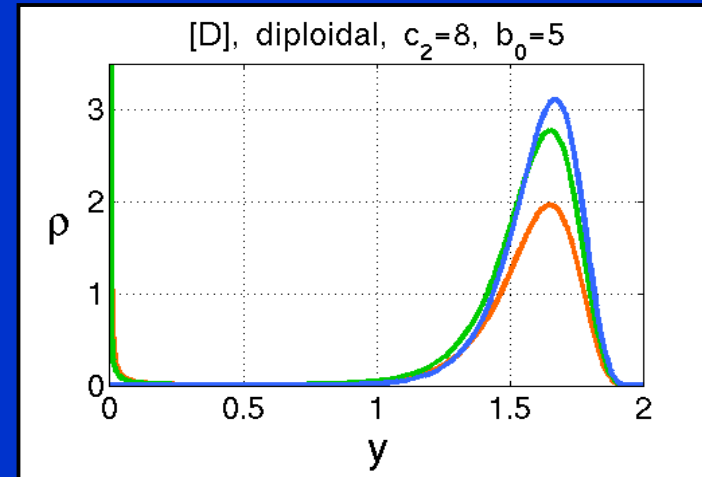
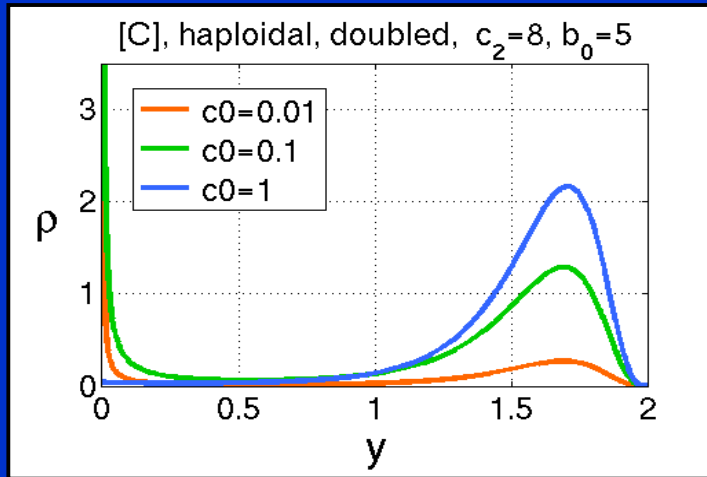


## Mean and Variance of the protein

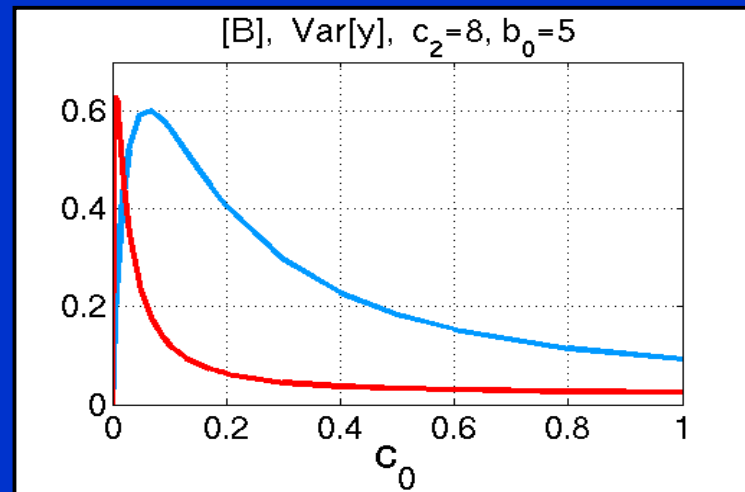
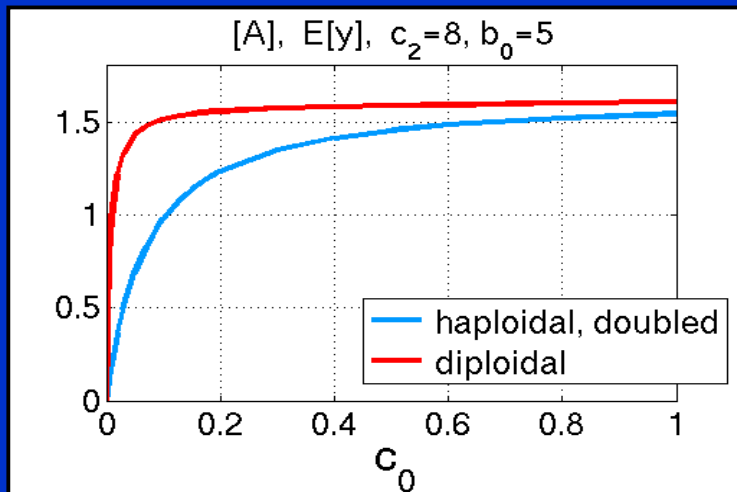


# Compensation of missing allele by the higher expression of the remaining one, $c_2 = 8, b_0 = 5$ (positive feedback)

Marginal distributions for haploidal gene (doubled prod.) and diploidal one



## Mean and Variance of the protein





## Take Home Conclusions

- The increase in number of gene alleles may totally alter its regulation
- In the case of positive feedback the loss of one allele may be not fully compensated by the change of mRNA synthesis efficiency per allele
- For autoinductible systems the one-copy-gene system responds differently to two-copy-gene system