

## Homework 6 Maximum Likelihood Estimation and Method of

课程 □ Unit 3 Methods of Estimation □ Moments

2. Recap: Maximum LikelihoodEstimators and Fisher information

## 2. Recap: Maximum Likelihood Estimators and Fisher information Instructions:

For each of the following distributions, compute the maximum likelihood estimator based on n i.i.d. observations  $X_1, \ldots, X_n$  and the Fisher information, if defined. If it is not, enter **DNE** in each applicable input box.

(a)

3/3 points (graded)

$$X_i \sim \mathsf{Ber}\left(p
ight), \quad p \in (0,1)$$

(Enter  ${f bar X}_{f n}$  for the sample average  $\overline{X}_n$ 

$$\overline{X}_n = rac{1}{n} \sum_{i=1}^n X_i.$$

Maximum likelihood estimator  $\hat{m{p}} = oxed{f barX_n}$ 

Hint: Use the definition of Fisher information that leads to the shorter computation.

(If the Fisher information is not defined, enter **DNE**.)

Fisher information 
$$I\left(p\right)=egin{array}{c} 1/(p^*(1-p)) & & \\ \hline \end{array}$$

Use Fisher Information to find the asymptotic variance  $\,V\left(\hat{p}
ight)\,$  of the MLE  $\,\hat{p}$  .

$$V\left(\hat{p}
ight) = oxed{\left(p^{\star}(1-p)
ight)}$$
  $oxed{\left(p\cdot\left(1-p
ight)
ight)}$ 

STANDARD NOTATION

提交 你已经尝试了2次(总共可以尝试3次)

□ 正确 (3/3 分)

(b)

3/3 points (graded)

$$X_i \sim \mathsf{Poiss}\left(\lambda
ight), \quad \lambda > 0,$$

which means that each  $\,X_i\,$  has distribution

$$\mathbf{P}_{\lambda}\left(X=k
ight)=e^{-\lambda}rac{\lambda^{k}}{k!},\quad k\in\mathbb{N}.$$

(Enter  $\operatorname{\textbf{barX}}_{f n}$  for the sample average  $\overline{m{X}}_{m{n}}$ .)

Maximum likelihood estimator  $\hat{\lambda} = \boxed{\hspace{1.5cm} \mathsf{barX\_n}}$ 

(If the Fisher information is not defined, enter **DNE**.)

Fisher information  $I\left(\lambda\right)=egin{array}{c} 1/\mathrm{lambda} \end{array}$ 

Use Fisher Information to find the asymptotic variance  $\,V\left(\hat{\lambda}
ight)\,$  of the MLE  $\,\hat{\lambda}$  .

STANDARD NOTATION

提交 你已经尝试了1次(总共可以尝试3次)

□ 正确 (3/3 分)

(c)

3/3 points (graded)

$$X_{i}\sim\mathsf{Exp}\left(\lambda
ight),\quad\lambda>0,$$

which means that each  $\,X_1\,$  has density

$$f_{\lambda}\left( x
ight) =\lambda e^{-\lambda x},\quad x>0.$$

(Enter  $\mathbf{barX}_{-}\mathbf{n}$  for  $\overline{m{X}}_{m{n}}$  the sample average.)

Maximum likelihood estimator  $\hat{\lambda} = \begin{vmatrix} 1/barX_n \end{vmatrix}$  (If the Fisher information is not defined, enter **DNE**.)

Fisher information  $I(\lambda) = \boxed{ \frac{1}{\lambda^2} }$ 

Use Fisher Information to find the asymptotic variance  $\,V\,(\hat{\lambda})\,$  of the MLE  $\,\hat{\lambda}\,$  .

STANDARD NOTATION

提交

□ 正确 (3/3 分)
(d) 4/7 points (graded)
$X_{i}\sim\mathcal{N}\left(\mu,\sigma^{2} ight),\mu\in\mathbb{R},\sigma^{2}>0,$
which means that each $X_1$ has density
$f_{\mu,\sigma^2}\left(x ight) = rac{1}{\sqrt{2\pi\sigma^2}} \mathrm{exp}\left(-rac{(x-\mu)^2}{2\sigma^2} ight).$
<i>Hint:</i> Keep in mind that we consider $\sigma^2$ as the parameter, not $\sigma$ . You may want to write $ au=\sigma^2$ in your computation.
(Enter ${\sf barX_n}$ for the sample average $\overline{X}_n$ and ${\sf bar(X_n^2)}$ for the sample average of second moments $\overline{X_n^2}$ .)
Maximum likelihood estimator $\hat{\pmb{\mu}} = oxedsymbol{f barX_n}$
(Enter ${\sf barX\_n}$ for the sample average $\overline{X}_n$ and ${\sf bar(X\_n^2)}$ for the sample average of second moments $\overline{X_n^2}$ .)
Maximum likelihood estimator $\widehat{\sigma^2} = \boxed{ bar(X_n^2) - barX_n^2} $
Hint: One of the formulas for Fisher information will lead to a much shorter computation.
(If the Fisher information is not defined, enter <b>DNE</b> for all boxes below.)
$[I\left(\mu,\sigma^2\right)]_{1,1} = \boxed{ \begin{tabular}{c} 1/(2*sigma^2) \\ \hline $\frac{1}{2\cdot\sigma^2}$ \end{tabular}}, [I\left(\mu,\sigma^2\right)]_{1,2} = \boxed{ \begin{tabular}{c} 0 \\ \hline \hline 0 \end{tabular}}$
$[I(\mu,\sigma^2)]_{2,1}=egin{bmatrix} 0 & & & & & & & & & & & & & & & & & & $
Using the Fisher Information you obtain above, what is the asymptotic variance $V(\widehat{\sigma^2})$ of the MLE $\widehat{\sigma^2}$ ?Compare this with your result from Homework 5 Problem 3.
$V(\widehat{\sigma^2}) = $ sigma^4
$\sigma^4$
STANDARD NOTATION
提交 你已经尝试了1次(总共可以尝试3次)

(e)

5/6 points (graded)  $X_i$  follows a shifted exponential distribution with parameters  $a\in\mathbb{R}$  and  $\lambda>0$  . That means each  $X_i$  has density

$f_{a,\lambda}\left(x ight)=\lambda e^{-\lambda(x-a)}1\{x\geq a\}, x\in\mathbb{R}.$			
(Enter $ extbf{barX_n}$ for the sample average $\overline{X}_n$ , and if applicable, use $ extbf{min_i(X_i)}$ for $ extbf{min_1}_{\leq i \leq n} X_i$ ).			
Maximum likelihood estimator $\hat{m{a}} = \boxed{  ext{min_i(X_i)} }$			
Maximum likelihood estimator $\hat{\pmb{\lambda}} = \boxed{\min_{i}(X_i)}$			
<i>Hint:</i> Think of t	the effect of the indicator function on the derivatives. (If the Fisher information is not defined, enter <b>DN</b>	I <b>E</b> in all boxes below.	
$\left[I\left(a,\lambda ight) ight]_{1,1}$ =	$=igcup_{egin{subarray}{c} igcup_{egin{subarray}{c} igcup_{egin{suba$		
	DNE		
$\left[I\left(a,\lambda ight) ight]_{2,1}$ =	$=egin{bmatrix} oxdots oxdox oxdots oxdots oxdots oxdots oxdots oxdots oxdots oxdo$		
	DNE		
STANDARD NOTATION			
提交 你已经尝试了1次(总共可以尝试3次)			
<ul><li>□ 部分正确</li><li>讨论</li><li>主题: Unit 3 Meth</li></ul>	(5/6 分)  hods of Estimation:Homework 6 Maximum Likelihood Estimation and Method of	隐藏讨论	
	ap: Maximum Likelihood Estimators and Fisher information	Add a Post	
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□ ( <u>d) &amp; (e) :</u>	: MLE plug in ?	3	
□ Caveat d)	<u>input bar(X_n^2)</u>	4	
□ [STAFF] V	<u>/ery minor typo in "2. Recap: Maximum Likelihood Estimators and Fisher information"</u>	2	
	pout asymptotic variance te the asymptotic variance, should we follow the same procedure as in last HW. or is there another approach which I haven't detected	yet?	
□ <u>Doubts al</u>	bout part e, MLE for lambda	7	
□ <u>a) fisher</u> This question	on might sound silly to you, but I'm stuck on it. For part a), are we supposed to compute the fisher info based on X_i or based on X_n	5	
□ [ <u>Staff, Typ</u> □ <u>社区助教</u>	po] density	2	

☐ [Staff] Part (e) Should be \$a\$ and \$\lambda\$ instead of \$\mu\$ and \$\sigma^2\$

☐ [Staff, Typo] varianace

Part (a), last line.

□<u>社区助教</u>

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