

In [1]:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import scipy.stats as sts
%matplotlib inline
```

## Графики доверительных интервалов

In [2]:

```
def get_confidence_intervals(get_one, sample, alpha, distr, lam):
    lower = np.zeros_like(sample)
    upper = np.zeros_like(sample)

    for i in xrange(sample.size):
        lower[i], upper[i] = get_one(sample[:i+1], alpha, distr, lam)

    return lower, upper
```

In [3]:

```
def plot_graphic(functions_get_one, names, title, colors, distr, sample, alpha):
    functions_get_one = np.array(functions_get_one)
    names = np.array(names)

    if(names.size != functions_get_one.size):
        return

    plt.figure(figsize=(16, 8))
    n = np.arange(0, sample.size, 1)
    plt.scatter(n, sample, alpha=0.2, s=20, label='sample')
    plt.plot(n, theta * np.ones_like(n), color='red', linewidth=0.5, label='pa

    for i in xrange(functions_get_one.size):
        lower, upper = get_confidence_intervals(functions_get_one[i], sample,

        # заполняет пространство между двумя функциями
        plt.fill_between(n, upper, lower, color=colors[i], alpha=0.3, label=st

    #plt.xlim((1, 200)) # размеры графика по горизонтальной оси (ставим None,
    plt.ylim((y_min, y_max)) # размеры графика по вертикальной оси
    plt.xlabel('$n$') # название горизонтальной оси (аналогично plt.ylabel)
    plt.title(str(title)) # имя графика
    plt.grid() # добавляем сетку
    plt.legend()
    plt.show()
```

In [4]:

```

def probability(get_one, title, distr, first, second, amount_of_sample, alpha,
               prob_first = np.ones(amount_of_sample)
               prob_second = np.ones(amount_of_sample)

               amount_for_first = 0
               amount_for_second = 0

               for i in xrange(amount_of_sample):
                   sample = distr.rvs(size=second)

                   beg_first, end_first = get_one(sample[:first+1], alpha, distr, lam)

                   if((beg_first <= theta) & (theta <= end_first)):
                       amount_for_first += 1

                   beg_second, end_second = get_one(sample[:second+1], alpha, distr, lam)
                   if((beg_second <= theta) & (theta <= end_second)):
                       amount_for_second += 1

                   prob_first[i] = float(amount_for_first)/(i + 1)
                   prob_second[i] = float(amount_for_second)/(i + 1)

               plt.figure(figsize=(10, 5))
               n = np.arange(0, amount_of_sample, 1)

               plt.plot(n, prob_first, label='$n = ' + str(first) + '$')
               plt.plot(n, prob_second, label='$n = ' + str(second) + '$')

               plt.ylim((y_min, y_max)) # размеры графика по вертикальной оси
               plt.xlabel('$n$') # название горизонтальной оси (аналогично plt.ylabel)
               plt.title(str(title)) # имя графика
               plt.grid() # добавляем сетку
               plt.legend()
               plt.show()

```

In [5]:

```

N = 100
theta = 1
lam = 1
alpha = 0.95
gamma = 1 - alpha
first = 10
second = 100
amount_of_sample = 1000

```

 $R[0, \theta]$ 

In [6]:

```
uniform = sts.uniform(loc=0, scale=theta)
sample_uniform = uniform.rvs(size=N)
```

$$\text{ДИ: } \left( \frac{\bar{X}}{0.5 + \sqrt{\frac{1}{12\gamma n}}}, \frac{\bar{X}}{0.5 - \sqrt{\frac{1}{12\gamma n}}} \right)$$

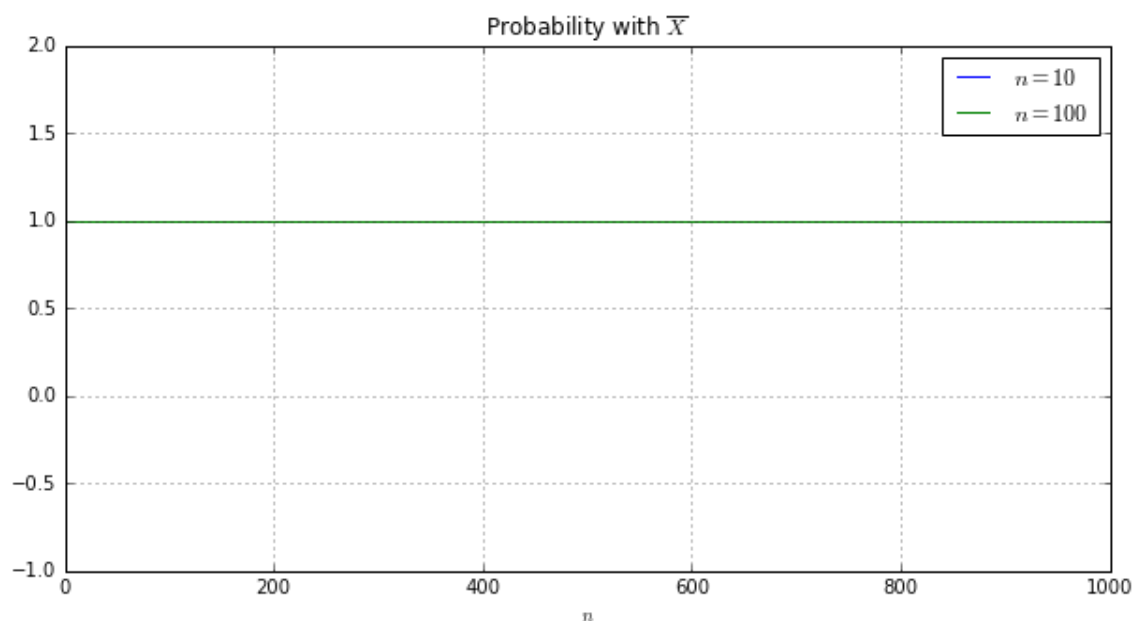
In [7]:

```
def get_one_uniform_mean(sample, alpha, distr, lam):
    gamma = 1 - alpha
    mean = float(np.mean(sample))
    e = np.sqrt(1./(12*gamma*sample.size))
    return mean/(0.5 + e), mean/(0.5 - e)
```

## Вероятность для n = 10 и n = 100

In [8]:

```
probability(get_one_uniform_mean, 'Probability with $\overline{X}$', uniform,
            amount_of_sample, alpha, theta, lam, -1, 2)
```



$$\text{ДИ: } \left( X_{(1)}, \frac{X_{(1)}}{1 - \sqrt[n]{\alpha}} \right)$$

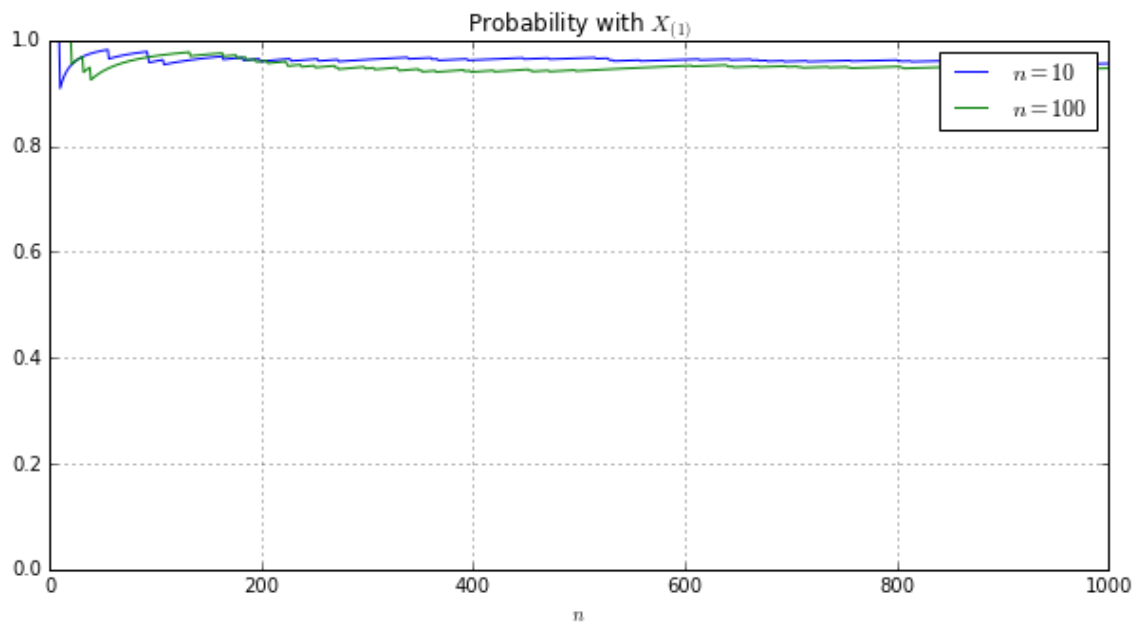
In [9]:

```
def get_one_uniform_min(sample, alpha, distr, lam):
    min_el = float(min(sample))
    return min_el, min_el/(1. - np.power(alpha, 1.0/sample.size))
```

## Вероятность для n = 10 и n = 100

In [10]:

```
probability(get_one_uniform_min, 'Probability with  $X_{(1)}$ ', uniform, first,
            amount_of_sample, alpha, theta, lam, 0, 1)
```



$$\text{ДИ: } \left( X_{(n)}, \frac{X_{(n)}}{\sqrt[n]{1-\alpha}} \right)$$

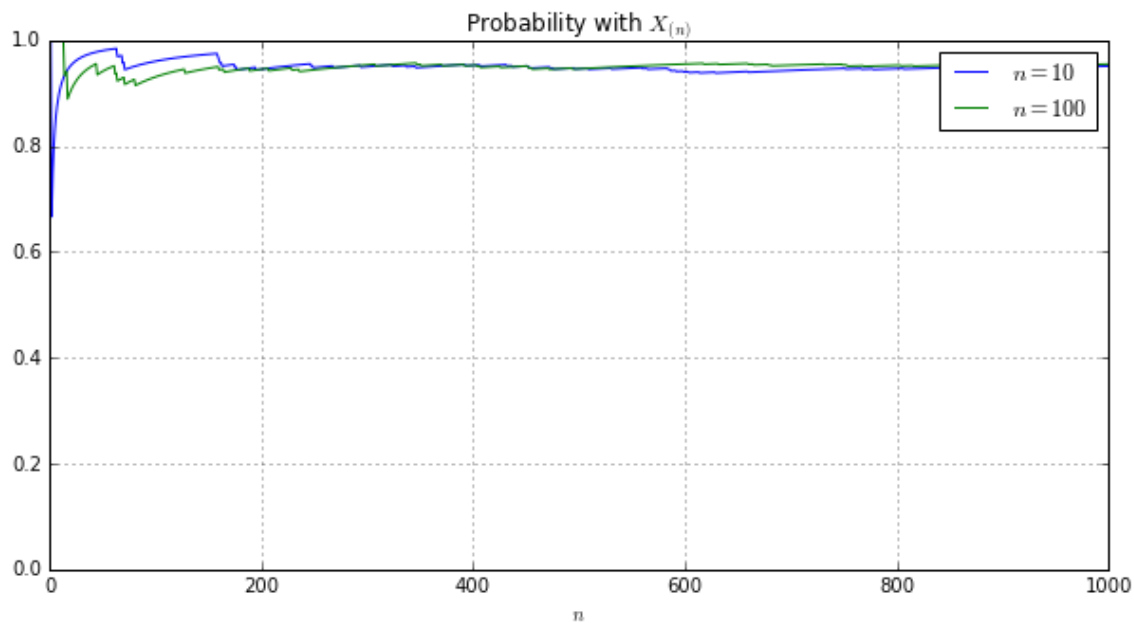
In [11]:

```
def get_one_uniform_max(sample, alpha, distr, lam):
    max_el = float(max(sample))
    return max_el, max_el/np.power(1. - alpha, 1.0/sample.size)
```

**Вероятность для n = 10 и n = 100**

In [12]:

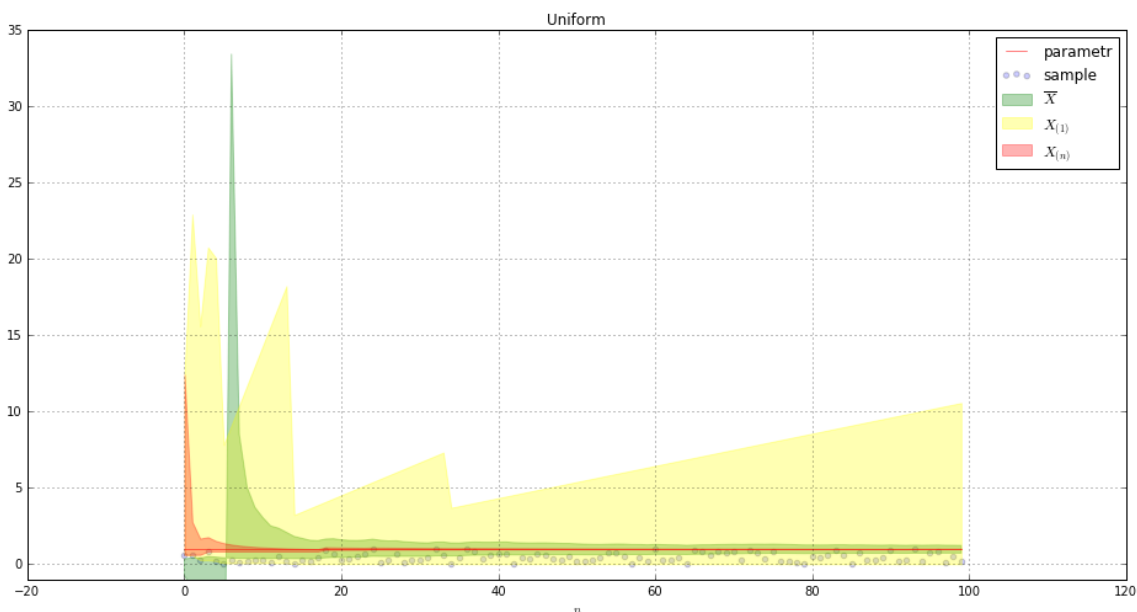
```
probability(get_one_uniform_max, 'Probability with  $X_{(n)}$ ', uniform, first,
amount_of_sample, alpha, theta, lam, 0, 1)
```



## Графики доверительных интервалов

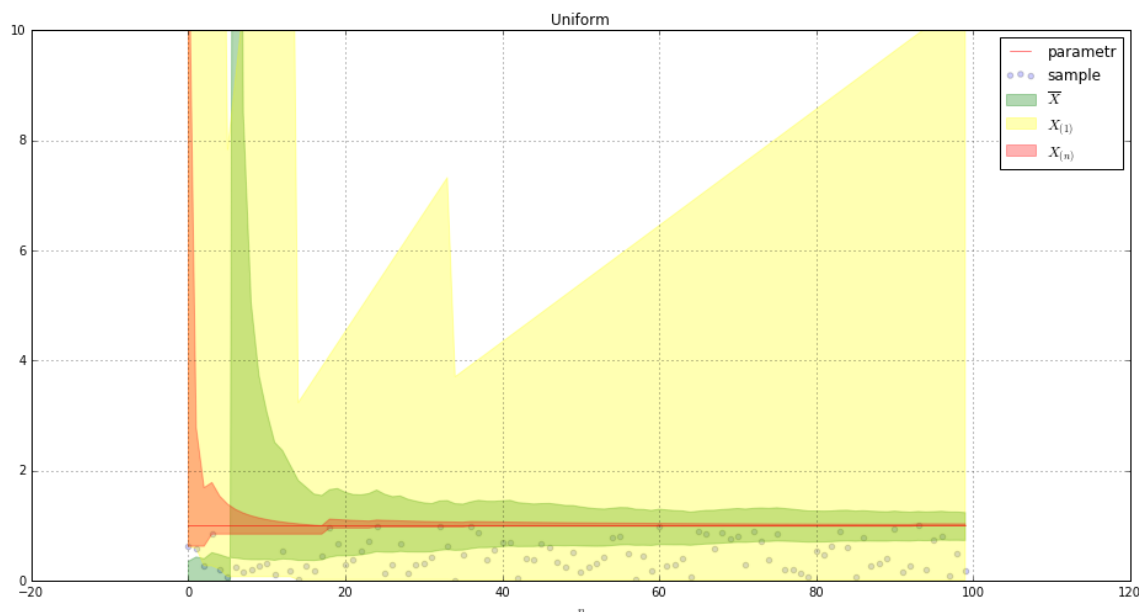
In [13]:

```
functions = np.array([get_one_uniform_mean, get_one_uniform_min, get_one_uniform_max])
colors = np.array(['green', 'yellow', 'red'])
names = np.array([' $\overline{X}$ ', ' $X_{(1)}$ ', ' $X_{(n)}$ '])
distr = sts.uniform(loc=0, scale=theta)
plot_graphic(functions, names, 'Uniform', colors, distr, sample_uniform, alpha)
```



In [14]:

```
plot_graphic(functions, names, 'Uniform', colors, distr, sample_uniform, alpha
```



## Вывод

Наилучший ДИ получается при использовании  $x_{(n)}$

$$Cauchy \text{ со сдвигом } p_{\theta}(x) = \frac{1}{\Pi(1+(x-\theta)^2)}$$

In [15]:

```
cauchy = sts.cauchy(loc=theta)
sample_cauchy = cauchy.rvs(size=N)
```

$$\text{ДИ: } \left( \hat{\mu} - u_{\frac{1+\alpha}{2}} \cdot \frac{\pi}{2\sqrt{n}}, \hat{\mu} + u_{\frac{1+\alpha}{2}} \cdot \frac{\pi}{2\sqrt{n}} \right), \text{ где } u_{\frac{1+\alpha}{2}} - \frac{1+\alpha}{2} - \text{квантиль } N(0, \frac{\pi^2}{4})$$

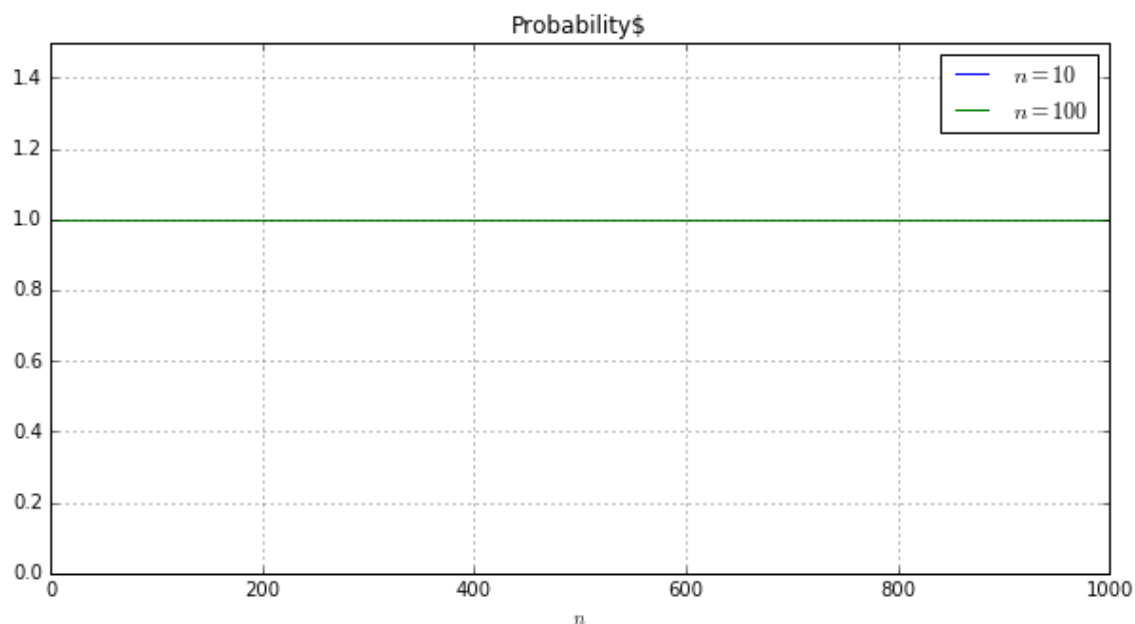
In [16]:

```
def get_one_cauchy(sample, alpha, distr, lam):
    quantile = distr.ppf((1. + alpha)/2)
    median = np.median(sample)
    k = quantile * np.pi/(2*np.sqrt(sample.size))
    return median - k, median + k
```

## Вероятность для n = 10 и n = 100

In [17]:

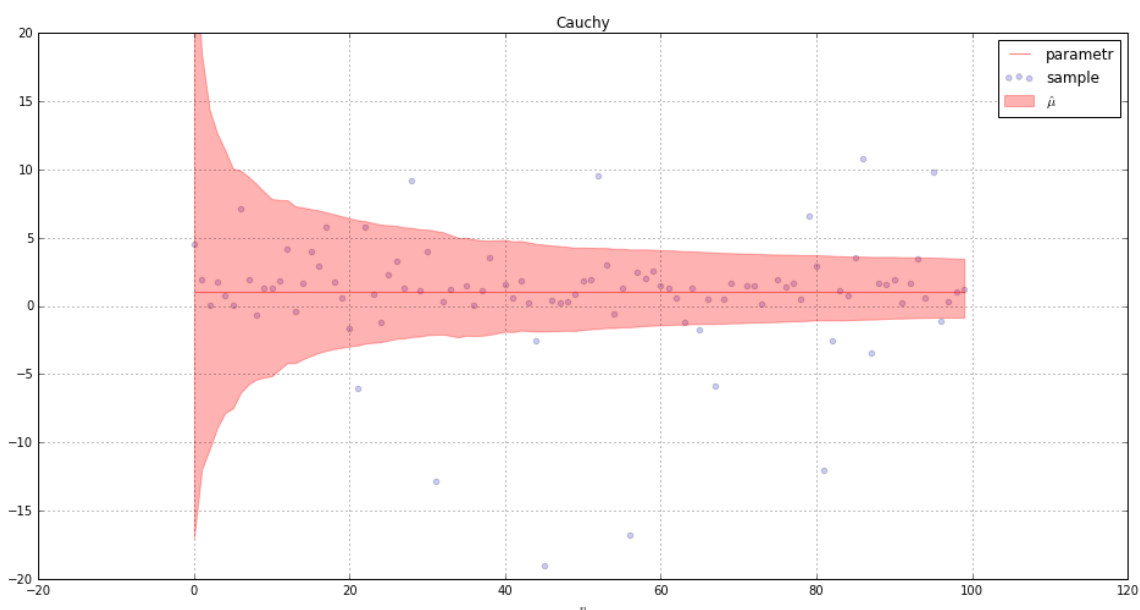
```
probability(get_one_cauchy, 'Probability$', cauchy, first, second, \
amount_of_sample, alpha, theta, lam, 0, 1.5)
```



## График доверительного интервала

In [18]:

```
functions = np.array([get_one_cauchy])
colors = np.array(['red'])
names = np.array(['$\hat{\mu}$'])
plot_graphic(functions, names, 'Cauchy', colors, cauchy, sample_cauchy, alpha,
```



$$Pois(\theta)$$

In [19]:

```
pois = sts.poisson(theta)
sample_pois = pois.rvs(size=N)
```

**ДИ:**  $\left(\bar{X} - u_{\frac{1+\alpha}{2}} \cdot \sqrt{\frac{\bar{X}}{n}}, \bar{X} + u_{\frac{1+\alpha}{2}} \cdot \sqrt{\frac{\bar{X}}{n}}\right)$ , где  $u_{\frac{1+\alpha}{2}}$  - квантиль  $N(0, 1)$ .

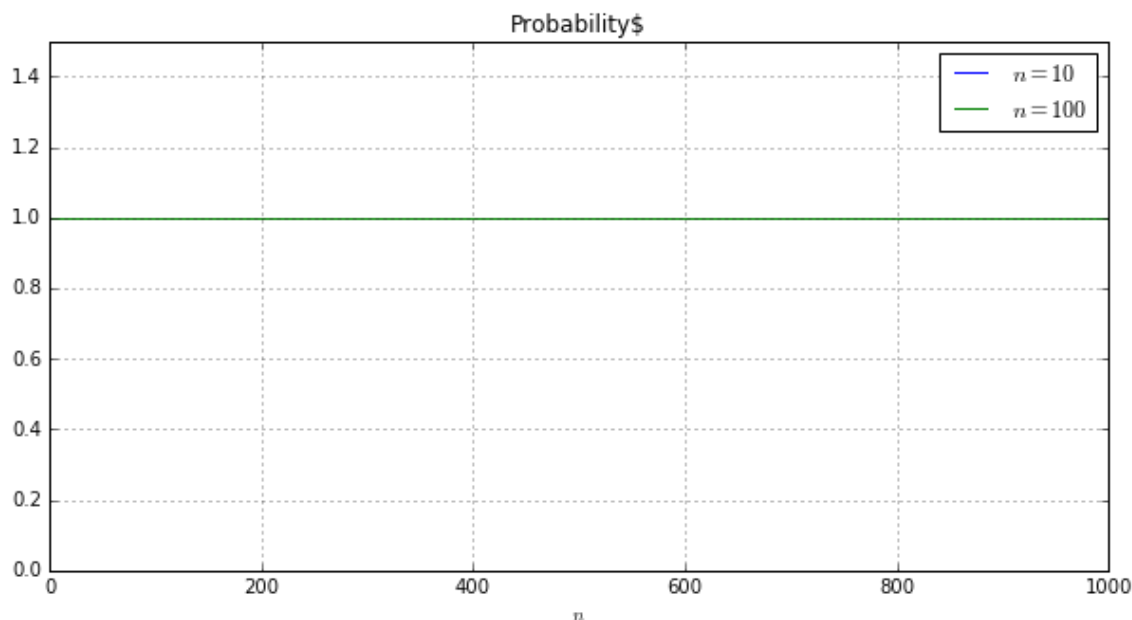
In [20]:

```
def get_one_pois(sample, alpha, distr, lam):
    quantile = distr.ppf((1. + alpha)/2)
    mean = np.mean(sample)
    k = quantile * np.sqrt(float(mean)/np.sqrt(sample.size))
    return mean - k, mean + k
```

## Вероятность для $n = 10$ и $n = 100$

In [21]:

```
probability(get_one_pois, 'Probability$', pois, first, second, \
            amount_of_sample, alpha, theta, lam, 0, 1.5)
```

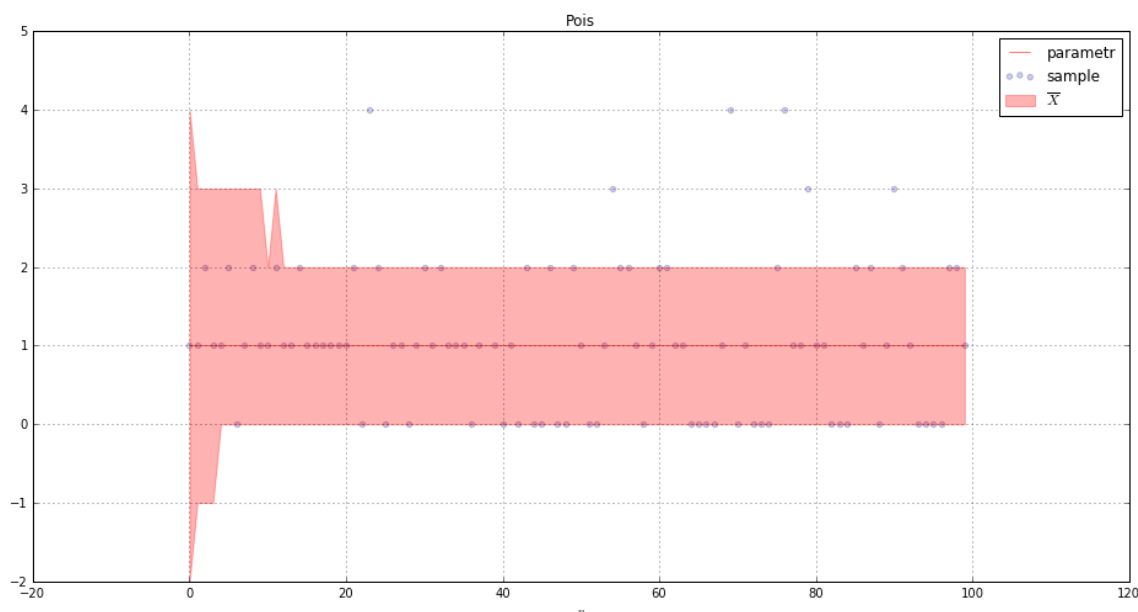


## График доверительного интервала



In [22]:

```
functions = np.array([get_one_pois])
colors = np.array(['red'])
names = np.array(['$\overline{X}$'])
plot_graphic(functions, names, 'Pois', colors, pois, sample_pois, alpha, theta)
```


 $\Gamma(\theta, \lambda)$ 

In [23]:

```
theta = 10
lam = 1
```

In [24]:

```
gamma = sts.gamma(theta)
sample_gamma = gamma.rvs(size=N)
```

**ДИ:**  $\left( \bar{X} - u_{\frac{1+\alpha}{2}} \cdot \sqrt{\frac{\bar{X}}{\lambda n}}, \bar{X} + u_{\frac{1+\alpha}{2}} \cdot \sqrt{\frac{\bar{X}}{\lambda n}} \right)$ , где  $u_{\frac{1+\alpha}{2}}$  - квантиль  $N(0, 1)$

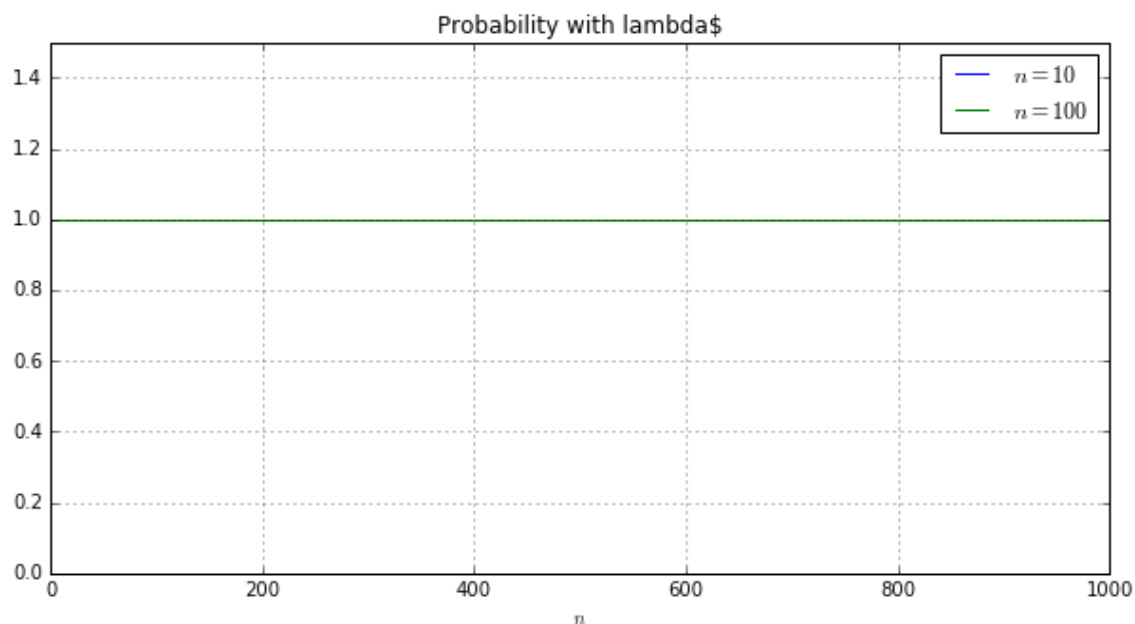
In [25]:

```
def get_one_gamma_with_lambda(sample, alpha, distr, lam):
    quantile = distr.ppf((1. + alpha)/2)
    mean = np.mean(sample)
    k = quantile * np.sqrt(float(mean)/(np.sqrt(sample.size)) * lam)
    return mean - k, mean + k
```

**Вероятность для n = 10 и n = 100**

In [26]:

```
probability(get_one_gamma_with_lambda, 'Probability with lambda$', gamma, first
amount_of_sample, alpha, theta, lam, 0, 1.5)
```



## График доверительного интервала

In [27]:

```
functions = np.array([get_one_gamma_with_lambda])
colors = np.array(['red'])
names = np.array(['$\overline{X}$'])
plot_graphic(functions, names, 'Gamma', colors, gamma, sample_gamma, alpha, th
```

