```
In [1]: import pandas as pd
    import numpy as np
    import matplotlib.pyplot as plt

import warnings
    warnings.filterwarnings("ignore")
```

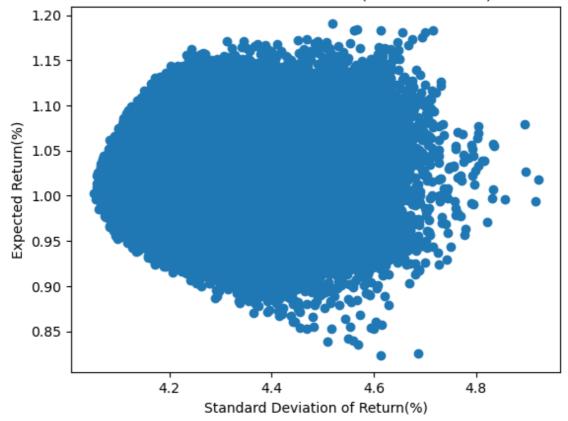
```
In [3]:
       #part 1 Minmum-Tracing-Error Frontier
        #parameters setting
        filename_industry_portfolios = "Exam_Industries.xlsx"
        # df market portfolio = pd.read csv(filename market portfolio, index col=0)
        # df_industry_portfolios = pd.read_csv(filename_industry_portfolios, index
        df_industry_portfolios = pd.read_excel(filename_industry_portfolios, index
        #Ri = E(Ri-Rm)
        se_excess_returns = df_industry_portfolios.apply(np.mean)
        df_covs = df_industry_portfolios.cov()
        V = df covs.copy()
        V_inv = pd.DataFrame(np.linalg.inv(V), columns=V.columns, index=V.index)
        R = se_excess_returns
        e = pd.Series([1]*len(V))
        e.index = R.index
        alpha = R.dot(V_inv).dot(e)
        zeta = R.dot(V_inv).dot(R)
        delta = e.dot(V_inv).dot(e)
        R_mv = alpha/delta
        #part 2 Minimum-Variance Frontier w/o Short Sales
        #
        #parameters setting
        num_vectors = int(1e5)
        num samples = 5
        xlabel = "Standard Deviation of Return(%)"
        ylabel = "Expected Return(%)"
        title = "Minimum-Variance Frontier(No short Sales)"
        normalized_vectors = np.empty((num_vectors, num_samples))
        cov = df_industry_portfolios.cov().to_numpy()
        R = df_industry_portfolios.apply(np.mean).to_numpy()
        for i in range(num_vectors):
            random_vector = np.random.rand(num_samples)
            normalized_vector = random_vector / random_vector.sum()
            normalized_vectors[i] = normalized_vector
```

```
lst_std = []
lst_mean = []

for w in normalized_vectors:
    #var = w*cov*w
    lst_std.append(np.sqrt(w@cov@w))
    #mean = w*R
    lst_mean.append(w@R)

plt.scatter(lst_std, lst_mean)
plt.xlabel(xlabel)
plt.ylabel(ylabel)
plt.title(title)
plt.show()
```

## Minimum-Variance Frontier(No short Sales)



Economic significance of indifference curves

Indifference curve consists of portfolios with same expected utility, when plotted on graph with expected return on y-axis and standard deviation of return on x-axis:  $(\sigma, \mu)$ -space

Shape of indifference curves for risk-averse investor

indifference curve must curve right = $\Rightarrow$  risk-averse investor has convex indifference curves in  $(\sigma, \mu)$ -space, with higher expected utility going north

Indifference curve will become more convex, and also more "tilted", for higher levels of risk aversion (since P2 must lie further north relative to P1)

How investor can use indifference curves to find the optimal investment portfolio on frontier

using indifference curves to identify the tangency point with the efficient frontier