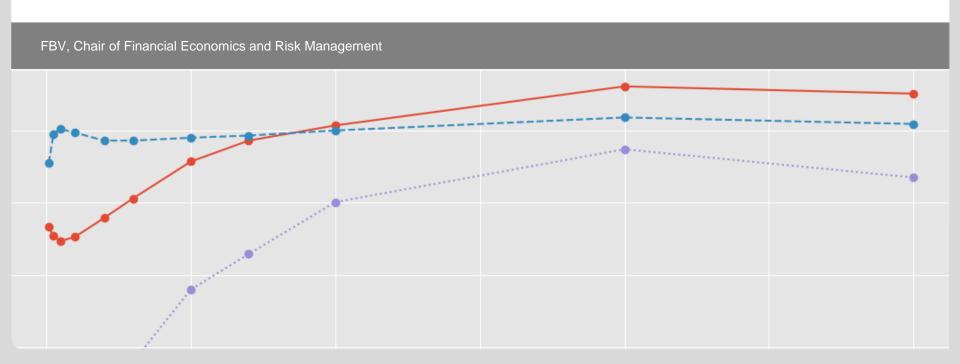


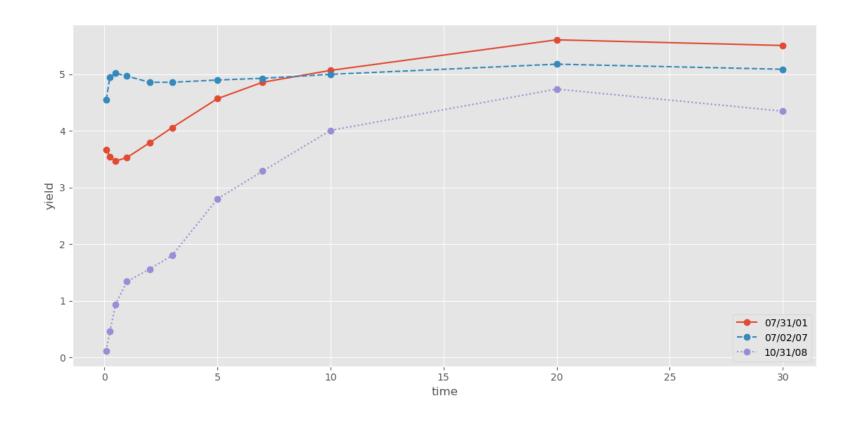
# **Problem Set 5 Statistical Risk Factors and Principal Component Analysis**

Solution submitted by Thi Ha Giang Vo and Lotta Rüter CRAM-Programming Lab WS 2017/18



# **Question 1a: Treasury Yield Curves**





## **Question 1a: Treasury Yield Curves**



- 31/7/2001 and 31/10/2000
  - Normal yield curve, where longer maturity bonds have a higher yield compared to short-term bonds due to the risks associated with time
  - The yield curve for 31/10/2008 changes dramatically because global financial crisis in 10/2008 caused the the yield for the treasury in 2008 to be very low

#### 2/7/2007

 Flat Yield Curve, where the short- and long-term yields are very close to each other



#### **Question 1b: PCA Intuition**

- Methodology: Reduce the dimensionality of correlated data without giving up a significant amount of information about data's second moment
- Main goals of PCA:
  - The transformed TxK data has a diagonal KxK covariance matrix
  - Each orthogonal factor explains the maximal variance possible
  - The transformed data contains the same information as X
- Specific applications of the PCA in risk and asset management:

Prof. Dr. Maxim Ulrich, submitted by Thi Ha Giang Vo and Lotta Rüter

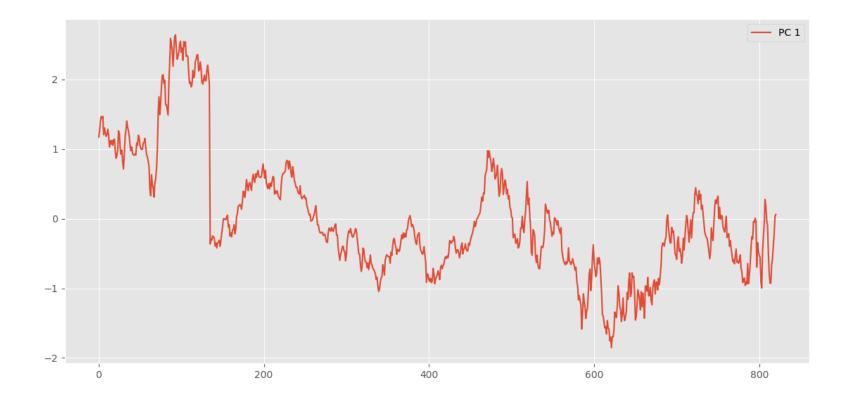
- Extract statistical risk factors
- Improve diversification of porfolio

### **Question 1c: Class 'PCA'**

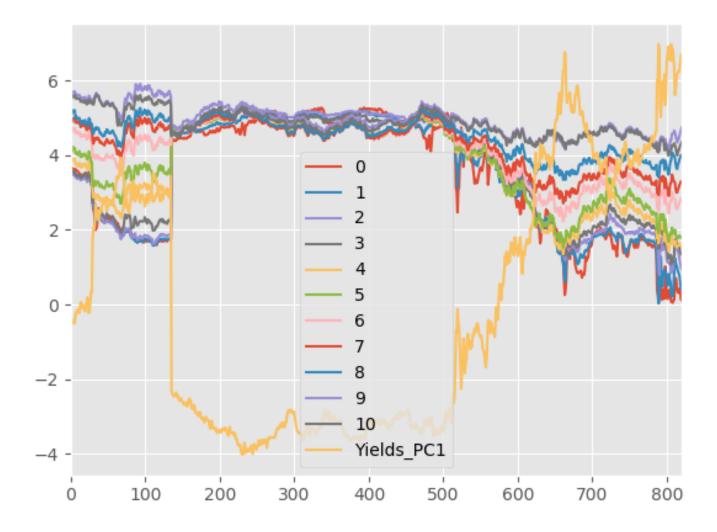


See code.

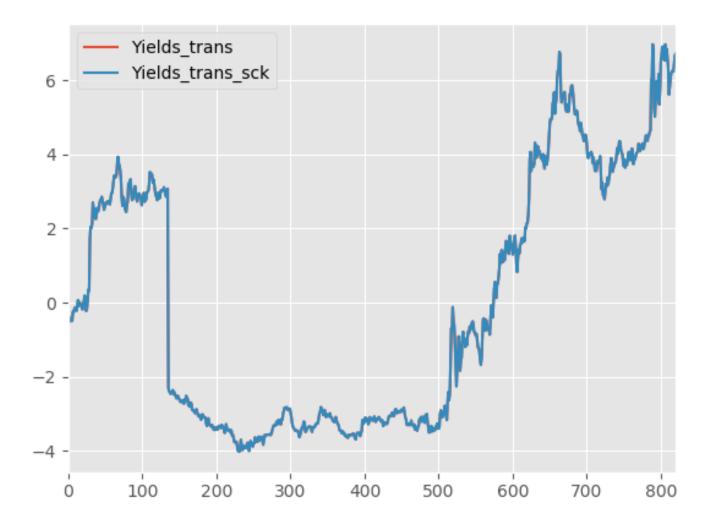














	0	1	2	3	4	5 \
0	1.000000	0.992274	0.980586	0.974837	0.943761	0.910039
1	0.992274	1.000000	0.995143	0.990757	0.959826	0.924269
2	0.980586	0.995143	1.000000	0.997001	0.963748	0.924868
3	0.974837	0.990757	0.997001	1.000000	0.979884	0.948334
4	0.943761	0.959826	0.963748	0.979884	1.000000	0.991700
5	0.910039	0.924269	0.924868	0.948334	0.991700	1.000000
6	0.827853	0.838397	0.832623	0.864946	0.942311	0.975436
7	0.734527	0.741194	0.729865	0.768078	0.869992	0.922169
8	0.641692	0.648847	0.637259	0.679618	0.797190	0.861675
9	0.256500	0.249254	0.221731	0.270859	0.430274	0.533190
10	0.276857	0.265329	0.232635	0.277096	0.426721	0.525575
Yields_F	PC1 -0.98152	21 -0.99037	71 -0.9883	89 -0.9938	31 -0.9881	43 -0.967185
	6 7	' 8	3 9	10	)	Yields_PC1
0	6 7 0.827853	_	_			_
0 1	_	0.734527	0.641692	0.256500	0.276857	-0.981521
_	0.827853	0.734527 0.741194	0.641692 0.648847	0.256500 0.249254	0.276857 0.265329	-0.981521
1	0.827853 0.838397	0.734527 0.741194 0.729865	0.641692 0.648847 0.637259	0.256500 0.249254 0.221731	0.276857 0.265329 0.232635	-0.981521 -0.990371
1 2	0.827853 0.838397 0.832623	0.734527 0.741194 0.729865 0.768078	0.641692 0.648847 0.637259 0.679618	0.256500 0.249254 0.221731 0.270859	0.276857 0.265329 0.232635 0.277096	-0.981521 -0.990371 -0.988389
1 2 3	0.827853 0.838397 0.832623 0.864946	0.734527 0.741194 0.729865 0.768078 0.869992	0.641692 0.648847 0.637259 0.679618 0.797190	0.256500 0.249254 0.221731 0.270859 0.430274	0.276857 0.265329 0.232635 0.277096 0.426721	-0.981521 -0.990371 -0.988389 -0.993831
1 2 3 4	0.827853 0.838397 0.832623 0.864946 0.942311	0.734527 0.741194 0.729865 0.768078 0.869992 0.922169	0.641692 0.648847 0.637259 0.679618 0.797190 0.861675	0.256500 0.249254 0.221731 0.270859 0.430274 0.533190	0.276857 0.265329 0.232635 0.277096 0.426721 0.525575	-0.981521 -0.990371 -0.988389 -0.993831 -0.988143
1 2 3 4 5	0.827853 0.838397 0.832623 0.864946 0.942311 0.975436	0.734527 0.741194 0.729865 0.768078 0.869992 0.922169 0.984161	0.641692 0.648847 0.637259 0.679618 0.797190 0.861675 0.949609	0.256500 0.249254 0.221731 0.270859 0.430274 0.533190 0.700157	0.276857 0.265329 0.232635 0.277096 0.426721 0.525575 0.684056	-0.981521 -0.990371 -0.988389 -0.993831 -0.988143 -0.967185
1 2 3 4 5 6	0.827853 0.838397 0.832623 0.864946 0.942311 0.975436 1.000000	0.734527 0.741194 0.729865 0.768078 0.869992 0.922169 0.984161 1.000000	0.641692 0.648847 0.637259 0.679618 0.797190 0.861675 0.949609 0.987884	0.256500 0.249254 0.221731 0.270859 0.430274 0.533190 0.700157 0.811746	0.276857 0.265329 0.232635 0.277096 0.426721 0.525575 0.684056 0.790748	-0.981521 -0.990371 -0.988389 -0.993831 -0.988143 -0.967185 -0.902241
1 2 3 4 5 6 7	0.827853 0.838397 0.832623 0.864946 0.942311 0.975436 1.000000 0.984161	0.734527 0.741194 0.729865 0.768078 0.869992 0.922169 0.984161 1.000000 0.987884	0.641692 0.648847 0.637259 0.679618 0.797190 0.861675 0.949609 0.987884 1.000000	0.256500 0.249254 0.221731 0.270859 0.430274 0.533190 0.700157 0.811746 0.879523	0.276857 0.265329 0.232635 0.277096 0.426721 0.525575 0.684056 0.790748 0.853961	-0.981521 -0.990371 -0.988389 -0.993831 -0.988143 -0.967185 -0.902241 -0.819309
1 2 3 4 5 6 7 8	0.827853 0.838397 0.832623 0.864946 0.942311 0.975436 1.000000 0.984161 0.949609	0.734527 0.741194 0.729865 0.768078 0.869992 0.922169 0.984161 1.000000 0.987884 0.811746	0.641692 0.648847 0.637259 0.679618 0.797190 0.861675 0.949609 0.987884 1.000000 0.879523	0.256500 0.249254 0.221731 0.270859 0.430274 0.533190 0.700157 0.811746 0.879523 1.000000	0.276857 0.265329 0.232635 0.277096 0.426721 0.525575 0.684056 0.790748 0.853961 0.983053	-0.981521 -0.990371 -0.988389 -0.993831 -0.988143 -0.967185 -0.902241 -0.819309 -0.737426 -0.355724

### **Question 1e: Importance of the PCs**



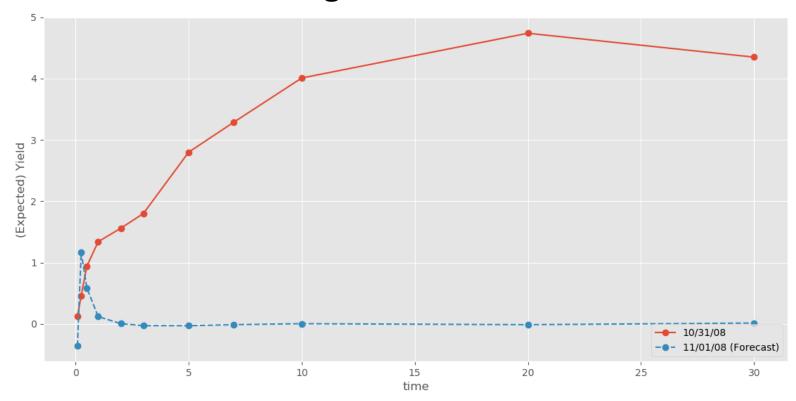
Explained variance ratio of PCs:

[0.928 0.062 0.008 0.002 0. 0. 0. 0. 0. 0. 0. ]

-> we choose the first two PCs as 99% of the variance of the data is explained by both PCs

# Karlsruher Institut für Technologie

### **Question 1f: Forecasting the Yield Curve**



Invest into 3-month-bond as it shows highest expected yield