





#### October 2017

### Big Data and Application on Pension Fund Investments

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# **Big Data and providers : lost in translation**





### **BIG DATA : Disruption in the « real world »**

- Past : From Data (storage: 5 Exabytes from prehistory to 2003)
- Present : Big Data : 5 Exabytes per day but 3.5% of data collected are really used
- Future : to Smart Data : smart cleaning, smart linking, smart thinking





# **BIG DATA: No disruption in Finance, just another way to focus on data !!**

### - Sixties

Beginning of index management on one hand... beginning of quantitative management on the other hand.

### - Eighties/nineties,

Index management becomes « tilted » management on huge investment universe (DM & EM) relying on internal and/or external information system.

### - Nineties and internet bubble,

Internet and data suppliers provide more and more (too much ?) information, but quality is degrading.

### - 2003 - 2007

Safe heaven for quantitative stock picking: clean financial information is transformed into relevant added value.

### - 2008 schism

Absolute performance leads relative performance. Issue move from micro assessment to macro perspectives...

## (Macro) Big Data 2008 – 2016 = (Micro) Big Data 80-90 ...



## How Big Data are Applied

 Satellite imagery and pattern analysis: Objective insights from geospatial data, wireless network signaling data and pattern analysis.

Providers: RSMetrics, SpaceKnow, EidoSearch,, AirSage, Datascription

 Events and Transactions: Unstructured events and financial transaction data such as insider and M&A deals, for predictive analytics.

Providers: Capital IQ-Key events and Future events, Thomson reuters deal, Bloomberg, Capial IQ, 2iQ, Thomson reuters Activism, Wall Street Horizon, Thomson reuters News Analytics, RavenPack News Analytics, Factset Deal Analytics

 Crowd Sourcing: Harnessing the wisdom of the crowd through insights and emerging trends.

Providers: Estimize, Google Trends, Data Explorer (Marki)

- New sentiment, Web mining and Social media: Investor mood, sentiment and actionable ideas from web and social media platforms.

Providers: RavenPack News Analytics, Thomson reuters Newscope, Alexandria Technology, Newsquantified, Market prophit, LinkUp, Accern, Recorded Future, Alphasense, Benzinga

- Macroeconomic Data: A collection of global macroeconomic indicators and forecasts.

Providers: Haver, Bloomberg Economics, Datastream, Bluechip, Action Economics, FRED, World Bank data, OECD data, IMF country default import/export



## **Big Data and providers (DB research)**

ESG (Bcause), BizQualify (Labor force)

- Multi-dimensional Data: Supply chain linkage, investor ownership and analyst forecasts.

Providers: Thomsson Reuters ownership, factset ownership, Caopital IQ ownership, Revere – Factset, Blommberg supply chain, Compustat supply chain, Bureau of Econcomic Analysis (BEA), Capital iQ supply chain, Thomson Reuters supply chain, IBES Detail

 Cross Asset: Fixed income and options data, global fund flow and hedge fund performance.

Providers: Hedge fund research (HFR), DB eDerivatives database, OptionMetrics, Fixed Income Database (DBIQ), EPFR, Morningstar Funf flow data, Liper Fund fund flow data

### - Industry specific: Integrating the fundamental views in quantitative models.

Providers: Capital IQ Industry specific SNL, Reuters Industry Data, Compustat Industry Specific, Compustat Bank & Thrift, Compustat bank regulatory

Multi-dimensional Data: Supply chain linkage, investor ownership and analyst forecasts

### - High Frequency: Tick by Tick data for low latency traders and traditional investors.

Providers: TAQ – KDB Tick database (NYSE feed), Reuters data feed, Bloomberg, Ablemarkets, One Tick

 Accounting and Socially Responsible Investing: Sustainable, responsible and impact investing (SRI), through the environmental, social, governance (ESG) criteria
 Providers: MSCI ESG, GMI, AGR & AAER, Trucost Environmental Data, Thomson reuters Asset4, Bloomberg

> Amundi ASSET MANAGEMENT

# Implication of Big Data in Quant Equity

- Value of the data:
  - Data means information
  - Data may have a cost
  - Data may be sensitive or strategic
  - Data may be confidential

 Smart beta and factor investing are two examples of how big data is transforming the investment landscape



# The power of data and machine learning in asset management : J Rodriguez-Alarcon

# Equity Alpha Investment Pillars

Discovering Investment opportunities through data-driven analysis



### A disciplined data-driven approach can uncover investment opportunities

Number of factors and weights are shown are as of June 30, 2017. There is no guarantee that these objectives will be met.



### **Factor Investing Mapping**

**CAP-WEIGHTED MIN. VARIANCE & VOLATILITY RISK BASED RISK PARITY SMART BETA** MAX DIVERSIFICATION **STATIC FACTORS FACTOR BASED DYNAMIC FACTORS FUNDAMENTAL** RAFI **MONO FACTOR RETURN BASED** STATIC FACTOR **MULTI FACTOR** DYNAMIC

> A quant stock-picking approach capturing performance through **"return" factor combination** according to market regime

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Big Data at CPR AM in PMS (In-house quantitative research tool)





# **Big Data at CPR AM in PMS - Global Map**



ASSET MANAGEMEN

asset management

### **Big Data at CPR AM in PMS - Coverage**

8000 alive stocks
 Developed markets
 Emerging markets
 All sectors, industries
 and countries... with
 financial criteria
 updated on a daily
 basis and risk items
 updated on a monthly
 basis

_	60	Coeff	icient Transfert	e Money	Risk Attributi		dd Benchmark	S Agrée	uate 4	bsolue -	1	Trade Scree	n Rel R	eaion	Mobile	-	
2	$(\mathbf{r})$	Found	anno de Disque 🖉 Mare	ical Dick	Rose Acceloude	WorldLocal( 🔻 🤷	idd Eiold	Z hgitog	Dortfolio I	loboluc e.g	+ Decimal	Ouncir Deafi		ostour 🗌	Target Brice Deb		
rir	Optimiser		www.communications.com	and Pushing		16/08/2017 ·	add the base	D Aturat		Celauve	- Decimal 👸	Cours Dec 6			rarget Price Deb		
<i>c</i> .		💽 кера	uaon 💽 Tubir	ed Return	R Squared		vad Univers	E Ajusti	er Ptr Optim F	kel, Indice	Ľ	) Save Profil	buy	Sel	Curren	•	
ereul			K	asques		4			vue		A	ouuis	4		curve	4	1
Ouvrir Ba	acktest X	ABF00	5-04/10/2017 ×														
<b>^</b>	Isin	Sedol	Libellé	Devise	Cotation	Secteur Gics - Niv 4	ABF005 (122) 04/10/17	Msci EMU (241) 04/10/17	Arcco Quant 1 (109) 04/10/17	Euroland vif (127) 04/10/17	EuroStx300 (300) 04/10/17	Apoline (136) 04/10/17	Momentum 04/10/17	Diffusion 04/10/17	Earning Momentum 04/10/17	Earning Trend 04/10/17	Alpha Blend Neu 04/10/17
1 500	0000100404	5052042	A		Davis Ché	Untelle Descrite & Contine Lines	0.1020/	00/	0.1020	0.1020/	0.0110/	0.4000	0.701	0.520	1 007	1.074	
C EDC	0000120404	D1002042	Accor SA	EUR	Paris-SDI	Technickiel Cases	-0.192%	0%	-0.1927	-0.192%	0.011%	0.402%	-0.761	-0.559	-1.207	-1.874	
5 FRU	0000120073	BITABJ/	Air Liquide	EUK	Paris-Sor	Industrial Gases	-0.192%	0%	-0.186%	-0.028%	-0.059%	-0.682%	-0.514	-0.983	-0.809	-0.634	
7 PRU	0015281847	ргээкQ7	Bollore	EUR	Paris-Sor	Multi-Sector Holdings	-0.09%	0%	-0.09%	-0.09%	-0.005%	-0.09%	-0.040	-0.304	-0.616	-0.867	
11 DEC	0002169999	01304K0	Symnse Ag	EUK	Xeu a (Frankiu	Specialty Chemicals	-0.197%	0%	-0.197%	-0.197%	-0.012%	-0.197%	-0.775	-1.195	-0.658	-0.124	
13 FRU	0010220475	BUDJaQ5	Alstom	EUK	Paris-Sor	Construction & Parm Machinery & H	-0.137%	0%	-0.13/%	-0.137%	-0.004%	-0.137%	0.321	-0.2/1	-0.406	-0.541	
22 PR0	0000051752	7000400	Alus Origin Sa	CUR	Paris Ché	The Consulting & Other Services	0.462%	0%	0.481%	0.515%	-0.022%	-0.001%	0.4	-0.245	-0.2	-0.155	
23 FR0	0000120528	/088429	AAA SA	CUR	Paris-SOT	muru-line Insurance	0.569%	0%	0.538%	0.5/9%	0.021%	-0.51/%	0.468	0.668	0.305	-0.058	
28 FR0	0000121147	4400446	Haureda	EUR	Paris-Sbf	Auto Parts & Equipment	0%	0%	0%	0%	0.104%	0%	1.403	1.252	1.002	0.752	
30 FR0	0000120966	5298781	Societe BIC SA	EUR	Paris-Sbf	Office Services & Supplies	-0.065%	0%	-0.065%	-0.065%	-0.007%	-0.065%	-1.544	-1.635	-1.24	-0.845	
32 FR0	0000131104	7309681	Bnp Paribas	EUR	Paris-Sbf	Diversified Banks	0.274%	0%	0.304%	0.171%	-0.049%	0.048%	0.807	1.011	0.538	0.065	
36 FR0	0000120503	4002121	Bouygues	EUR	Paris-Sbf	Construction & Engineering	-0.213%	0%	-0.213%	-0.213%	0.058%	0.352%	0.446	0.4	0.16	-0.081	
46 FR0	0000125338	4163437	Cap Gemini Sa	EUR	Paris-Sbf	IT Consulting & Other Services	-0.397%	0%	-0.397%	0.121%	0%	0.321%	-0.12	-0.223	-0.148	-0.072	
49 FR0	0000120172	5641567	Carrefour Sa	EUR	Paris-Sbf	Hypermarkets & Super Centers	-0.003%	0%	0.008%	0.009%	0.008%	0.25%	-2.378	-2.457	-2.107	-1.757	
50 FR0	0000125585	4178419	Casino Guichard Perrac	EUR	Paris-Sbf	Food Retail	0.311%	0%	0.322%	0.259%	-0.004%	0.331%	-0.782	-0.947	-1.033	-1.119	
69 DEC	0005501357	4647317	Axel Springer AG	EUR	Xetra (Frankfu	Publishing	-0.067%	0%	-0.067%	-0.067%	-0.002%	-0.067%	0.25	0.138	0.266	0.393	
81 FR0	0000120644	B1Y9TB3	Danone SA	EUR	Paris-Sbf	Packaged Foods & Meats	-0.012%	0%	0.59%	0.181%	0.005%	-0.993%	-0.74	-0.859	-0.605	-0.352	
82 FR0	0000121725	4067164	Dassault Aviation Sa	EUR	Paris-Sbf	Aerospace & Defense	-0.085%	0%	-0.085%	-0.085%	-0.009%	-0.085%	-0.033	-1.082	-0.787	-0.493	
84 FR0	0000130650	5330047	Dassault Systemes Sa	EUR	Paris-Sbf	Application Software	-0.279%	0%	-0.279%	-0.279%	0%	-0.279%	-0.523	-1.333	-0.863	-0.392	
96 FR0	0000130452	B13X013	Eiffage	EUR	Paris-Sbf	Construction & Engineering	0.642%	0%	0.675%	0.637%	0.043%	1.11%	0.888	1.239	0.921	0.603	
104 FR0	0000121667	7212477	Essilor International	EUR	Paris-Sbf	Health Care Supplies	-0.547%	0%	0.612%	-0.547%	-0.001%	-0.547%	-1.314	-2.033	-1.418	-0.804	
107 FR0	0000121121	7042395	Eurazeo	EUR	Paris-Sbf	Multi-Sector Holdings	-0.083%	0%	0.484%	-0.083%	-0.006%	-0.083%	1.667	1.698	1.665	1.633	
109 FR0	0000038259	5972643	Eurofins Scientific	EUR	Paris-Sbf	Life Sciences Tools & Services	-0.149%	0%	-0.149%	-0.149%	-0.013%	-0.149%	0.814	1.036	0.984	0.933	
129 FR0	0000133308	5176177	Orange (FR Listing)	EUR	Paris-Sbf	Integrated Telecommunication Servi	. 0.562%	0%	0.549%	0.034%	-0.032%	0.022%	-0.549	-0.335	-0.337	-0.339	
132 FR0	0010040865	7742468	Gecina Sa	EUR	Paris-Sbf	Diversified REITs	-0.159%	0%	-0.159%	-0.159%	-0.011%	-0.159%	0.241	1.048	1.045	1.041	
156 FR0	0000052292	5253973	Hermes International	EUR	Paris-Sbf	Apparel, Accessories & Luxury Goods	-0.332%	0%	-0.332%	0.065%	-0.042%	-0.332%	-0.494	-1.567	-1.133	-0.7	
165 FR0	0000120859	B011GL4	Imerys Sa	EUR	Paris-Sbf	Construction Materials	0.466%	0%	0.535%	0.601%	-0.009%	0.862%	-0.443	-0.922	-0.795	-0.669	
175 FR0	0000125346	4196897	Ingenico	EUR	Paris-Sbf	Electronic Equipment Manufacturers	-0.115%	0%	-0.115%	-0.115%	-0.005%	-0.115%	0.025	0.136	0.212	0.288	
183 FR0	0000121964	7582556	Klepierre	EUR	Paris-Sbf	Retail REITs	-0.179%	0%	-0.179%	-0.179%	-0.019%	-0.179%	-0.658	0.949	0.175	-0.599	
184 FR0	0000120321	4057808	L'oreal	EUR	Paris-Sbf	Personal Products	-0.309%	0%	-0.22%	0.02%	-0.09%	-1.126%	-1.132	-2.476	-1.625	-0.774	
189 FR0	0000130213	4547213	Lagardere S.C.A.	EUR	Paris-Sbf	Publishing	-0.082%	0%	-0.082%	-0.082%	-0.014%	-0.082%	0.038	-0.28	-0.204	-0.127	
195 FR0	0000065484	4508663	Lectra	EUR	Paris-Sbf	Application Software	0%	0%	0%	0%	0%	0.41%	0.224	-1.064	-0.765	-0.465	
203 FR0	0000121014	4061412	Lvmh Moet Hennessy L	EUR	Paris-Sbf	Apparel, Accessories & Luxury Goods	0.248%	0%	0.301%	0.246%	-0.125%	0.43%	0.581	0.094	0.063	0.032	
209 FR0	0000121204	7390113	Wendel	EUR	Paris-Sbf	Multi-Sector Holdings	-0.097%	0%	-0.097%	-0.097%	0%	-0.097%				1.4	
216 FR0	0000121261	4588364	Compagnie Generale de	EUR	Paris-Sbf	Tires & Rubber	-0.122%	0%	0.267%	0.007%	0%	0.306%	0.305	-0.272	-0.113	0.046	
223 FR0	0000120685	B1HDJL2	Natixis	EUR	Paris-Sbf	Diversified Banks	-0.161%	0%	-0.161%	-0.161%	-0.014%	0.445%	1.617	2.176	1.56	0.943	
235 FR0	0000120693	4682329	Pernod-Ricard Sa	EUR	Paris-Sbf	Distillers & Vintners	-0.627%	0%	-0.627%	-0.627%	-0.043%	-0.627%	-1.238	-2.661	-1.842	-1.022	
236 FR0	0000121501	7103526	Peugeot Sa	EUR	Paris-Sbf	Automobile Manufacturers	0.092%	0%	0.078%	0.033%	0.009%	-0.266%	1.066	1.037	0.824	0.612	
238 FR0	0000121485	5505072	Kering (FR Listing)	EUR	Paris-Sbf	Apparel, Accessories & Luxury Goods	0.754%	0%	0.538%	0.011%	-0.078%	-0.639%	1.471	1.457	0.928	0.398	
239 FR0	0000124570	B08V9H4	Plastic Omnium	EUR	Paris-Sbf	Auto Parts & Equipment	0%	0%	0%	0%	0.057%	0.062%	0.462	0.809	0.476	0.143	
245 FR(	0000130577	4380429	Publicis Groupe	EUR	Paris-Sbf	Advertising	0.184%	0%	0,196%	0.17%	-0.002%	-0.304%	-1.242	-1.198	-0.993	-0.788	



# **Big Data at CPR AM in PMS - In-House base News**

Restaurer Profils	Base News IC Analy Outils	yzer Market Fiche Timing Structure	Portefeuilles calculés	Agrégats Formules																
Ouvrir E	acktest 🗙 🍃 AB	3F005 - 04/10/2017 ×	🕌 IC Analyzer 💠	🗙  💐 Base News 🗙												×				
Periode	05/09/2017 <b>•</b>	05/10/2017 🔹	2 d												Instrument detail #					
Date 👻	Perf Code ISIN	Libellé	Important Note	Commentaire	Auteur	Région	Pays	Secteur	Libel	Categorie	File J Broker Sou	rce ^	Date	Auteur	Commentaire	- T -				
9										-		=	9							
05/10	FR001024	Electricite De France		Edison (Groupe EDF) et 2i R	labbe	EURP	FR	5510	Utilities	Communi	CIC				a dit aux Etats européens avoir pris la décision stratégique réinternaliser la conception de certains travaux sur le carér	e de nage				
05/10	ES011687	Gas Natural Sdg Sa		A reconnu être en train de n	labbe	EURP	ES	5510	Utilities	Restruct	Societe ge	nerale	• 05/10/2017	labbe	moteurs plutôt que de continuer à la confier à certains	ite				
05/10	FR000012	. Vivendi		Bureaux perquisitionnés par	labbe	EURP	FR	5010	Telec	Juridique	Exane				internet de l'avionneur européen.					
05/10	GB005982	Dialog Semiconductor Plc		annonce l'acquisition de l'am	canard	EURP	DE	4530	Semic	Communi	Autres				Un super jumbo A380 d'Air France, qui assurait la liaison					
05/10	FR000005	FR000005 Atos Origin Sa		a annoncé mercredi l'acquisit	labbe	EURP	FR	4512	IT Co	M&A	Kepler	Kepler		labbe	raison d'une importante panne sur l'un de ses moteurs, sar	ns				
05/10	FR000005	FR000005 Ubisoft Entertainment		a annoncé hier le lancement	labbe	EURP	FR	4511	Soft	Communi	Kepler	Kepler			dommages pour ses 520 occupants.					
05/10	DE000A12	. Scout24 AG		Hellman&Friedman a cédé 1	labbe	EURP	DE	4511	Soft	Communi	Kepler		28/09/2017	canard	d'A350.	a iuc				
05/10	FR000012	. Eurazeo	+	a annoncé son intention de	labbe	EURP	FR	4012	Speci	Communi	Kepler			labbe	a ouvert mercredi en Chine un centre de finition pour g					
05/10	IT000510	Banca Carige Spa		Les autorités de supervision	canard	EURP	Π	4011	Banks	Juridique	CIC		20/09/2017		européen, qui dispute à grement à son rival Boeing un ma					
05/10	FR000012	. Natixis		Bureaux perquisitionnes par	labbe	EURP	FR	4011	Banks	Juridique	Exane				chinois à l'insolente croissance.					
05/10	FR001127	Permentaig SA		AUGMENTATION DE CAPITA	labbe	EURP	FR	3521	Biote	Communi	Gibert Dup	oont	18/09/2017	canard	Eurofighter					
05/10	CH000900	. Barry Calebaut Ag-reg	_	Barry Calebaut a finalise rac	labbe	EURP	CH	3020	Food,	MaA	Kepler		18/09/2017	herent	lance une nouvelle enquête interne après des révélations o	du				
05/10	ED000012	Mpp Pic		a pagenet up accord avec la	labbe	EURP	GD	2541	Media	Maa	Kepler		14/09/2017	labbe	Cathay Padic a annoncé merzetá on intention de report d'un an les Ivraisons de six gros porteurs Arbus (A350-1) qu'elle devat recevir en 2020 el le rempiscement d'une commande de six autres appareils (A350-1000) par de plus petito modeles (A350-900) afin de réduire ses colts. En revandre, la compagnia e finalisé la commande de 32 augustar d'un protocie d'accord no contraignant annoncé el 21,08 au prix catalogue de 3.3944630, Ces apparelis aeront livré en 2019 et 2020.	er				
05/10	FR000012	Fie SA		Eurazeo a annoncé con inte	labba	FLIDD	ED	2021	Com	Communi	Kepler					00)				
05/10	DE000723	Siemens AG		a annoncé la cession de sa n	labbe	FURP	DE	2021	Canit	Communi	Kepler					5				
05/10	CH000081	. Oc Oerlikon Corp An-ren		Oerlikon rachète Primateria	labbe	EURP	СН	2013	Capit	M&A	Kepler					ns				
05/10	ES014341	Gamesa Corp Techolog	_	Les prix de l'épergie églienn	labbe	FURP	ES	2013	Capit	Communi	Societe de	nerale								
05/10	FR001030	Legrand Sa		A lancé une émission obligat	labbe	EURP	FR	2012	Capit	Dette	Societe ge	nerale								
05/10	DE000LED	DE000LED Osram Licht AG		placement de 18.15m de titr	labbe	EURP	DE	2012	Capit Communi	Communi	Kepler				La plus grande compagnie aérienne long-courrier du monde	2,				
05/10	FR000012	Dassault Aviation Sa		La France n'aurait pas renon	canard	EURP	FR	2011	Capit	Communi	Kepler		08/09/2017	labbe	eminatemental A 200 d'Arbas avant de passe une commanda programme A 200 d'Arbas avant de passe une commanda mille en faveur d'un accord au salon de l'avation de novo a Dubai, le president de la compagne aérienne Tim Clark affahe une réformat d'un accord au salon de la vante que la valeur A 200 augés pouvait c'huter rapagne aérienne Tim Clark affahe une réformat d'une accéleration de rythme ventes de l'As30) anis que le prix proposé. Arbas avait	de				
▶ 05/10	NL000023	Airbus Group NV		a dit aux Etats européens a	labbe	EURP	FR	2011	Capit	Communi	Kepler					s nbre				
05/10	FR001275	. SPIE SA		annonce la signature d'un co	labbe	EURP	FR	1512	Mater	Communi	Gilbert Dup	oont				dec				
05/10	BE000347	Solvay Sa		Solvay accroît sa production	labbe	EURP	BE	1511	Mater	Communi	Kepler					ès				
05/10	FR000012	TOTAL S.A.		Total cherche à développer I	labbe	EURP	FR	1010	Energy	Communi	Kepler					des				
04/10	1.96 % FR001326	. Rubis		annonce le rachat auprès de	canard	EURP	FR	5510	Utilities	M&A	CIC				annoncé en juillet qu'il réduirait la production de huit l'A380 2019, contra 15 en 2017 et 28 en 2016	) en				
04/10	-5.47 % IT000349	Telecom Italia Spa		: 1/Le président de la Cassa	canard	EURP	Π	5010	Telec	Communi	CIC				A la suite de la revue annuelle portant sur la composition d	e				
04/10	2.14 % FR000012	. Vivendi		: 1/Le président de la Cassa	canard	EURP	FR	5010	Telec	Communi	Autres				ses indices , Deutsche Börse a fait savoir hier soir que le					
04/10	-1.37 % SE000010	LM Ericsson Telefon AB		Sa filiale espagnole serait en	canard	EURP	SE	4521	Com	Communi	Autres		01/09/2017	labbe	britannique BT au sein de l?indice Stoxx Europe 50, ce					
04/10	-0.85 % FR000411	. Esi Group		annonce le lancement de la	labbe	EURP	FR	4511	Soft	Communi	Gibert Dup	Gilbert Dupont 🗸			changement étant effectif à l'ouverture de la séance du 18 septembre prochain.					
Input New	5											\$			Qantas devrait annoncer ce vendredi un programme de					
Date	05/10/2017		▼ Instrument	Airbus Group NV 👻							Ψ	Edit			réaménagement intérieur de sa flotte d'Airbus A380. La compagnie australienne, qui exploite aujourd'hui 12 super					
Categorie	rie Communication financière		<ul> <li>Secteur</li> </ul>	Secteur Capital Goods - Aerospace					<ul> <li>Insert</li> </ul>				25/08/2017	labbe	jumbos, a décidé d'investir dans l'A380.De plus, plus la compagnie envisage le lancement de vole d'une d'une de 20	20				
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Note	Neutre			Auteur la										A regu 4 commandes d'avions (3 A320-200 et 1 A350-100	)) et					
Broker Sourc Commentaire	a dit aux Etats euro	opéens avoir pris la décision	stratégique de réir	v joindre fichier	arénage m	noteurs plu	itôt que d	le continuer a	à la confier à 🔺	Delete	07/08/2017	canard	Airbus a reçu 205 commandes nettes d'avions et a livré 35 appareils. Dowjones	3						
	certains fournisseu	rs, IIt-on sur une présentabl	on disponible sur le	site internet de l'avionneur europ	een.								27/07/2017	labbe	Commandes S1 €37.2Mds, CA S1 €28.71Mds, T2 €15.7Mds Cons €15.97Mds, Ebit ajusté T2 €859M vs Cons 877.6M, livraison de 8.4380 en 2019 et le groupe confirme ses guidances Fy 17.	s vs				
															Qatar Airways a annulé quatre commandes d'A350-900 en					



### Big Data at CPR AM in PMS - Backtest of multi-factor Strategy





### **Big Data at CPR AM in PMS - Information Coefficient on Multi**factor Strategy





# **Big Data at CPR AM in PMS - Risk Tools**





### Warning: Big Data and finance : Qualitative in quantitative

- Is the best search engine in the world relevant for forward looking?





### Warning: Be careful with the « meaningless » correlation of data



tylervigen.com



# Warning: AI is already relevant in corporate earnings (not a yesterday story, a current story)

#### Figure 6. The impact of AI on profits by industry

Share-of-profit increase per industry between baseline in 2035 and AI steady state in 2035 (%)





Source: Accenture and Frontier Economics

# AI and Big Data: new portfolio managers' profile ?







### Yesterday's PM ?

# Today's PM ?

# Tomorrow's PM ?



## **Q&A: BIG DATA in the Equity Investment Process**

### Q: Big Data diffusion and its impact on equity investment process ?

A: No disruption, just on-going business. But questions are numerous: which kind of data ? (Data means information, Data may have a cost, Data may be sensitive or strategic, Data may be confidential).

### Q: What are the detailed impact of Big Data in each step of the Investment Process

A: BIG DATA is effective everywhere and increases the « take into account » speed of financial and non financial information, the weight of AI depends on systematic part of the investment process:

- Expected return assessment: Corporate analysis / research.
  - Operational research neural network Robot advisors: asset allocation advisory Google trend (text analysis as for Fed's comment or corporate reports).
- Portfolio construction: risk model (variance/covariance matrix estimate: BARRA or APT (Aptimum) or Axioma etc...) address the demand correctly.
- Trading: more and more smart algorithms to enhance trading quality and relevance. These algorithms are AI. High frequency trading (submarine cable to win 3 millisecondes by operation).
- In asset allocation advisory: robot advisors are more and more present.



### **Q&A on BIG DATA in Equity Investment Process**

# Q: Which kind or Asset Manager invest in BIG DATA and AI ? PM's profile evolution ?

A: Active managers (not passive). With an impact on portfolio managers' profile: a mix combination of economic, financial analysis, mathematical and data processing expertise. We follow 8000 stocks through accounts, markets and consensus data on a daily basis. We rely on multi profile PM gathered by SFAF and CFA.

### Q: Is the Future closer to enhanced PM or equity management without PM ?

A: We provide « expertise driven equity quantitative management » or « Multi-factor equity management » . PM have developed models , know their limits and are able to take the lead each time it is necessary. You cannot put everything in one model !!

However, Smart beta and factor investing are two examples of how big data is transforming the investment landscape and AI takes « step by step » human intelligence's place to exploit Big Data.

Internet didn't kill books, Big Data won't kill PMs but will impact more and more their tools and profiles !!



### Key messages from the European Quantitative Investing Conference: Big Data and AI in Finance (GS september14th 2017)

- There is a LITTLE alpha in structured data (numbers), but there is a BIG alpha in non-structured data (voice, text, video)
- Impact of BIG DATA in investment process: Big Data talks to quants and fundamental PM, and may be more to fundamental PM. Ideas will always be different from technics and details, mainly when clients understand PM's ideas
- Natural Language Processing enhanced company search, avoiding usual traps such as double speaking, text written by a
  person not knowing anything about the subject, identifying the exposure of the company to the topic. It allows Quants to become
  more fundamental and fundamental to become more systematic. What about text written by machine ? More and more a
  reality in financial (Bloomberg) and classical news (Washington Post)
- Machine learning and AI are better for risk based approach than for alpha detection due to subjectivity of selection.
- Only DATA matters, the rest is technic and time.
- Transparency (in methodology used to create value with data) is mainly helpful but sometimes it may cause harm
- 3 researchers "PM in finance" and 1 researcher "in real life". Researcher/PMs explain with a lot of details their skill and expertise and conclude after all that human is the key of the process. Researcher (real life) explains that algorithm do better than human in average (GO, Check, decision without emotion during crisis, etc...). Example given by the moderator: you put your music selected lists in Spotify and sometimes you let the program choose music and... it's good, you discover new songs, like them and include them in your selected lists...
- 90% of the added value is DATA storing and cleaning, the boring business is more important that the funny business
  of machine learning development (true for equity management too !!)



## Conclusion

- BIG DATA in finance is not a disruption but a combination of more data and new skills exploiting these data.
  - 90% of the added value is DATA storing and cleaning, the boring business is more important that the funny business of machine learning development.
  - Only DATA matters, rest is technic and time, so PROTECT DATA.

### - Al's impact depends on investment process' systematic part.

- Al is already able to replace human in decision making process but how communicate on "shadow decision".
- Deep nets are amazing but they do not see like us and think like us... so transfer of client's confidence to PM or to AI is the key point...
- CPR AM (Quant boutique in Amundi Group) is able to customize "tailor made investment solutions" with its micro-BIG DATA (PMS) framework and its Multi-factor approach for both absolute and relative performance offers.





# AI AND BIG DATA: THEIR IMPACT ON EQUITY INVESTMENT OFFER FOR PENSION FUND

Appendix



Document à usage strictement professionnel au sens de la directive MIF.

# Summary

### What is BIG DATA ?

Storage, cleaning and exploitation of huge quantity of data

### What is Artificial Intelligence ?

 AI means a computer is able to take a decision to solve a problem without being explicitly programmed for that.

a) is an area of computer science that deals with giving machines the ability to seem like they have human intelligence.

b) is the simulation of human intelligence processes by machines, especially computer systems

c) the power of a machine to copy intelligent human behavior

d) the ability of a digital computer or computer-controlled robot to perform tasks commonly associated with intelligent beings

### What is Machine Learning ?

 (ML) programs identify relationships between datasets with the goal of using the learned relationships to make predictions on new, unseen data – without explicitly being programmed how to derive the relationships.

# Internet didn't kill books, Big Data won't kill PMs but will impact more and more their tools and profiles !!



# AI is the way from linear regression and neural network to machine learning

- Machine learning
- Relies on past data to make inferences about the future
- Uses a training data set to fit the parameters to the model
- Requires large amounts of data
- Sees the world in probabilities
- Updates views every time new data is added
- Machine learning algorithms optimize an objective function
- Machine learning algorithms are generally classified as « supervised » (handwriting recognition) or « unsupervised » (cluster analysis)



This early artificial neural network, at the Cornell Aeronautical Laboratory in Buffalo, New York, circa 1960, processed inputs from light sensors.



# The power of data and machine learning in asset management J Rodriguez-Alarcon

# **Equity Alpha Investment Pillars**

Discovering Investment opportunities through data-driven analysis



### A disciplined data-driven approach can uncover investment opportunities

Number of factors and weights are shown are as of June 30, 2017. There is no guarantee that these objectives will be met.



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